1	Strong survival selection on seasonal migration versus
2	residence induced by extreme climatic events
3	Paul Acker ^{1,2*} , Francis Daunt ³ , Sarah Wanless ³ , Sarah J. Burthe ³ , Mark A. Newell ³ , Michael
4	P. Harris ³ , Hannah Grist ^{1,4} , Jenny Sturgeon ¹ , Robert L. Swann ⁵ , Carrie Gunn ³ , Ana Payo-
5	Payo ¹ , and Jane M. Reid ^{1,2}
6	¹ School of Biological Sciences, University of Aberdeen, Aberdeen, UK
7	² Centre for Biodiversity Dynamics, Institutt for Biologi, NTNU, Trondheim, Norway
8	³ UK Centre for Ecology & Hydrology, Bush Estate, Midlothian, UK
9	⁴ Scottish Association for Marine Science, Scottish Marine Institute, Oban, UK
10	⁵ Highland Ringing Group, Tain, UK

11 * Corresponding author. E-mail address: paul.acker@ntnu.no or paul.acker@noos.fr

12 ABSTRACT

1. Elucidating the full eco-evolutionary consequences of climate change requires quantifying 13 the impact of extreme climatic events (ECEs) on selective landscapes of key phenotypic traits 14 that mediate responses to changing environments. Episodes of strong ECE-induced selection 15 could directly alter population composition, and potentially drive micro-evolution. However, 16 to date, few studies have quantified ECE-induced selection on key traits, meaning that 17 immediate and longer-term eco-evolutionary implications cannot yet be considered. 18 2. One widely-expressed trait that allows individuals to respond to changing seasonal 19 environments, and directly shapes spatio-seasonal population dynamics, is seasonal migration 20 versus residence. Many populations show considerable among-individual phenotypic 21 variation, resulting in 'partial migration'. However, variation in the magnitude of direct 22 survival selection on migration versus residence has not been rigorously quantified, and 23 empirical evidence of whether seasonal ECEs induce, intensify, weaken or reverse such 24 selection is lacking. 25 3. We designed full-annual-cycle multi-state capture-recapture models that allow estimation 26 of seasonal survival probabilities of migrants and residents from spatio-temporally 27 heterogeneous individual resightings. We fitted these models to nine years of geographically 28 extensive year-round resighting data from partially migratory European shags 29 (Phalacrocorax aristotelis). We thereby quantified seasonal and annual survival selection on 30 migration versus residence across benign and historically extreme non-breeding season 31 (winter) conditions, and tested whether selection differed between females and males. 32 4. We show that two of four observed ECEs, defined as severe winter storms causing overall 33 low survival, were associated with very strong seasonal survival selection against residence. 34 These episodes dwarfed the weak selection or neutrality evident otherwise, and hence caused 35 selection through overall annual survival. The ECE that caused highest overall mortality and 36

strongest selection also caused sex-biased mortality, but there was little overall evidence of
sex-biased selection on migration versus residence.

5. Our results imply that seasonal ECEs and associated mortality can substantially shape the landscape of survival selection on migration versus residence. Such ECE-induced phenotypic selection will directly alter migrant and resident frequencies, and thereby alter immediate spatio-seasonal population dynamics. Given underlying additive genetic variation, such ECEs could potentially cause micro-evolutionary changes in seasonal migration, and thereby cause complex eco-evolutionary population responses to changing seasonal environments.

45 KEY-WORDS

Bayesian capture-recapture, eco-evolutionary dynamics, extreme climatic events, fluctuating
selection, full annual cycle, partial migration, multi-state model, seasonal movement, sexbiased selection, Stan

49

INTRODUCTION

Major aims in contemporary biology are to quantify interacting ecological and evolutionary 50 processes that shape population responses to environmental change (Chevin, Lande, & Mace, 51 2010; Hoffmann & Sgrò 2011; Bellard, Bertelsmeier, Leadley, Thuiller, & Courchamp, 2012; 52 Moritz & Agudo, 2013). Among ongoing global changes, climate change is predicted to 53 54 cause increasing frequencies and intensities of extreme climatic events ("ECEs"; e.g. storms, droughts, floods) that drastically alter environmental quality (Easterling et al., 2000; Coumou 55 & Rahmstorf 2012; Ummenhofer & Meehl 2017). Such ECEs can clearly cause severe 56 mortality or reproductive failure, thereby directly reducing population sizes and threatening 57 population persistence (Brown & Bomberger Brown 1998; Parmesan et al., 2000; Welbergen, 58 Klose, Markus, & Eby, 2007; van de Pol et al., 2010; Niu et al., 2014; but see Hansen et al., 59

2019). However, beyond these primary demographic impacts, ECEs could also cause 60 episodes of strong direct phenotypic selection, defined as differential mortality or 61 reproduction with respect to key phenotypic traits that mediate responses to climate-induced 62 environmental variation (Grant & Grant 1995; Brown & Bomberger Brown 1998; Marrot, 63 Garant, & Charmantier, 2017). Given underlying additive genetic variance, such ECEs could 64 then drive rapid microevolution of key climate-sensitive traits, and hence exert long-lasting 65 effects on population ecology and dynamics (Grant et al., 2017). Quantifying the form, 66 magnitude and variability of ECE-induced selection on such traits is thus one central 67 component of understanding and forecasting eco-evolutionary consequences of climate 68 change. However, very few such studies currently exist (Bailey & van de Pol 2016; Marrot et 69 al., 2017; Maxwell et al., 2019). 70

One taxonomically widespread trait that allows many animals to overcome climatic and 71 72 environmental variation is seasonal migration (hereafter "migration"), defined as reversible individual movements between locations across seasons (Dingle 1996; Newton 2008). 73 Migration allows individuals to exploit spatially-restricted seasonal resource peaks while 74 avoiding seasonally hostile environments, thereby enhancing survival and/or reproduction 75 and directly causing spatio-seasonal population dynamics (e.g. Skov et al., 2013; Avgar, 76 Street, & Fryxell 2013; Zúñiga et al., 2017; Reid et al., 2018). Further, many populations are 77 "partially migratory", where some individuals remain resident in their breeding location year-78 round while other individuals are seasonal migrants (Lundberg 1988; Chapman, Brönmark, 79 Nilsson, & Hansson, 2011; Hsiung, Boyle, Cooper, & Chandler, 2018). Because partial 80 migration can cause sympatric-breeding individuals to be spatially segregated in non-81 breeding seasons, partially-migratory populations could potentially experience episodes of 82 extremely strong direct survival selection on migration versus residence caused by localised 83 non-breeding season ECEs (Reid et al., 2018). For example, residents could experience high 84

mortality during an ECE while migrants that moved to unaffected locations survive (or 85 conversely, migrants could be impacted). By definition, such strong survival selection would 86 cause an immediate shift in the current proportion of residents versus migrants within a 87 population, and hence in seasonal population distributions and dynamics. Further, given 88 underlying additive genetic variance, such events could cause micro-evolutionary change in 89 migration propensity (Pulido 2007, 2011). This could potentially generate a form of 90 'evolutionary rescue' (e.g. Gonzalez, Ronce, Ferriere, & Hochberg, 2013) of populations 91 facing increasing risk of localised seasonal ECEs, which would profoundly alter spatio-92 seasonal ecology (Reid et al., 2018). To understand the potential for such outcomes, we first 93 need to quantify the magnitude and form of ECE-induced selection. However, such selective 94 landscapes of seasonal migration versus residence have not been rigorously quantified in any 95 system (Reid et al., 2018). 96

In general, the dynamics of any trait will depend on the degree to which ECE-induced 97 selection intensifies or opposes selection occurring under more typical non-extreme 98 conditions, thereby generating strong directional or fluctuating selection overall (Bailey & 99 van de Pol 2016; Grant & Grant 2017). Such outcomes will also depend on any sex 100 difference in mean phenotype, and any associated sex-bias in the magnitude of ECE-induced 101 impacts and resulting sex-biased selection (Kruuk, Slate, & Wilson, 2008). Quantifying these 102 key effects for non-breeding season migration versus residence as the focal trait requires data 103 on survival of large numbers of migrants and residents of both sexes across diverse 104 105 environmental conditions. This requires recording geographical locations of sympatricbreeding and allopatric-nonbreeding individuals across seasons, at sufficiently fine temporal 106 resolution to pinpoint ECE effects. Further, data encompassing multiple ECEs are ideally 107 needed to assess within-system consistency and facilitate among-system comparisons (Bailey 108 & van de Pol 2016; Altwegg, Visser, Bailey, & Erni 2017). 109

Such quantification of seasonal survival selection is highly data-demanding and 110 technically challenging, and has rarely been achieved for any trait in any system. One 111 approach is to mark individuals with field-readable tags, and undertake year-round large-112 scale resightings. Such resightings are inevitably restricted and incomplete, to degrees that 113 vary in time and space. Individual phenotypic expression of migration versus residence and 114 associated survival, and hence survival selection, are therefore only partially observable. 115 However, the required parameters can be estimated using advanced capture-recapture 116 analyses that account for resigning failure and resulting uncertainty (Cam 2009). 117 Accordingly, we designed full-annual-cycle multi-state capture-recapture models that 118 allow estimation of survival probabilities of seasonal migrants and residents within and 119 across years, and hence allow estimation of survival selection on migration versus residence. 120 We fitted these models to nine years of year-round resighting data from partially migratory 121 122 European shags (*Phalacrocorax aristotelis*) experiencing non-extreme and historically extreme non-breeding season conditions. We *a priori* defined four ECEs that occurred during 123 the study period, each comprising a different extreme winter storm event that caused major 124 coastal and marine environment perturbations and widely observed mortality of birds and 125 other marine wildlife (see Methods, Appendix S1). We first tested whether these four defined 126 seasonal ECEs were associated with episodes of seasonal survival selection on migration 127 versus residence, and whether these episodes intensified or opposed seasonal selection 128 occurring under non-extreme conditions. We then tested whether the four ECEs were 129 130 associated with sex-biased mortality and/or sex-biased seasonal selection, and quantified the degree to which episodes of seasonal survival selection scaled up to cause selection at the 131 annual timescale. We thereby illustrate how ECEs can cause episodes of survival selection 132 that directly alter the sex-specific population proportions of migrants versus residents, and 133

discuss how such selection could potentially drive micro-evolutionary responses to changingseasonality.

136

157

MATERIALS AND METHODS

137 Study system and data collection

A population of European shags (hereafter "shags") breeding on Isle of May National Nature 138 Reserve (hereafter "IoM"), Scotland (56°11'N, 2°33'W), provides a valuable opportunity to 139 quantify survival selection on migration versus residence across diverse environmental 140 conditions, including ECEs. Shags are colonially-breeding seabirds which, since they have 141 partially-wettable plumage, must roost onshore every day to dry and thermoregulate 142 (Grémillet, Tuschy, & Kierspel, 1998; Harris & Swann 2002). Marked individuals can 143 therefore be visually resighted, and hence locations directly recorded, all year. The focal 144 population is partially migratory: some individuals remain around IoM all year, while other 145 individuals migrate up to ~500 km along east coasts of Scotland and northern England (Grist 146 147 et al., 2014; Fig. 1). Such migration distances and resulting spatial spread of individuals is typical of numerous partially migratory species, spanning fish, mammals and birds (e.g. 148 Chapman et al., 2011; Papastamatiou et al., 2013, Eggeman, Hebblewhite, Bohm, 149 Whittington, & Merrill, 2016; Zúñiga et al., 2017; Sawyer, Merkle, Middleton, Dwinnell, & 150 Monteith, 2018). Further, the focal population is known to experience episodes of high 151 mortality caused by ECEs involving onshore gales and heavy rain that impede foraging and 152 thermoregulation (Appendix S1; Frederiksen, Daunt, Harris, & Wanless, 2008). 153 To monitor individual life-histories, since $1997 \sim 80\%$ of chicks that survived to ~ 3 154 weeks post-hatch were captured at the nest (using a crook, or occasionally by hand) and 155 marked with a uniquely-coded colour ring (field readable at distances up to ~150m with a 156

telescope) alongside a uniquely-inscribed metal ring (Appendix S1). Adult breeders

(typically aged ≥3 years) alive prior to 1997, and subsequent unringed recruits, were similarly
caught and ringed as far as feasible. During ten breeding seasons (April–June 2009–2018),
ringed breeding adults were systematically identified at their nests (~95% of all breeders;
Appendix S1). Further observations at adjacent roost areas allowed identification of ringed
non-breeders and early-failed breeders, thereby ensuring very high breeding season adult
resighting probability (Barlow, Daunt, Wanless, & Reid, 2013; Grist et al., 2017). Individuals
were sexed based on vocalisations and/or genotype (Appendix S1).

During the intervening nine non-breeding seasons ("winters", September–February 2009-2018) we conducted resighting surveys around IoM and more widely to locate individuals and thereby distinguish residents and migrants. Key roost sites across eastern Scotland, identified during pilot fieldwork in 2008–2009, were surveyed every ~2 weeks (Fig. 1; Appendix S1). Additional known roost sites were surveyed less frequently, and opportunistic resightings from birdwatchers were actively solicited (Fig. 1).

The 2009–2018 study period encompassed diverse climatic conditions, from benign to 171 historically extreme. In particular, the eastern Scotland coastline experienced severe storms 172 in December 2012, February 2013, January 2014, and February-March 2018 (Appendix S1). 173 These four events involved different forms of unusually strong and/or protracted onshore 174 winds resulting in extremely rough sea states, coupled with intense precipitation or low 175 temperature (Appendix S1). We therefore expected these events to be biologically-relevant 176 (following Bailey & van de Pol 2016) to our study system by causing low over-winter shag 177 survival, as observed for similar storms in previous decades (Frederiksen et al., 2008) and 178 confirmed by our analyses (see Results). We thus defined these four events as ECEs (further 179 details in Appendix S1). Given the complex multidimensional nature and spatial structure of 180 underlying weather conditions (Appendix S1), we had no strong *a priori* prediction on the 181

strength, direction, consistency or sex-specificity of any resulting selection on migration

versus residence, including in relation to any selection arising under more typical conditions.

184 Model design

Quantifying seasonal survival selection on migration versus residence from ring-resighting 185 data requires unbiased estimation of survival probability conditional on winter location, given 186 that location is unknown for unobserved individuals. This can be achieved by jointly 187 modelling the processes of hidden individual state-transition (i.e. movement between 188 residency and migratory area(s), and survival conditional on location) and partial observation 189 of individual states (i.e. resighting efficiency, reflecting observer effort and conditions during 190 resighting surveys). Accordingly, we formulated a discrete-time multi-state capture-recapture 191 model (Lebreton & Pradel 2002) that represents full-annual-cycle dynamics of partial 192 migration and the overlaid observational design. We modelled multiple migrant areas to 193 account for spatial heterogeneity in resighting efficiency, therefore controlling for potential 194 biases in observed movements and hence in estimates of survival for residents and migrants. 195 We defined three types of observation event: 'resighted at the residency area' (i.e. IoM 196 area), 'resighted at a migratory area' (i.e. away from IoM, divided into multiple areas; Fig. 1) 197 and 'not resighted'. We defined three types of underlying individual state: 'resident', 198 'migrant in a given area' and 'dead'. For current analyses we considered five possible 199 200 migratory areas (Fig. 1): three regularly-monitored areas where winter resighting effort was typically high, one geographically-broad area representing all locations where resighting 201 effort was low but non-zero, and one "ghost area" where resighting probability was zero 202 (Schaub, Gimenez, Schmidt, & Pradel, 2004) representing unmonitored migrant locations 203 that presumably exist on remote coasts. Accordingly, we modelled five migrant states (i.e. 204 four observed migratory areas, plus the "ghost area" unobservable state) and four migrant 205 206 observation events (referring to each observable migrant state).



207

Figure 1. Locations of resightings of ringed adult shags that bred on IoM during 2009–2018. 208 Shaded zones outline four systematically surveyed areas, comprising the residency area (red, 209 IoM and nearby regularly visited day-roosts), and three main defined migratory areas (brown, 210 yellow, pink). In one case, data from two locations (brown, linked by a dashed line) were 211 pooled into a single area to provide sufficient sample sizes for current analyses. Orange 212 points denote locations of unstructured or opportunistic resightings pooled into one low-213 resighting-effort "area". Dark grey points indicate additional locations of resightings that 214 were not included in current analyses (e.g. from previous years, or of sub-adults), and are 215 shown to indicate possible locations of unobserved individuals. A small number of locations 216 further south are not shown. 217

We divided each year into five capture-resignting occasions, comprising the breeding season and four winter occasions (Fig 2a). We defined occasion time windows to capture fine-scale temporal variations in survival and movement probabilities (Appendix S1), and thereby isolate episodes of ECE-induced selection. The overall model structure therefore generates three timeframes: years (*y*, one breeding season to the next), occasions within years (*o*), and the full temporal sequence of occasions across years (*t*; Fig 2).

In each breeding season (occasion 1 within each year), new individuals enter the dataset 224 and all alive individuals are located in the residency area (i.e. the resident state; Fig. 2a). In 225 each winter occasion (occasions 2–5 within each year), alive individuals can be located in the 226 residency area or in a migratory area (i.e. the corresponding migrant state; Fig. 2a). 227 Individuals can move between residency and migratory areas between winter occasions 228 within a year (Fig. 2a). However, between each occasion 5 and subsequent occasion 1 229 individuals can only move to or remain in the residency area, and between each occasion 1 230 and subsequent occasion 2 individuals can only move from or remain in the residency area 231 (Fig. 2a). The movement process is parameterised as dependent on the state and occasion at 232 the start of each time step. Movements of current residents are described by the probabilities 233 of departing (ε), and of moving to a specific migrant area conditional on departure (δ ; Fig. 234 2b). Movements of current migrants are described by the probabilities of returning to the 235 residency area (ω), and of switching between migratory areas conditional on not returning (σ ; 236 Fig. 2b). Mortality occurs between occasions according to occasion-dependent and 237 migration-dependent (i.e. migrants vs. residents) survival probability (ϕ), and dead 238 individuals cannot be resighted (Fig. 2b). At each occasion, alive individuals can be resighted 239 240 where they are located or not resighted, according to occasion- and state-dependent resighting probability (p, which is zero in the "ghost area"; Fig. 2b). 241



242

Figure 2. Structure of the multi-state capture-recapture model. Panel (a) illustrates the full-243 annual-cycle of partial migration, indicating possible transitions of surviving individuals 244 between the 'resident' state (R) and 'migrant' states (M) between five consecutive defined 245 occasions within a year. Panel (b) illustrates the fate of residents (R), migrants in area i (M_i; 246 $i \in [1,5]$) and dead individuals (D) from time t to t+1. Time goes across occasions ('o') over 247 years ('y'), from t=1 ({o=1, y=1}: breeding season 2009) to t=46 ({o=1, y=10}: breeding 248 season 2018); e.g. time t=18 is $\{o=3, y=4\}$: October 2012. Arrows indicate possible paths in 249 the state-transition and observation steps, with corresponding probabilities as arrows' indices; 250 dashed arrows symbolise multifurcations. Parameters are elementary probabilities: ϕ_R and ϕ_M 251 for survival of residents and migrants at t, ε for departure (from the residency area), δ_i for 252 moving to migratory area *j* (*j* \in [1,5]) conditional on departure ($\Sigma(\delta_i)=1$), ω_i for return to 253 residency (from area i), σ_{ik} for switching from migratory area i to migratory area k ($k \in [1,5]$) 254 conditional on not returning (*i* can be equal to k, and $\Sigma(\sigma_{ik})=1$; if σ is constant across space, 255 then for $k \neq i$: $\sigma_{ik} = \frac{1 - \sigma_{ii}}{4}$, p_R and p_{M_j} for resighting of residents and migrants (in area j) at t+1256 $(p_i=0 \text{ if } j \text{ is the "ghost area"})$. These parameters can be occasion- and/or time-dependent (i.e. 257 occasion×year-dependent). Between $\{o=5,y\}$ and $\{o=1,y+1\}$, residents remain in the 258

residency and migrants return there to breed (i.e. $\varepsilon=0$, $\omega_i=1$, and δ_j , σ_{ik} are undefined), and then (o=1) all alive individuals are residents (i.e. p_i and subsequent ϕ_M , ω_i , σ_{ik} are undefined).

To fit this model, we compiled individual capture-resighting histories (i.e. sequences of 261 observation events) for all adult shags known to have bred on IoM during 2009–2017, 262 starting from their first observed breeding attempt during that period. We utilised 43214 263 sightings of 2274 eligible individual adults (including 2147 individuals of known sex) and 264 collapsed multiple resightings of focal individuals in each occasion into a unique event 265 (Appendix S1). Since previous studies and recent resightings show virtually no breeding 266 dispersal from IoM (Aebischer 1995; Barlow et al., 2013; Appendix S1), estimated survival 267 probabilities primarily represent true survival with little or no confounding permanent 268 emigration. 269

270 Model analyses

We fitted and analysed our model with the current primary objective of estimating occasion-271 specific survival probabilities of residents and migrants in each year, and hence quantifying 272 ECE-induced survival selection on migration versus residence across time. We built and 273 analysed the model using Stan, a probabilistic programming language for Bayesian inference 274 using Hamiltonian Monte Carlo, via package rstan (Carpenter et al., 2017) in R (R core team 275 2019). We formulated a general code, thereby providing tools for capture-recapture analysis 276 of other partially-migratory populations (Appendix S2). We used objective ("uninformative") 277 uniform priors for all parameters (Appendix S2). Details of posterior sampling procedures 278 and diagnostics are in Appendix S5. 279

We first analysed a main model that included interacting migration-, occasion- and yeardependence (i.e. migration×time-dependence) in survival probability ϕ (Table 1). This model also included interacting area-, occasion- and year-dependence (i.e. state×time-dependence)

in movement probabilities ε , δ and ω , and resighting probability p (Fig. 2b, Table 1). Because 283 switching between migratory areas between winter occasions was rarely observed (Appendix 284 S1), the corresponding movement probability σ was set constant across space and time (Fig. 285 2b, Table 1). Before drawing inference from the shag data, we fitted this model to analogous 286 simulated data to evaluate parameter identifiability and likely capability of our model and 287 dataset to infer survival probabilities of residents versus migrants. These analyses suggested 288 that all focal parameters were effectively identifiable and estimable with no obvious major 289 bias or computational problems, and that all key survival probabilities should be estimable 290 with reasonably high precision (including for the last time step; Appendix S3). We then fitted 291 this model to the shag data, comprising capture-resighting histories of all 2274 individuals. 292 We evaluated model fit through posterior predictive checks (Gelman et al., 1996) devised to 293 assess discrepancies between capture-resighting data and their posterior predictions 294 295 (Appendix S4). These checks indicated good overall model fit regarding current objectives (Appendix S4). 296

We then tested for sex-dependence of key parameters, and hence for sex-biased 297 migration, survival, and survival selection on migration versus residence. We extended the 298 main model to include interacting sex-dependent variation in survival (ϕ), departure (ε), 299 return (ω) and resighting (p) probabilities, i.e. sex×migration×time-dependence for ϕ and 300 sex×state×time-dependence for ε , ω , and p (Table 1). We did not include sex-dependence in δ 301 or σ (Table 1), because previous analyses revealed no major sex biases in migrants' 302 303 destinations (Grist et al., 2014; Appendix S1). This model was fitted to capture-resighting histories of 2147 known-sex adults, and posterior predictive checks again indicated good 304 overall fit. 305

Model	Structure of model parameters					
	Survival	Movement				Resighting
		From the residency area		From a migratory area		-
		Departing	Moving to migratory area	Returning	Switching migratory area	_
	(ϕ)	(ε)	(δ)	(ω)	(σ)	<i>(p)</i>
Main sex-independent model	M×O×Y	O×Y	A _{to} ×O×Y	A _{from} ×O×Y		A×O×Y
Sex-dependent model	M×O×Y×S	$O{\times}Y{\times}S$	$A_{to} \times O \times Y$	$A_{\textit{from}} \times O \times Y \times S$		A×O×Y×S

Table 1. Summary of multi-state capture-recapture model parameterisations for currentanalyses.

³⁰⁸ 'M' indicates migration-dependence (i.e. migrant wherever located vs. resident), 'O' indicates ³⁰⁹ occasion-dependence, 'Y' indicates year-dependence, 'A' indicates area-dependence with ³¹⁰ index '*from*' or '*to*' when it refers respectively to the area *from* or *to* which the movement ³¹¹ occurs (if relevant), 'S' indicates sex-dependence, '×' indicates interactions, and '.' indicates ³¹² a single constant parameter.

In principle, non-causal relationships between survival and migration versus residence 313 could arise if individuals of different ages have different migration propensities and also 314 (independently) different survival probabilities. In our study population, there is previous 315 evidence of actuarial senescence, with adult survival declining from age 14 years (Harris, 316 Buckland, Russell, & Wanless, 1994). However, there were too few old individuals in our 317 current dataset to explain substantial overall variation in survival, or for age-dependent 318 movement and survival parameters to be estimated with useful precision (Appendix S1). 319 Inspection of observed year-to-year changes in age distributions (Appendix S1), and 320 goodness of fit assessments (Appendix S3), provided no indications that age effects could 321 have substantially affected current inferences. 322

From both models (Table 1), we derived posterior distributions for quantities of
biological interest that are not elementary parameters, thereby synthesising compound effects

while retaining associated uncertainties. Key quantities are the probabilities of annual 325 survival, and of being a migrant (yielding the "migratory fraction"). Annual survival 326 probability given different possible paths through the partial-migration cycle (Fig. 2a) was 327 computed as the product of corresponding survival probabilities across successive occasions 328 (Appendix S2). For purposes of concise illustration, we mainly focus on two stereotypical 329 paths that were most likely to be realised (Appendix S5): full-winter migration (i.e. leaving 330 residency area by September and returning next breeding season: phenotypic sequence 'R-M-331 M-M-M' through the annual cycle, Fig. 2a) and full-winter residence (i.e. phenotypic 332 sequence 'R-R-R-R', Fig. 2a). Details of estimates for other paths are in Appendix S5. 333 These derived annual survival probabilities utilise cross-sectional estimates of seasonal 334 survival conditional on migration. Consequently, they do not directly quantify fates of 335 individuals undertaking particular full-winter strategies or consider any potential carry-over 336 effects among occasions. The migratory fraction in each occasion was computed as the 337 product of appropriate seasonal survival and movement probabilities (Appendix S2). 338 To explicitly test for differences in survival probability between residents and migrants, 339 or between males and females, we computed posterior distributions of such differences (" Δ "). 340 We assessed support for the sign of each difference through the posterior probability that it 341 was positive (" $Pr(\Delta > 0)$ "). $Pr(\Delta > 0)$ values close to 1 or 0 provide substantial support for 342 positive or negative differences respectively, while values close to 0.5 indicate similar 343 support for both (i.e. no clear evidence for either). We summarised parameter estimates and 344 345 derived quantities as posterior means with 95% credible intervals ('95%CRI'; further details in Appendix S5). 346

347

RESULTS

348	Survival and movement probabilities
349	The main model (Table 1) revealed the decade-long pattern of temporal variation in seasonal
350	survival probability (Fig. 3). There were four episodes of notably low adult survival,
351	following occasion 4 (mid-winter) in 2012-13, and occasion 5 (late-winter) in 2012-13, 2013
352	14 and 2017-18. These episodes coincide with the four a priori defined ECEs (December
353	2012, February 2013, January 2014, and February-March 2018).
354	Further, these ECEs were associated with two episodes of strong selection against
355	residents, in late-winter 2012-13 and 2017-18 (Fig. 3). Here, survival probabilities were ~ 0.3
356	higher for migrants than residents (posterior mean [95%CRI] differences, Δ : 0.31 [0.20,0.41]
357	in 2013 and 0.26 [0.17,0.33] in 2018, $Pr(\Delta > 0)$: 1.00 for both). In contrast, there was no clear
358	evidence for higher or lower survival probability in migrants than residents in mid-winter
359	2012-13 (Δ: 0.02 [-0.11,0.16], Pr(Δ>0): 0.65) or late-winter 2013-14 (Δ: -0.03 [-0.11,0.04],
360	Pr(∆>0): 0.20).
361	Across all other time steps (that contained no a priori defined ECEs) survival
362	probabilities were very high (Fig. 3). Differences between migrants and residents were
363	correspondingly small (posterior means of Δ ranged -0.05–0.06), with no consistent

directionality (grand mean 0.00; Appendix S5) indicating overall neutrality. Nonetheless,

there was evidence for higher survival of migrants than residents following occasion 4 (mid-

winter) 2015-16 (Δ : 0.05 [0.01,0.09], Pr(Δ >0): 0.99) and following occasion 3 (October)

367 2016-17 (Δ :0.05 [-0.01,0.11], Pr(Δ >0): 0.94), and for lower survival of migrants than

residents following occasion 2 (September) 2017-18 (Δ :-0.05 [-0.12,0.00], Pr(Δ >0): 0.04).

369 The magnitudes of these differences (~ 0.05 in adult survival) are not biologically trivial,

providing some evidence of fluctuations in selection in non-ECE years. However, any such

371 selection is dwarfed by the two episodes of notably strong selection against residence

373





Derived estimates of annual survival probabilities showed that the ECE-induced
selection events in late winter 2012-13 and 2017-18 (Fig. 3) translated into strong selection at





Figure 4. Annual survival probabilities of adult shags that bred on IoM, derived for full winter residence (red squares) and full-winter migration (orange circles). Point estimates are
 posterior means, inner and outer line segments indicate 50% and 95% credible intervals. See
 Appendix S5 for other possible paths through the annual cycle.

394

More generally, in 2012-13 and 2017-18, there was clear evidence for differences in annual survival probabilities between the set of paths through the annual cycle (Fig. 2a) that ended as migrant in late winter versus the set of paths that ended as resident ($\Delta \approx 0.2$; Appendix S5). There was no clear evidence for differences in annual survival probability among the possible paths within each of these two sets (Appendix S5). This implies that latewinter ECE-induced selection against residents was the main driver of annual survival
selection in these two years. In all other years, there was typically no strong evidence for
differences in annual survival probability among the different possible paths through the
annual cycle (Appendix S5).

Movement probabilities varied strongly among occasions and years (Appendix S5). 408 However, the derived migratory fraction for the winter occasions was typically $\sim 0.3-0.6$ 409 (posterior means ranged 0.21–0.76, grand mean 0.44; Appendix S5). This shows that, at any 410 time in winter, the population contained substantial proportions of both residents and 411 migrants. Specifically, immediately preceding the selective ECEs (i.e. in occasion 5 2012-13 412 and 2017-18), the estimated migratory fractions were 0.54 [0.44,0.66] and 0.26 [0.20,0.34] 413 respectively. The ECE-induced selection events would therefore directly translate into 414 marked reductions in the number and proportion of residents (see *Discussion*). 415 The model also confirmed that breeding season resighting probability was consistently 416 very high (posterior means ranged 0.90–0.98, grand mean 0.95; Appendix S5). Winter 417 resighting probability varied substantially, reflecting spatio-temporal heterogeneity in 418 observation effort and efficiency (Appendix S5). However, it was usually reasonable and 419 often high in the residency area (posterior means ranged 0.02–0.89, grand mean 0.47), 420 typically high in regularly surveyed migratory areas (posterior means ranged 0.13–0.94, 421 grand mean 0.66), and typically lower in the pooled migratory area with opportunistic 422 423 resightings (posterior means ranged 0.03–0.74, grand mean 0.34). This high year-round resighting success facilitates relatively precise estimation of survival and movement 424 probabilities. 425

426 Sex-specific probabilities

427 The sex-dependent model (Table 1) provided clear evidence of major sex-dependence in

survival probability during the ECE that most severely reduced overall survival (late-winter 428 2012-13). Survival probability was much lower in females than males in both migrants (Δ : -429 0.28 [-0.41,-0.14], Pr($\Delta > 0$): 0.00) and residents (Δ : -0.14 [-0.27,-0.01], Pr($\Delta > 0$): 0.01; Fig. 430 5a). Further, there was some evidence for a sex-specific difference in survival between 431 migrants and residents, and hence for sex-biased selection. Specifically, there was some 432 evidence for a greater difference in survival probability between migrants and residents in 433 males than females (Δ : 0.13 [-0.05,0.32], Pr(Δ >0): 0.92), implying stronger selection against 434 residence in males. 435

Across other occasions, there was no clear evidence for substantial sex-dependence in seasonal survival, or hence of sex-biased selection, although there were some small differences (posterior means of Δ ranged -0.05–0.1 in migrants and -0.14–0.07 in residents, grand means 0.00 and -0.01 respectively; Appendix S5). In addition, there was no evidence of consistent sex differences in movement probabilities or the resulting migratory fraction, except for a slightly larger proportion of September migrants in males (indicating earlier migration in males; Appendix S5).

Derived estimates of sex-specific annual survival probabilities showed a major sex 443 difference associated with the ECEs in 2012-13 (Fig. 5b; Appendix S5). The differences in 444 survival between females and males through this year were -0.19 [-0.30,-0.08] for full-winter 445 migrants and -0.13 [-0.23,-0.04] for full-winter residents, ($Pr(\Delta > 0)$: 0.00 for both). However, 446 there was no evidence of sex-biased selection at the annual level (difference in migrant 447 versus resident survival for males versus females: 0.06 [-0.10,0.22], $Pr(\Delta > 0)$: 0.76). In 448 addition, slight sex-biases in seasonal survival during 2013-2014 generated lower annual 449 survival probabilities in females (Fig. 5). This was strongly supported for both full-winter 450 migrants (Δ : -0.10 [-0.20,0.01], Pr(Δ >0): 0.03) and full-winter residents (-0.14 [-0.27,-0.02], 451 $Pr(\Delta > 0)$: 0.01), but again there was no clear evidence of sex-biased selection (Δ : -0.05 [-452

453 0.23, 0.14], Pr($\Delta > 0$): 0.31). Otherwise, sex differences in annual survival probability were 454 smaller, with no clear directionality or consistent occurrence in any annual partial-migration 455 path, and no clear evidence of sex-biased selection (Fig. 5; Appendix S5).



Figure 5. Migration- and sex-dependent survival probabilities of adult shags that bred on
IoM. Panel (a) shows seasonal survival probabilities in the three years containing *a priori*defined ECEs (see Appendix S5 for other years). Panel (b) shows derived annual survival

probabilities in all years for full-winter migration and full-winter residence. Point estimates
are posterior means (residents: red, migrants: orange; females: down-triangles, males: uptriangles), inner and outer line segments indicate 50% and 95% credible intervals. On panel
(a), the top row indicates initial occasion of the time step.

464

DISCUSSION

Understanding and predicting eco-evolutionary dynamics, including responses to increasing 465 frequencies and/or magnitudes of ECEs caused by climate change, requires quantifying 466 selective landscapes for key traits that mediate population responses to changing 467 environments. Individual expression of migration versus residence is one such trait, that 468 directly shapes spatio-seasonal population dynamics. However, the forms and magnitudes of 469 phenotypic selection on migration versus residence occurring during extreme versus non-470 extreme climatic conditions have not previously been rigorously quantified. Our full-annual-471 cycle capture-recapture models applied to extensive resighting data from shags exposed to 472 473 severe winter storms show that *a priori* defined ECEs that caused high mortality can also induce episodes of very strong selection against residence, dwarfing the weaker selection or 474 neutrality otherwise observed. 475

Estimates of phenotypic selection on binary phenotypes are difficult to standardise and 476 quantitatively compare with selection gradients for continuous traits (Kingsolver et al., 2001; 477 Hereford, Hansen, & Houle, 2004). However, the observed differences between migrants and 478 residents of ~ 0.3 in adult seasonal survival probability, and ~ 0.2 in annual survival 479 probability, undoubtedly represent very strong selection. Further, fitness of relatively long-480 481 lived iteroparous species with low annual fecundity and delayed recruitment, such as shags, is highly sensitive to variation in adult survival (Sæther & Bakke 2000), which is often 482 strongly canalised (Gaillard & Yoccoz 2003; Péron et al., 2016). Our study therefore implies 483

that ECEs can induce episodes of selection that are likely to dominate the temporal selective
landscape of migration versus residence.

Previous studies on diverse systems have shown that ECEs can cause severe mortality 486 (Welbergen et al., 2007; Moreno & Møller 2011; Bailey & van de Pol 2016). Indeed, ECEs 487 are often defined by such biological impacts (Bailey & van de Pol 2016). However, few 488 studies have explicitly tested whether ECEs cause selection on key phenotypic traits. Seminal 489 studies reported strong ECE-induced selection on morphology (body size traits: O'Donald 490 1972; Jones 1987; Brown & Bomberger Brown 1998; beak size and shape: Grant & Grant 491 1995) or phenology (entering diapause: Hairston & Walton 1986; arrival on breeding 492 grounds: Brown & Bomberger Brown 2000; egg-laying: Marrot et al., 2017), or against 493 inbred individuals (Keller, Arcese, Smith, Hochachka, & Stearns, 1994). By demonstrating 494 strong selection for seasonal migration associated with a priori defined ECEs, our results 495 496 highlight one route by which ECEs could directly alter spatio-seasonal population dynamics and distributions. 497

Surprisingly few previous studies have tested for differential survival of migrants versus 498 residents, or hence quantified survival selection, under any conditions and in any taxa (Reid 499 et al., 2018; Buchan, Gilroy, Catry & Franco, 2019). Recent studies demonstrated higher 500 survival in migrants than residents in blackbirds (Turdus merula; Zúñiga et al., 2017) and 501 roach (Rutilus rutilus; Skov et al., 2013), but this was not evident in American dippers 502 (Cinclus mexicanus; Green, Whitehorne, Middleton, & Morrissey, 2015), and residents had 503 higher survival than migrants in elk (Cervus canadensis; Hebblewhite and Merrill 2011) and 504 red-spotted newts (Notophtalmus viridescens; Grayson, Bailey, & Wilbur, 2011). However, 505 these studies did not quantify temporal variation in phenotype-dependent survival within or 506 among years, or consider effects of ECEs. Sanz-Aguilar, Béchet, Germain, Johnson, and 507 Pradel (2012) showed a >0.3 decrease in annual survival of adult flamingos (Phoenicopterus 508

roseus) wintering in France during a freezing winter compared with non-extreme winters or 509 other areas. Their results imply strong ECE-induced selection against residence, but they 510 estimated winter-to-winter survival and did not explicitly distinguish residents versus 511 migrants. Consequently, our study unites current interest in seasonal movement and 512 biological impacts of ECEs (van de Pol, Jenouvrier, Cornelissen, & Visser, 2017; Reid et al., 513 2018), showing that seasonal ECEs can be prominent in the selective landscape of migration. 514 Moreover, by pinpointing the impacts of ECEs at a fine temporal scale, our results suggest a 515 key role of migration timings in shaping ECE-induced differences in annual survival 516 probability. Discrete seasonal ECEs therefore have the potential to generate strong selection 517 on circannual migratory tactic, defined as the sequential path of location through the annual 518 cycle (Fig. 2a). 519

In the focal shag population, post-breeding migration is typically northerly (Fig. 1; Grist 520 et al., 2014, 2017). The indented destination coastline facing north can provide shelter from 521 (south-)easterly gales that induce rough seas, whereas the IoM provides little protection. Such 522 conditions, especially combined with intense precipitation or low temperature, impede 523 foraging and thermoregulation (Daunt, Afanasyev, Silk, & Wanless, 2006; Daunt et al., 2014; 524 Frederiksen et al., 2008; Appendix S1). Phenotypic variation in migration versus residence, 525 and hence in winter location, can thereby affect survival, constituting direct selection. ECE-526 induced selection would not occur when ECE characteristics are such that migrant 527 destinations do not provide sufficient shelter, likely explaining why two seasonal ECEs 528 caused notable mortality but no clear selection (Fig. 3, Appendix S1). Such geographical 529 effects also imply that survival probabilities could differ between migrants that move to 530 different destinations, yielding more complex overall selection on migration tactic. Such 531 effects could in future be explicitly estimated using analyses designed to identify and 532 quantify appropriate environmental effects acting on survival at relevant spatio-temporal 533

scales (Appendix S1). However, this is likely to be highly challenging in the IoM shag
system, due to the complex and divergent climatic attributes of ECEs (Appendix S1), and
because winter locations of some focal shags are unknown (represented by the "ghost area"
in our models).

In general, eco-evolutionary consequences of ECEs will further depend on magnitudes of 538 sex-biased mortality and selection, but such effects have seldom been quantified for any trait 539 in any system (Frederiksen et al., 2008; Moreno & Møller 2011; Bailey & van de Pol 2016; 540 van de Pol et al., 2017). Our analyses show that adult female shags had substantially lower 541 survival probabilities than males during the most severe ECE in 2012-13. This may reflect 542 their smaller size and lower foraging efficiency in stormy conditions (e.g. Lewis, Phillips, 543 Burthe, Wanless, & Daunt, 2015). However, the strong selection on migration versus 544 residence induced by two ECEs affected both sexes. There was some evidence that selection 545 against residence during the 2012-13 ECE was stronger in males, despite higher overall 546 mortality in females. However, mortality occurring earlier during the 2012-13 winter meant 547 that selection was not sex-biased at the annual level. This concurs with the absence of 548 evidence for consistent sex biases in movement probabilities, and hence for sexual 549 dimorphism in migration, in our system. Nevertheless, substantial sex-biased mortality such 550 as we observed during one ECE would directly alter the adult sex-ratio. This could have 551 multiple consequences in general, potentially including altering mating systems and forms of 552 sexual selection (Widemo & Sæther 1999; Székely, Weissing, & Komdeur, 2014), and 553 554 further decreasing effective population sizes (Boyce 1992). Such effects could further shape short-term and longer-term eco-evolutionary responses to ECEs (Székely et al., 2014; 555 Haridas, Eager, Rebarber, & Tenhumberg, 2014). 556

557 Implications and prospects

558 Episodes of strong ECE-induced survival selection on migration versus residence, such as we

observed, have potential to affect eco-evolutionary dynamics and resulting spatio-seasonal 559 population dynamics over multiple timescales. By definition, such selection will immediately 560 change the phenotypic distribution (i.e. population proportion of residents versus migrants), 561 and hence change the magnitude of within-year population movement. Based on estimated 562 survival probabilities of migrants and residents through the two selective ECEs (Fig. 1) and 563 the immediately preceding migratory fractions, posterior estimates for the immediate 564 decreases in the proportion of residents are -0.12 [-0.04,-0.19] in 2013 and -0.07 [-0.04,-0.11] 565 in 2018. This shows that strong selection combined with intermediate initial frequencies of 566 migrants and residents generated appreciable short-term phenotypic shifts. 567

The longer-term consequences of such ECEs will depend on the degrees to which direct 568 selection on migration versus residence (i.e. non-breeding season location) arising through 569 adult survival concurs with selection arising through other fitness components (specifically, 570 sub-adult survival, and indirectly through subsequent recruitment and breeding success), and 571 to which net phenotypic shifts propagate across years and generations. Propagation will be 572 determined by combinations of within-individual plasticity and additive genetic variance, and 573 resulting heritability, in migration versus residence (e.g. Charlesworth 1994; Coulson, 574 Tuljapurkar, & Childs, 2010). Our system provides valuable future opportunities to quantify 575 these components, especially with further years of data following the 2018 ECE, although 576 this will require further major technically-challenging analyses. 577

We previously showed that resident shags had higher breeding success than focal sets of migrants following the 2009–2012 winters (Grist et al., 2017). However, these winters were benign with uniformly high survival (Fig. 3), and potential carry-over effects of ECEs on subsequent differential breeding success of residents and migrants remain to be quantified. We also previously showed that locations of adult shags were highly repeatable within and among winters during 2009–2012 (Grist et al., 2014). Across the full winter, repeatabilities

of individual resighting distances were 0.72 within winters and 0.59 among winters, 584 increasing to 0.95 and 0.79 respectively across restricted mid-winter periods (Grist et al. 585 2014). These estimates suggest strong canalisation of individual migratory phenotype (see 586 also Appendix S4), allowing for substantial heritability. However, some adult shags do 587 switch between residence and migration within and among winters (Grist et al., 2014), as 588 observed in other partially migratory systems (e.g. brown trout, Salmo trutta: Wysujack, 589 Greenberg, Bergman, & Olsson, 2009; skylark, Alauda arvensis: Hegemann, Marra, & 590 Tieleman, 2015; elk: Eggeman et al., 2016). Future analyses can test whether individuals 591 surviving ECEs were more likely to subsequently switch between migration and residence. 592 Depending on the degree and form of density- and frequency-dependence in phenotypic 593 expression of migration versus residence (Grayson & Wilburn 2009; Mysterud et al., 2011), 594 such plastic responses could either 'trap' or 'rescue' populations facing increased risk of 595 596 ECEs that induce substantial mortality and strong phenotypic selection. Alternatively or additionally, depending on the magnitude of additive genetic variance, such selection could 597 potentially drive rapid micro-evolutionary change and resulting 'evolutionary rescue' (Grant 598 et al. 2017). Fully understanding and predicting such eco-evolutionary responses to ECEs 599 will now require studies that can explicitly quantify and integrate all components of selection, 600 genetic variation and plasticity that underlie the occurrence of major phenotypic responses to 601 changing seasonality in key traits such as migration versus residence. 602

603 ACKNOWLEDGEMENTS

We thank everyone from the UK Centre for Ecology & Hydrology (UKCEH) and the University of Aberdeen (UoA) who contributed to data collection, and Scottish Natural Heritage for access to the Isle of May National Nature Reserve. We thank the Scottish Ornithologists' Club (SOC) for their support, and all volunteer observers, particularly

- 608 Raymond Duncan and Moray Souter. This work was funded by the Natural Environment
- Research Council (NERC; award NE/R000859/1 and award NE/R016429/1 as part of the
- 610 UK-SCaPE programme delivering National Capability), the Royal Society, the Marine
- Alliance for Science and Technology for Scotland (MASTS), SOC, and UoA.

612 AUTHORS' CONTRIBUTIONS

- JMR and FD conceived the overall study; FD, SW, SJB, MAN, MPH, HG, JS, RLS, CG and
- JMR collected the data; PA designed the modelling methodology, coded the models,
- analysed the data and drafted the manuscript, assisted by JMR. FD, SJB, and APP
- 616 contributed to conceptual development and manuscript editing. All authors gave final
- 617 approval for publication.

618 DATA AVAILABILITY STATEMENT

- Data available from the Dryad Digital Repository: <u>https://doi.org/10.5061/dryad.c2fqz616r</u>
- 620 (Acker et al., 2020).

621 **REFERENCES**

- Acker, P., Daunt, F., Wanless, S., Burthe, S., Newell, M. A., Harris, M. P., ..., Reid, J. M.
- 623 (2020) Data from: Strong survival selection on seasonal migration versus residence
- 624 induced by extreme climatic events. Dryad Digital Repository,
- 625 <u>https://doi.org/10.5061/dryad.c2fqz616r</u>
- Aebischer, N. J. (1995). Philopatry and colony fidelity of Shags *Phalacrocorax aristotelis* on
- 627 the east coast of Britain. Ibis, 137(1), 11–18. <u>https://doi.org/10.1111/j.1474-</u>
- 628 <u>919X.1995.tb03214.x</u>
- Altwegg, R., Visser, V., Bailey, L. D., & Erni, B. (2017). Learning from single extreme
- events. Philosophical Transactions of the Royal Society, B 372(1723), 20160141.

631 <u>https://doi.org/10.1098/rstb.2016.0141</u>

- Avgar, T., Street, G., & Fryxell, J. M. (2014). On the adaptive benefits of mammal migration.
- Canadian Journal of Zoology, 92(6), 481–490. <u>https://doi.org/10.1139/cjz-2013-0076</u>
- Bailey, L. D., & van de Pol, M. (2016). Tackling extremes: challenges for ecological and
- evolutionary research on extreme climatic events. Journal of Animal Ecology, 85(1), 85–
- 636 96. <u>https://doi.org/10.1111/1365-2656.12451</u>
- Barlow, E. J., Daunt, F., Wanless, S., & Reid, J. M. (2013). Estimating dispersal distributions
- at multiple scales: within-colony and among-colony dispersal rates, distances and
- directions in European Shags *Phalacrocorax aristotelis*. Ibis, 155(4), 762–778.
- 640 <u>https://doi.org/10.1111/ibi.12060</u>
- 641 Bellard, C., Bertelsmeier, C., Leadley, P., Thuiller, W., & Courchamp, F. (2012). Impacts of
- climate change on the future of biodiversity. Ecology Letters, 15(4), 365–377.
- 643 <u>https://doi.org/10.1111/j.1461-0248.2011.01736.x</u>
- Boyce, M. S. (1992). Population viability analysis. Annual Review of Ecology, Evolution, and
- 645 Systematics, 23(1), 481–506. <u>https://doi.org/10.1146/annurev.ecolsys.23.1.481</u>
- Brown, C. R., & Bomberger Brown, M. (1998). Intense natural selection on body size and
- 647 wing and tail asymmetry in cliff swallows during severe weather. Evolution, 52(1), 1461–
- 648 1475. <u>https://doi.org/10.1111/j.1558-5646.1998.tb02027.x</u>
- Brown, C. R., and Bomberger Brown, M. (2000). Weather-mediated natural selection on
- arrival time in cliff swallows (*Petrochelidon pyrrhonota*). Behavioral Ecology and
- 651 Sociobiology, 47(5), 339–345. <u>https://doi.org/10.1007/s002650050674</u>
- Buchan C., Gilroy J. J., Catry I., and Franco A. M. A. (2019). Fitness consequences of
- different migratory strategies in partially migratory populations: A multi-taxa meta-
- analysis. Journal of Animal Ecology, 89(3), 678–690. <u>https://doi.org/10.1111/1365-</u>
- 655 <u>2656.13155</u>

- 656 Cam, E. (2009). Contribution of capture-mark-recapture modeling to studies of evolution by
- natural selection. In: D. L. Thomson, E. G. Cooch, & M. J. Conroy, (Eds.), *Modeling*
- 658 Demographic Processes in Marked Populations. Environmental and Ecological Statistics,
- 659 *vol 3.* (pp. 83–129). New York, NY: Springer. Https://doi.org/10.1007/978-0-387-78151-
- 660 <u>8_5</u>
- 661 Carpenter, B., Gelman, A., Hoffman, M. D., Lee, D., Goodrich, B., Betancourt, M., ...
- 662 Riddell, A. (2017). Stan: A probabilistic programming language. Journal of Statistical

663 Software, 76(1). <u>https://doi.org/10.18637/jss.v076.i01</u>

- 664 Chapman, B. B., Brönmark, C., Nilsson, J.-Å., & Hansson, L.-A. (2011). The ecology and
- evolution of partial migration. Oikos, 120(12), 1764–1775. <u>https://doi.org/10.1111/j.1600-</u>
 0706.2011.20131.x
- 667 Charlesworth, B. (1994). Evolution in age-structured populations. Cambridge, UK:
- 668 Cambridge University Press. <u>https://doi.org/https://doi.org/10.1017/CBO9780511525711</u>
- 669 Chevin, L.-M., Lande, R., & Mace, G. M. (2010). Adaptation, plasticity, and extinction in a
- changing environment: towards a predictive theory. PLOS Biology, 8(4), e1000357.
- 671 <u>https://doi.org/10.1371/journal.pbio.1000357</u>
- 672 Coulson, T., Tuljapurkar, S., & Childs, D. Z. (2010). Using evolutionary demography to link
- life history theory, quantitative genetics and population ecology. Journal of Animal
- Ecology, 79(6), 1226–1240. <u>https://doi.org/10.1111/j.1365-2656.2010.01734.x</u>
- 675 Coumou, D., & Rahmstorf, S. (2012). A decade of weather extremes. Nature Climate
- 676 Change, 2(7), 491–496. <u>https://doi.org/10.1038/nclimate1452</u>
- Daunt, F., Afanasyev, V. J., Silk, R. D., & Wanless, S. (2006). Extrinsic and intrinsic
- determinants of winter foraging and breeding phenology in a temperate seabird.
- 679 Behavioral Ecology and Sociobiology, 59(3), 381–388. <u>https://doi.org/10.1007/s00265-</u>
- 680 005-0061-4

- Daunt, F., Reed, T. E., Newell, M., Burthe, S., Phillips, R. A., Lewis, S., & Wanless, S.
- 682 (2014). Longitudinal bio-logging reveals interplay between extrinsic and intrinsic carry-
- over effects in a long-lived vertebrate. Ecology, 95(8), 2077–2083.
- 684 <u>https://doi.org/10.1890/13-1797.1</u>
- Dingle, H. (2014). Migration: the biology of life on the move. Second edition. Oxford, UK:
- 686 Oxford University Press. <u>https://doi.org/10.1093/acprof:oso/9780199640386.001.0001</u>
- Easterling, D. R., Meehl, G. A., Parmesan, C., Changnon, S. A., Karl, T. R., & Mearns, L. O.
- 688 (2000). Climate extremes: Observations, modeling, and impacts. Science, 289(5487),

689 2068–2074. <u>https://doi.org/10.1126/science.289.5487.2068</u>

- Eggeman, S. L., Hebblewhite, M., Bohm, H., Whittington, J., & Merrill, E. H. (2016).
- Behavioural flexibility in migratory behaviour in a long-lived large herbivore. Journal of
- 692 Animal Ecology, 85(3), 785–797. <u>https://doi.org/10.1111/1365-2656.12495</u>
- 693 Frederiksen, M., Daunt, F., Harris, M. P., & Wanless, S. (2008). The demographic impact of
- extreme events: stochastic weather drives survival and population dynamics in a long-
- lived seabird. Journal of Animal Ecology, 77(5), 1020–1029.
- 696 <u>https://doi.org/10.1111/j.1365-2656.2008.01422.x</u>
- 697 Gaillard, J.-M., & Yoccoz, N. G. (2003). Temporal variation in survival of mammals: a case
- of environmental canalization? Ecology, 84(12), 3294–3306. <u>https://doi.org/10.1890/02-</u>
- 699 <u>0409</u>
- Gelman, A., Meng, X.-L., & Stern, H. (1996). Posterior predictive assessment of model
- fitness via realized discrepancies. Statistica Sinica, 6(4), 733–760.
- Gonzalez, A., Ronce, O., Ferriere, R., & Hochberg, M. E. (2013). Evolutionary rescue: an
- emerging focus at the intersection between ecology and evolution. Philosophical
- Transactions of the Royal Society B, 368, 20120404.
- 705 https://doi.org/10.1098/rstb.2012.0404

- Grant, P. R., & Grant, B. R. (1995). Predicting microevolutionary responses to directional
- selection on heritable variation. Evolution, 49(2), 241–251. <u>https://doi.org/10.1111/j.1558-</u>
 5646.1995.tb02236.x
- 709 Grant, P. R., Grant, B. R., Huey, R. B., Johnson, M. T. J., Knoll, A. H., & Schmitt, J. (2017).
- Evolution caused by extreme events. Philosophical Transactions of the Royal Society B,
- 711 372(1723), 20160146. <u>https://doi.org/10.1098/rstb.2016.0146</u>
- Grayson, K. L., Bailey, L. L., & Wilbur H. M. (2011). Life history benefits of residency in a
 partially migrating pond-breeding amphibian. Ecology 92(6), 1236–1246.
- 714 <u>https://doi.org/10.1890/11-0133.1</u>
- 715 Grayson, K. L., & Wilbur, H. M. (2009). Sex- and context-dependent migration in a pond-
- ⁷¹⁶ breeding amphibian. Ecology, 90(2), 306–312. <u>https://doi.org/10.1890/08-0935.1</u>
- 717 Green, D. J., Whitehorne, I. B. J., Middleton, H. A., & Morrissey, C. A. (2015). Do american
- dippers obtain a survival benefit from altitudinal migration? PLOS ONE, 10(4), e0125734.
- 719 <u>https://doi.org/10.1371/journal.pone.0125734</u>
- Grémillet, D., Tuschy, I., & Kierspel, M. (1998). Body temperature and insulation in diving
- great cormorants and European shags. Functional Ecology, 12(3), 386–394.
- 722 <u>https://doi.org/10.1046/j.1365-2435.1998.00199.x</u>
- 723 Grist, H., Daunt, F., Wanless, S., Nelson, E. J., Harris, M. P., Newell, M., ... Reid, J. M.
- (2014). Site fidelity and individual variation in winter location in partially migratory
- European shags. PLOS ONE, 9(6), e98562. <u>https://doi.org/10.1371/journal.pone.0098562</u>
- Grist, H., Daunt, F., Wanless, S., Burthe, S. J., Newell, M. A., Harris, M. P., & Reid, J. M.
- 727 (2017). Reproductive performance of resident and migrant males, females and pairs in a
- partially migratory bird. Journal of Animal Ecology, 86(5), 1010–1021.
- 729 <u>https://doi.org/doi.org/10.1111/1365-2656.12691</u>
- Hansen, B.B., Gamelon, M., Albon, S.D., Lee, A.M., Stien, A., Irvine, R.J., ... Grøtan, V.

- 731 (2019). More frequent extreme climate events stabilize reindeer population dynamics.
- 732 Nature Communications, 10(1), 1616. <u>https://doi.org/10.1038/s41467-019-09332-5</u>
- Hairston, N.G., & Walton, W.E. (1986). Rapid evolution of a life history trait. Proceedings of
- the National Academy of Sciences of the United States of America, 83(13), 4831–4833.
- 735 <u>https://doi.org/10.1073/pnas.83.13.4831</u>
- Haridas, C.V., Eager, E.A., Rebarber, R., & Tenhumberg, B. (2014). Frequency-dependent
- population dynamics: Effect of sex ratio and mating system on the elasticity of population
- growth rate. Theoretical Population Biology, 97, 49–56.
- 739 <u>https://doi.org/10.1016/j.tpb.2014.08.003</u>
- 740 Harris, M.P., Buckland, S.T., Russell, S.M., & Wanless, S. (1994). Year-and age-related
- variation in the survival of adult European shags over a 24-year period. The Condor,
- 742 96(3), 600–605. <u>https://doi.org/10.2307/1369462</u>
- Hebblewhite, M., & Merrill, E.H. (2011). Demographic balancing of migrant and resident elk
- in a partially migratory population through forage–predation tradeoffs. Oikos, 120(2),
- 745 1860–1870. <u>https://doi.org/10.1111/j.1600-0706.2011.19436.x</u>
- 746 Hegemann, A., Marra, P.P., & Tieleman, B.I. (2015). Causes and consequences of partial
- migration in a passerine bird. The American Naturalist, 186(4), 531–546.
- 748 <u>https://doi.org/10.1086/682667</u>
- Hereford, J., Hansen, T.F., & Houle, D. (2004). Comparing strengths of directional selection:
- how strong is strong? Evolution, 58(10), 2133–2143. <u>https://doi.org/10.1111/j.0014-</u>
- 751 <u>3820.2004.tb01592.x</u>
- Hoffmann, A.A., & Sgrò, C.M. (2011). Climate change and evolutionary adaptation. Nature,
 470(7335), 479–485. https://doi.org/10.1038/nature09670
- Hsiung, A.C., Boyle, W.A., Cooper, R.J., & Chandler, R.B. (2018). Altitudinal migration:
- ecological drivers, knowledge gaps, and conservation implications. Biological Reviews,

- 756 93(4), 2049–2070. <u>https://doi.org/10.1111/brv.12435</u>
- Jones, G. (1987). Selection against large size in the Sand Martin *Riparia riparia* during a
- 758 dramatic population crash. Ibis, 129, 274–280. <u>https://doi.org/10.1111/j.1474-</u>
- 759 <u>919X.1987.tb03208.x</u>
- Keller, L.F., Arcese, P., Smith, J.N.M., Hochachka, W.M., & Stearns, S.C. (1994). Selection
- against inbred song sparrows during a natural population bottleneck. Nature, 372(6504),
- 762 356–357. <u>https://doi.org/10.1038/372356a0</u>
- Kingsolver, J.G., Hoekstra, H.E., Hoekstra, J.M., Berrigan, D., Vignieri, S.N., Hill, C.E., ...
- Beerli, P. (2001). The strength of phenotypic selection in natural populations. The
- 765 American Naturalist, 157(3), 245–261. <u>https://doi.org/10.1086/319193</u>
- 766 Kruuk, L.E.B., Slate, J., & Wilson, A.J. (2008). New answers for old questions: the
- evolutionary quantitative genetics of wild animal populations. Annual Review of Ecology,
- Evolution, and Systematics, 39, 525–548.
- 769 <u>https://doi.org/10.1146/annurev.ecolsys.39.110707.173542</u>
- Lebreton, J.D., & Pradel, R. (2002). Multistate recapture models: Modelling incomplete
- individual histories. Journal of Applied Statistics, 29(1-4), 353–369.
- 772 https://doi.org/10.1080/02664760120108638
- Lewis, S., Phillips, R.A., Burthe, S.J., Wanless, S., & Daunt, F. (2015). Contrasting responses
- of male and female foraging effort to year-round wind conditions. Journal of Animal
- 775 Ecology, 84(6), 1490–1496. <u>https://doi.org/10.1111/1365-2656.12419</u>
- Lundberg, P. (1988). The evolution of partial migration in birds. Trends in Ecology and
- Evolution, 3(7), 172–175. <u>https://doi.org/10.1016/0169-5347(88)90035-3</u>
- Marrot, P., Garant, D., & Charmantier, A. (2017). Multiple extreme climatic events
- strengthen selection for earlier breeding in a wild passerine. Philosophical Transactions of
- the Royal Society B, 372(1723), 20160372. <u>https://doi.org/10.1098/rstb.2016.0372</u>

- 781 Maxwell, S.L., Butt, N., Maron, M., McAlpine, C.A., Chapman, S., Ullmann, A., ... Watson,
- J. E. M. (2019). Conservation implications of ecological responses to extreme weather and
- climate events. Diversity and Distributions, 25(4), 613–625.
- 784 <u>https://doi.org/10.1111/ddi.12878</u>
- 785 Moreno, J., & Møller, A.P. (2011). Extreme climatic events in relation to global change and
- their impact on life histories. Current Zoology, 57(3), 375–389.
- 787 <u>https://doi.org/10.1093/czoolo/57.3.375</u>
- Moritz, C., & Agudo, R. (2013). The Future of Species Under Climate Change: Resilience or
- 789 Decline? Science, 341(6145), 504–508. <u>https://doi.org/10.1126/science.1237190</u>
- Mysterud, A., Loe, L.E., Zimmermann, B., Bischof, R., Veiberg, V., & Meisingset, E.
- 791 (2011). Partial migration in expanding red deer populations at northern latitudes a role
- for density dependence? Oikos, 120(2), 1817–1825. <u>https://doi.org/10.1111/j.1600-</u>
- 793 <u>0706.2011.19439.x</u>
- Newton, I. (2008). The migration ecology of birds. Oxford, UK: Elsevier.
- 795 <u>https://doi.org/10.1016/B978-0-12-517367-4.X5000-1</u>
- 796 Niu, S., Luo, Y., Li, D., Cao, S., Xia, J., Li, J., & M. D. Smith. (2014). Plant growth and
- mortality under climatic extremes: An overview. Environmental and Experimental Botany
- 798 98:13–19. <u>https://doi.org/10.1016/j.envexpbot.2013.10.004</u>
- O'Donald, P. (1973). A further analysis of Bumpus' data: The intensity of natural selection.
- Evolution, 27(3), 398–404. <u>https://doi.org/10.2307/2407303</u>
- Papastamatiou, Y.P., Meyer, C.G., Carvalho, F., Dale, J.J., Hutchinson, M.R., & Holland,
- K.N. (2013). Telemetry and random-walk models reveal complex patterns of partial
- migration in a large marine predator. Ecology, 94(11), 2595–2606.
- 804 <u>https://doi.org/10.1890/12-2014.1</u>
- Parmesan, C., Gaines, S., Gonzalez, L., Kaufman, D.M., Kingsolver, J., Townsend Peterson,
- A., & Sagarin, R. (2005). Empirical perspectives on species borders: from traditional
 biogeography to global change. Oikos, 108(1), 58–75. <u>https://doi.org/10.1111/j.0030-</u>
 1299.2005.13150.x
- 809 Péron, G., Gaillard, J.-M., Barbraud, C., Bonenfant, C., Charmantier, A., Choquet, R., ...
- 810 Marzolin, G. (2016). Evidence of reduced individual heterogeneity in adult survival of
- long-lived species. Evolution, 70(12), 2909–2914. <u>https://doi.org/10.1111/evo.13098</u>
- van de Pol, M., Jenouvrier, S., Cornelissen, J.H.C., & Visser, M.E. (2017). Behavioural,
- ecological and evolutionary responses to extreme climatic events: challenges and
- directions. Philosophical Transactions of the Royal Society B, 372, 20160134.
- 815 <u>https://doi.org/10.1098/rstb.2016.0134</u>
- van de Pol, M., Vindenes, Y., Sæther, B.-E., Engen, S., Ens, B.J., Oosterbeek, K., &
- Tinbergen, J. M. (2010). Effects of climate change and variability on population dynamics
- in a long-lived shorebird. Ecology, 91(4), 1192–1204. <u>https://doi.org/10.1890/09-0410.1</u>
- Pulido, F. (2007). The genetics and evolution of avian migration. Bioscience, 57(2), 165–
- 820 174. <u>https://doi.org/10.1641/B570211</u>
- Pulido, F. (2011). Evolutionary genetics of partial migration-the threshold model of
- migration revis(it)ed. Oikos, 120(12), 1776–1783. <u>https://doi.org/10.1111/j.1600-</u>
- 823 <u>0706.2011.19844.x</u>
- 824 R Core Team. (2019). R: A language and environment for statistical computing. R
- Foundation for Statistical Computing, Vienna, Austria.
- Reid, J.M., Travis, J.M.J., Daunt, F., Burthe, S.J., Wanless, S., & Dytham, C. (2018).
- 827 Population and evolutionary dynamics in spatially structured seasonally varying
- environments: Partially migratory meta-populations. Biological Reviews, 93(3), 1578–
- 829 1603. <u>https://doi.org/10.1111/brv.12409</u>
- 830 Sæther, B.-E., & Bakke, Ø. (2000). Avian life history variation and contribution of

- demographic traits to the population growth rate. Ecology, 81(3), 642–653.
- 832 https://doi.org/10.1890/0012-9658(2000)081[0642:ALHVAC]2.0.CO;2
- 833 Sanz-Aguilar, A., Béchet, A., Germain, C., Johnson, A. R., & Pradel, R. (2012). To leave or
- not to leave: survival trade-offs between different migratory strategies in the greater
- flamingo. Journal of Animal Ecology, 81(6), 1171–1182. <u>https://doi.org/10.1111/j.1365-</u>
- 836 <u>2656.2012.01997.x</u>
- 837 Sawyer, H., Merkle, J.A., Middleton, A.D., Dwinnell, S.P., & Monteith, K.L. (2019).
- 838 Migratory plasticity is not ubiquitous among large herbivores. Journal of Animal Ecology,

839 88(3), 450–460. <u>https://doi.org/10.1111/1365-2656.12926</u>

- Schaub, M., Gimenez, O., Schmidt, B.R., & Pradel, R. (2004). Estimating survival and
- temporary emigration in the multistate capture-recapture framework. Ecology, 85(8),
- 842 2107–2113. <u>https://doi.org/10.1890/03-3110</u>
- Skov, C., Chapman, B.B., Baktoft, H., Brodersen, J., Brönmark, C., Hansson, L.-A., ...,
- Nilsson. P. A. (2013). Migration confers survival benefits against avian predators for
- partially migratory freshwater fish. Biology Letters, 9(2), 20121178.
- 846 <u>https://doi.org/10.1098/rsbl.2012.1178</u>
- 847 Székely, T., Weissing, F.J., & Komdeur, J. (2014). Adult sex ratio variation: implications for
- breeding system evolution. Journal of Evolutionary Biology, 27(8), 1500–1512.
- 849 <u>https://doi.org/10.1111/jeb.12415</u>
- Ummenhofer, C.C., & Meehl, G.A. (2017). Extreme weather and climate events with
- ecological relevance: a review. Philosophical Transactions of the Royal Society B,
- 852 372(1723), 20160135. <u>https://doi.org/10.1098/rstb.2016.0135</u>
- Welbergen, J.A., Klose, S.M., Markus, N., & Eby, P. (2007). Climate change and the effects
- of temperature extremes on Australian flying-foxes. Proceedings of the Royal Society B,
- 855 275(1633), 419–425. <u>https://doi.org/10.1098/rspb.2007.1385</u>

- Widemo, F., & Sæther, S.A. (1999). Beauty is in the eye of the beholder: causes and
- consequences of variation in mating preferences. Trends in Ecology and Evolution, 14(1),
- 858 26–31. <u>https://doi.org/10.1016/S0169-5347(98)01531-6</u>
- 859 Wysujack, K., Greenberg, L.A., Bergman, E., & Olsson, I.C. (2009). The role of the
- 860 environment in partial migration: food availability affects the adoption of a migratory
- tactic in brown trout *Salmo trutta*. Ecology of Freshwater Fish, 18(1), 52–59.
- 862 <u>https://doi.org/10.1111/j.1600-0633.2008.00322.x</u>
- 863 Zúñiga, D., Gager, Y., Kokko, H., Fudickar, A.M., Schmidt, A., Naef-Daenzer, B., ...
- Partecke, J. (2017). Migration confers winter survival benefits in a partially migratory
- songbird. eLife, 6, e28123. <u>https://doi.org/10.7554/eLife.28123</u>

APPENDIX S1

Additional details of the study system and dataset

Contents:

- **S1.1** Impacts of extreme weather and ECE characteristics (p.1)
- S1.2 Details of the study population and summer sightings (p. 5)
- S1.3 Age effects and observed changes in age distribution (p. 7)
- **S1.4** Details of sexing (p. 9)
- **S1.5** Details of winter sightings (p. 10)
- **S1.6** Data checking (p. 13)
- **S1.7** Details of compilation of capture-recapture histories (p. 14)
- **S1.8** Details of observed switching between migratory areas in winter (p. 17)
- S1.9 Details of observed spatio-temporal variation in sex ratio (p. 18)
- **S1.10** References (p. 19)

S1.1 Impacts of extreme weather and ECE characteristics

European shags inhabiting the UK east coast are known to experience episodes of substantial mortality caused by adverse weather (Potts 1969; Aebischer 1993; Harris & Wanless 1996; Frederiksen, Daunt, Harris, & Wanless, 2008). Major "wrecks" (i.e. mass occurrence of dead beached birds) occur, usually concomitant with extreme late-winter storms involving protracted periods of strong easterly onshore winds that cause particularly rough sea states, and intense rainfall (Potts 1969; Harris & Wanless 1996; Frederiksen et al., 2008; Reid & Daunt 2013; Fig. S1). Shags reduce foraging time during strong winds, and stop foraging altogether during the strongest gales (Daunt, Afanasyev, Silk, & Wanless, 2006), probably due to flying difficulties or foraging inefficiency under high water turbidity (Schreiber 2001; Strod, Arad,

Izhaki, & Katzir, 2004). Such weather-induced constraints on foraging can exacerbate constraints resulting from limited daylight foraging time in winter (Daunt et al., 2006). Further, their partially wettable plumage generates major thermogulatory costs under wet and cold conditions, that wind presumably amplifies (Grémillet, Tuschy, & Kierspel, 1998; Grémillet, Chauvin, Wilson, Le Maho, & Wanless, 2005; Frederiksen et al., 2008). Above a threshold of cumulative easterly wind and rainfall in late winter, adult survival probability of shags falls drastically (Frederiksen et al., 2008). During 1965-2005, mean annual adult survival probability was 0.858 (±0.030 SE), but substantial drops in adult survival (notably, below 0.6 in 1965 and 2004, 0.3 in 1992) were associated with periods of extreme winter weather (Frederiksen et al., 2008).



Figure S1. Shags recovered dead in Fraserburgh, Scotland, after a major easterly storm in late December 2012 (Photo credit: Raymond Duncan).

All four defined ECEs that occurred during our current 2009–2018 study period when winter resightings were collected (storms in December 2012, February 2013, January 2014 and the cold wave in February-March 2018) were characterised by strong easterly gales and rough seas (Met Office 2019) which caused major structural damage to coastal infrastructure (e.g. BBC 2012a,b, 2013a) and/or major 'wrecks' of seabirds (e.g. Reid & Daunt 2013; BBC 2013b; CEH 2013) and marine invertebrates (e.g. Alexander 2018). Fieldworkers rapidly perceived major perturbations to shag behavior, including cessation of foraging and daytime roosting in atypical habitats (e.g. harbors, Fig. S2). These qualitative behavioral observations further support the previously identified mechanistic link between easterly gales and low survival (Daunt et al., 2006; Frederiksen et al., 2008).



Figure S2. Shags sheltering from a north-easterly gale in Fraserburgh harbour, Scotland, in December 2012 (Photo credit: Euan Ferguson). Several individuals were found dead at this location following consecutive days when weather conditions precluded foraging (Fig. 1).

However, formally linking particular weather or environmental variables to seasonal survival in residents versus migrants is in fact highly challenging. Such analyses would require biologically-relevant composite values of multiple weather variables (notably comprising onshore wind, precipitation and temperature), and resulting sea state, to be calculated in a

comparable way at multiple coastal locations. Further, rough sea states in coastal areas were sometimes caused by gales centred offshore, meaning that the exact locations of the driving weather events are not always obvious and could be a long distance away from the focal coastal locations. Further, since locations are unknown for shags that wintered outside surveyed sites (represented by the 'ghost area' in our models), the appropriate locations in which to evaluate environmental conditions are not fully known. Progress would ideally require integration and interpolation of datasets from multiple UK onshore and offshore weather stations (which are not always located at biologically relevant locations) and assessment of geographical characteristics of each coastal location that would shape seastate and hence marine and biological impacts. Further, ECEs that occurred during 2009-2018 and caused substantial mortality had clearly different characteristics and timescales (e.g. extreme north-easterly gale and intense rainfall in December 2012, versus a protracted (south-)easterly gale and extreme cold wave in February-March 2018; Met Office 2019). Consequently, simple axes of weather variation cannot be expected to adequately explain spatio-temporal variation in shag survival across our current 10-year dataset. This highlights what are likely to be general challenges in mechanistic modelling of biological impacts of ECEs: such events are by definition infrequent, and may also be highly idiosyncratic (Bailey & van de Pol 2016). This means that, as in our case, sequentially observed ECEs may be highly different from each other and spatially heterogenous, and cannot be easily collapsed into simple axes of variation. With further years of data, the shag system with its relatively regular occurrence of ECEs that cause high mortality (Frederiksen et al., 2008) could provide a valuable opportunity to evaluate the complex multidimensional function capturing the interacting effects of weather and location on shag survival.

Since we do not currently have appropriate climatic data and models to formally quantify the properties of the defined ECEs, we cannot explicitly test whether they fulfilled the

quantitative definition of the IPCC (2001) that ECEs are "rare as or rarer than the 10th or 90th percentile of a probability density function estimated from observations at a given place and time of year". Nonetheless, the four defined ECEs heuristically fulfil this criteria, based on their observed characteristics and impacts on wildlife and infrastructure. They certainly fulfil the proposed biological definition of an ECE (Bailey & van de Pol 2016) as conditions that were expected to cause high mortality; and our results confirmed that this was the case for all four defined events.

Observers' perceptions during the two ECEs that caused selection against residence (February 2013 and February-March 2018) were that weather and sea conditions, and related perturbation of shag behavior, were more severe in the residency area surrounding the Isle of May (hereafter "IoM") than in northern migrant areas. Indeed, since swells were predominantly (south-)easterly, key migrant areas would be relatively sheltered (e.g. yellow and brown area on Fig. 1). As a corollary, since the ECEs in December 2012 and January 2014 involved primarily north-easterly swells, the full coastline was likely impacted similarly (see Fig. 1).

Interestingly, and contrasting with the east coast, shag wrecks are not observed on the west coast of Scotland. This is probably because the indented coastline and islands can provide shelter from all wind directions (Swann & Ramsay 1979; Frederiksen et al., 2008), further implying that availability of shelter from winter storms is critically important.

S1.2 Details of the study population and summer sightings

The Isle of May National Nature Reserve is a small island (\sim 2 km long, <0.5 km wide) located \sim 8 km from the Fife coast. Its shag population is intensively studied through the breeding season.

Annual nest counts undertaken by Scottish Natural Heritage (SNH) at the peak of shag reproductive activities during 2009–2018 estimated breeding population sizes of 322–648 nests (Fig. S3). These nest counts presumably slightly underestimate breeding population size, due

to early nesting failure, late breeding attempts, and undetected nest sites at the time of survey. Nevertheless, these data illustrate the effects of the ECEs in December 2012 and February 2013, and in February-March 2018, in reducing adult survival and hence breeding population size.



Figure S3. Number of nests counted at the peak of reproductive activities on the Isle of May in each year during 2009-2018.

The proportion of marked breeders, calculated as the number of marked individuals resighted as breeders on the Isle of May divided by twice the SNH nest counts, was: 0.79 in 2009, 0.88 in 2010, 1.02 in 2011, 0.96 in 2012, 0.92 in 2013, 0.99 in 2014, 0.94 in 2015, 1.02 in 2016, 0.96 in 2017, and 1.00 in 2018. Due to the slight underestimation of breeding population size, this proportion of marked breeders is presumably slightly overestimated, which explains why it was slightly >100% in some years.

Systematic observations of all shag nests, and of adjacent roost areas, generate large numbers of shag resightings and ensure the very high breeding-season resighting rate (see Results). For field logistical convenience, breeding season resightings of individuals at nest sites were stored as one record per breeding attempt, attributed to May 1st in the focal year. Of

the total of 43214 "resightings" utilised for the present analyses, almost 60% (25963) were in April–June on the Isle of May, including 8267 that corresponded to breeding attempt records.

Breeding dispersal from the focal population is negligible (<<1%; Aebischer 1995; Barlow, Daunt, Wanless, & Reid, 2013). However, observed natal dispersal rates ranged ~5– 10% (Aebischer 1995; Barlow et al., 2013). Accordingly, we focused on individuals from their first observed breeding event during 2009–2017, thereby excluding the pre-breeding lifehistory phase during which individuals may disperse. Because we analysed capture-resightings histories spanning the 2009–2018 breeding seasons, individuals first recorded breeding in 2018 were not informative regarding survival probabilities across the study period, and were hence excluded from the dataset. In the 2009–2018 resighting data, while the main breeding colonies in north-east UK were monitored and ringed breeders actively searched for, we confirmed only two breeding dispersal events (0.09% of individuals). Resightings off the Isle of May during the breeding season led to suspicion of breeding dispersal for two further individuals. The entire capture-recapture histories of these four individuals were excluded from the dataset. Consequently, we can assume that apparent survival is not confounded with permanent emigration once individuals have recruited to breed on IoM.

S1.3 Age effects and observed changes in age distribution

In principle, relationships between seasonal migration versus residence and survival could potentially arise if individuals of different ages have different propensities to migrate or remain resident, and also have different survival probabilities. Such effects are not straightforward to explicitly quantify, but are very unlikely to explain our current main conclusions. Formal estimation of age effects in our models would require further stratification not only of survival probabilities, but also of the movement parameters that are already characterized by large spatio-temporal variation. Given this complex model structure and substantial spatio-temporal heterogeneity in detection, adding age effects would result in a large loss of precision in the estimation. This is exacerbated because 615 of 2274 focal individuals were first ringed as adults and hence are of uncertain age. Restricting the analyses to known-age individuals would thus reduce the number of individual encounter histories by 27%.

Previous (cross-sectional) capture-recapture analyses of age-dependence in survival probability of IoM shags found evidence of acturial senescence only from age 14 years. However, individuals aged \geq 14 years comprise a small proportion of the current dataset (4–12% across years of known-age individuals). Effects of senescence would therefore be very hard to detect with our current model. By corollary, it is very unlikely that underlying senescence could have substantially affected survival parameters in our models, or could have caused the large difference in survival between residents and migrants during the late-winter ECEs in 2012-13 and 2017-18.

Indeed, visual inspection of year-to-year changes in the age distribution of surviving individuals observed during the breeding season (when recapture probability is very high, see main text), show no indication of change as would result from major age-dependent mortality (Fig. S4). This was even true during the years with ECEs that were associated with strong selection (2012-13 and 2017-18), indicating that apparent ECE-induced selection was not mainly driven by correlated age effects on survival and migration propensity. And indeed, there was no evidence of major lack of fit that could be attributable to age effects in our models (Appendix S4). These conclusions are further supported by additional analyses focusing on known-age individuals resignted in winter 2012-13, 2013-14 and 2017-18, which did not find evidence of age-dependence in survival probability (Burthe et al., in prep.).



Figure S4. Year-to-year changes in the age distribution of known-age surviving adult shags observed on IoM during each breeding season. Each panel shows the age distribution in the initial year y (rose), superimposed with the age distribution of individuals that survived to the next year y+1 (light blue). Common parts of both distributions appear in purple. Differences between distributions (rose and blue areas) are essentially attributable to age-dependent

survival variation.

S1.4 Details of sexing

We sexed most individuals from repeated field observations, mainly of vocalisations and occasionally of behavior (Snow 1963). In addition, we used DNA extracted from blood samples to sex 11% of individuals by genotyping the CHD1 gene region (using primers 2550F

and 2757R; Griffiths, Double, Orr, & Dawson, 1998; Fridolfsson & Ellegren 1999). Comparisons in the wider database including all sex assignments since 1997 showed that sexes were typically accurately assigned from observations: field assignments matched genotypic assignments in 98.7% of 1295 cases where both information sources were available (98.2% if considering only the first field observation of each individual). In the few cases where an individual had been assigned as both sexes from field observations, we assumed that the most frequent assignment was correct (only 1.32% of observations conflicted). Sex was assigned as unknown when an individual had no field observations or genetic data (5.10% of the 2274 individuals analysed here, mostly first-time breeders in 2018 and individuals who died early) or when it was evenly assigned to both sexes (0.48% of individuals). The sexed dataset was thus reduced to 2147 individuals. Most unsexed individuals entered the dataset in 2016 or 2017 (29 and 59 respectively, versus 1–15 in each previous year), obviously because there had been more opportunities to sex individuals that entered the dataset earlier.

S1.5 Details of winter sightings

Color-ringed shags can be observed onshore in winter (e.g. Fig. S4), because their partially wettable plumage forces them to return to land every day (Grémillet et al., 1998, 2005; Grist et al., 2014, 2017). Historical dead recoveries of shags ringed on IoM and surrounding colonies were used to define the east coast of Scotland and northern England as the geographical range likely to be relevant to shags migrating away from IoM in winter (Galbraith et al., 1986; Harris & Swan 2002; Grist et al., 2014). Pilot fieldwork in 2008-09 winter confirmed that shags ringed on the IoM could be located and resighted across this geographical range (see Fig. 1). Individuals were observed across surveys spanning 540 km north to 355 km south of the IoM, encompassing night roosts where shags congregate at dusk and day roosts where they rest between foraging trips. These roost sites are typically located on cliffs, rocky islets, and harbor walls. Shags were very seldom resighted inland or along beaches and dunes. Accordingly, their

winter habitat is patchy: migrant sites are not continuously distributed along the coastline (Fig. 1). Shags are uncommon south of the focal range, since the coast is sand or mudflats with few potential roost sites.



Figure S5. Shags with unique individual color-rings 'IAI' and 'LXJ' resighted in winter on the eastern Scottish coast (Photo credit: Bradley Fairclough).

Resighting surveys were undertaken across known accessible sites every winter from early September to the end of February. In addition to sites identified during the pilot fieldwork, additional survey sites were identified by consulting local birdwatchers and bird reports, and by further field exploration. The primary goal was to repeatedly locate individuals wintering across a large geographical range, not to map or infer the complete winter distribution of the entire population. Therefore, winter surveys were designed to ensure that key sites were visited repeatedly, ca. every 1–2 weeks, and visits were planned to coincide with site-specific use by shags, tides or weather conditions to maximise resigning efficiency. Additional sightings from any location were actively solicited from birdwatchers to maximise the resighting probability of color-ringed shags over their full winter range.

During each survey, at least one observer screened the roost site with a 60× magnification telescope for 30-300 minutes depending on the number and turnover of shags. Each survey lasted until all visible individuals were checked for rings and color-ring codes carefully recorded, or light, tide or weather conditions prevented further resightings. Not all roost areas were accessible for visual resightings, and not all color-rings were always fully visible (e.g. hidden by rocks, plumage, other birds, vegetation, etc.). Accordingly, the probability of resighting an individual present at the survey site was <1 and presumably varied among sites and surveys. Survey effort and efficiency also varied within and among winters due to variation in weather and observer knowledge of roost sites. Day roost occupancy varies markedly with time of day, tide and weather, and decreases in mid-winter as the proportion of daylight hours spent foraging increases (Daunt et al., 2006; Daunt et al., 2014; Lewis, Phillips, Burthe, Wanless, & Daunt, 2015; Grist et al., 2014, 2017). Such variations inevitably generate spatiotemporal heterogeneity of resighting probability, which was taken into account in the models analysed in the present study by parameterising resighting probabilities as location×timedependence (see Methods). However, the repeated surveys undertaken throughout the winter increased the probability that present individuals would be resighted at least once within the ~1-month time windows of the five capture-resighting occasions defined in the present analyses (see Results; Appendix S5). To provide an indication of resighting effort and resulting spatio-temporal distribution of data collected, Table S1 contains the numbers of sightings and individuals recorded in each occasion and observed area, comprising the total of 43214 sightings of 2274 individuals utilised for the capture-recapture analyses (see Methods; Fig. 1).

Table S1. Number of (re)sightings (and corresponding number of unique individuals) in each area, per occasion ('occ.') across years. R: is the residency area (IoM, red on Fig. 1), or migratory area M1: orange on Fig. 1, M2: brown on Fig. 1, M3: yellow on Fig. 1, and M4: pink on Fig. 1.

Area	Occ.	Year									
		(1) 2009-10	(2) 2010-11	(3) 2011-12	(4) 2012-13	(5) 2013-14	(6) 2014-15	(7) 2015-16	(8) 2016-17	(9) 2017-18	(10) 2018-19
R	1	2171 (723)	3248 (831)	3330 (1033)	3537 (1235)	2692 (665)	2169 (686)	2220 (751)	2000 (792)	2588 (915)	2074 (621)
	2	75 (62)	267 (208)	74 (70)	544 (389)	756 (357)	386 (274)	559 (337)	307 (230)	1181 (553)	
	3	83 (68)	144 (114)	197 (162)	631 (361)	339 (204)	426 (263)	317 (217)	133 (104)	621 (393)	
	4	89 (69)	127 (110)	128 (116)	262 (199)	309 (176)	302 (197)	337 (216)	118 (97)	360 (249)	
	5	7 (6)	384 (280)	301 (227)	363 (229)	204 (144)	224 (184)	387 (240)	253 (193)	521 (325)	
M1	1	0 (0)	0 (0)	0 (0)	0 (0)	1 (1)	0 (0)	0 (0)	0 (0)	0 (0)	12 (11)
	2	15 (12)	11 (8)	31 (22)	70 (43)	85 (40)	29 (14)	34 (23)	36 (20)	20 (15)	
	3	21 (12)	55 (28)	77 (37)	124 (46)	93 (36)	74 (32)	77 (32)	80 (35)	44 (19)	
	4	16 (13)	35 (15)	67 (31)	147 (58)	67 (34)	44 (22)	54 (27)	47 (28)	36 (19)	
	5	9 (7)	71 (28)	104 (41)	139 (48)	158 (73)	70 (21)	135 (49)	40 (20)	61 (26)	
M2	1	0 (0)	0 (0)	0 (0)	0 (0)	4 (4)	0 (0)	0 (0)	1 (1)	0 (0)	20 (17)
	2	4 (4)	6 (6)	4 (4)	12 (10)	8 (5)	18 (10)	4 (4)	11 (6)	18 (10)	
	3	11 (6)	44 (24)	26 (16)	81 (45)	93 (42)	20 (13)	22 (13)	27 (16)	25 (14)	
	4	46 (24)	24 (17)	75 (37)	56 (44)	60 (32)	35 (16)	38 (18)	52 (23)	44 (22)	
	5	66 (34)	39 (18)	63 (30)	113 (63)	67 (41)	25 (13)	47 (31)	54 (21)	62 (30)	
M3	1	0 (0)	0 (0)	1 (1)	1 (1)	1 (1)	2 (2)	0 (0)	2 (2)	2 (2)	0 (0)
	2	1(1)	7 (5)	0 (0)	34 (31)	18 (12)	20 (14)	3 (3)	5 (5)	22 (19)	
	3	6 (6)	14 (9)	14 (9)	20 (16)	33 (23)	13 (12)	28 (17)	6 (5)	17 (16)	
	4	1(1)	1 (1)	8 (7)	8 (7)	13 (10)	4 (3)	0 (0)	3 (3)	10 (8)	
	5	5 (3)	4 (2)	13 (8)	6 (5)	0 (0)	1 (1)	2 (2)	7 (7)	4 (3)	
M4	1	0 (0)	0 (0)	2 (2)	0 (0)	0 (0)	0 (0)	0 (0)	0 (0)	0 (0)	0 (0)
	2	13 (8)	11 (10)	20 (17)	159 (62)	71 (23)	27 (16)	56 (28)	64 (25)	75 (26)	
	3	26 (13)	29 (15)	79 (32)	118 (59)	85 (25)	67 (20)	36 (21)	38 (20)	88 (26)	
	4	6 (5)	3 (3)	11 (10)	50 (37)	29 (14)	8 (8)	21 (16)	30 (19)	83 (25)	
	5	1(1)	5 (5)	5 (5)	5 (5)	3 (3)	6 (3)	13 (13)	17 (12)	35 (21)	

S1.6 Data checking

We undertook thorough checking and validation of resighting data before compiling encounter histories. We discarded resightings of individuals that were known or highly suspected to have been mistakes in field observation or reporting. We removed resightings reported after an individual was found dead (11 records, <0.02% of the original, unchecked dataset before restriction to occasion time-windows). We examined all isolated records of individuals that

had not previously been resighted for ≥ 2 years, and were not resighted again subsequently. Quite often, resighting or reporting errors were identified. When there was no indication that the record was mistaken, we kept it in the dataset. These checks led to the removal of 138 resightings (<0.3% of the original dataset). Further, we checked the history of birds that were resighted outside IoM during the breeding season. Indeed, regular resightings in another breeding location, and hence no or rare opportunistic resightings with no breeding record on IoM, would have suggested that they dispersed from IoM.

S1.7 Details of compilation of capture-recapture histories

The exact date limits of the time windows chosen to define the five annual resighting occasions (see Methods) were: 1st April to 30th June for occasion 1, 1st September to 30th September for occasion 2, 1st October to 31st October for occasion 3, 13th November to 18th December for occasion 4, 6th January to 15th February for occasion 5. These time windows represent a pragmatic balance between narrowing the window and hence excluding intervening resightings, and expanding the window and hence violating standard capture-recapture assumptions of no movement or mortality within occasions (O'Brien, Robert, & Tiandry, 2005). In addition, these date limits were chosen given the temporal distribution of resightings. For example, July resightings were not included in occasion 1 because resightings on the residency area in July were redundant with earlier resightings during the peak of shag breeding in April–June. Very few resightings are recorded in August or March. For other occasions, date limits were selected to include many resightings occurring in trips to IoM, which are constrained by winter accessibility.

Collapsing all resightings of each focal individual in each occasion into a unique event was straightforward in 99.65% of cases, because the individual was either not resighted within the focal occasion (74.4%), or was resighted once or several times in the same area (25.3%). Some remaining cases (0.05%) concerned resightings in a migratory area in the breeding

season followed by resighting(s) on IoM, indicating late return from migration. We thus assigned the observation event to the residency area. Other cases (0.3%) concerned resightings in several areas within a winter occasion. Here, we picked the observation event at random from these areas.



Figure S6. Examples of uniquely-coded alphabetic color-rings, and uniquely-coded British Trust for Ornithology metal rings, used to individually mark shags on IoM.(Photo credit: Keith Barrow and Dave Pickering).

During compilation of individual capture-resighting histories, we excluded 7071 resightings (among 50285, i.e. 14%) that occurred outside the defined time windows, meaning that 43214 resightings utilised for the present analyses. Individuals were considered from their first breeding during 2009–2017 up to the 2018 breeding season. Accordingly, individuals that had already bred on IoM before 2009 entered the dataset as already recruited (essentially in 2009), while others entered the dataset as new recruits. The number of new individuals entering the dataset was 723 (32%) in 2009, 163 (7%) in 2010, 271 (12%) in 2011, 318 (14%) in 2012, 147 (6%) in 2013, 169 (7%) in 2014, 117 (5%) in 2015, 135 (6%) in 2016, and 231 (10%) in 2017. Table S2 hereafter provides details of individual observation events across the study period, after compiling individual capture-resighting histories.

Occ.	Event	Year									
_		(1) 2009-10	(2) 2010-11	(3) 2011-12	(4) 2012-13	(5) 2013-14	(6) 2014-15	(7) 2015-16	(8) 2016-17	(9) 2017-18	(10) 2018-19
1	R	723 (1)	831 (0.98)	1033 (0.98)	1234 (0.96)	664 (0.93)	685 (0.96)	751 (0.97)	790 (0.97)	915 (0.96)	605
2	R	60 (0.09)	205 (0.25)	68 (0.07)	373 (0.35)	336 (0.51)	260 (0.38)	325 (0.44)	225 (0.29)	548 (0.61)	
	M1	1 (0)	5 (0.01)	0 (0)	31 (0.03)	11 (0.02)	12 (0.02)	3 (0)	5 (0.01)	19 (0.02)	
	M2	4 (0.01)	6 (0.01)	4 (0)	9 (0.01)	5 (0.01)	9 (0.01)	3 (0)	6 (0.01)	9 (0.01)	
	M3	12 (0.02)	7 (0.01)	21 (0.02)	42 (0.04)	40 (0.06)	13 (0.02)	22 (0.03)	18 (0.02)	15 (0.02)	
	M4	8 (0.01)	9 (0.01)	17 (0.02)	52 (0.05)	18 (0.03)	13 (0.02)	25 (0.03)	24 (0.03)	24 (0.03)	
3	R	65 (0.1)	113 (0.14)	156 (0.16)	347 (0.36)	196 (0.32)	249 (0.37)	206 (0.28)	101 (0.13)	391 (0.46)	
	M1	5 (0.01)	9 (0.01)	9 (0.01)	15 (0.02)	21 (0.03)	12 (0.02)	16 (0.02)	5 (0.01)	13 (0.02)	
	M2	5 (0.01)	24 (0.03)	14 (0.01)	42 (0.04)	36 (0.06)	11 (0.02)	13 (0.02)	16 (0.02)	13 (0.02)	
	M3	12 (0.02)	27 (0.03)	36 (0.04)	41 (0.04)	30 (0.05)	31 (0.05)	31 (0.04)	34 (0.05)	17 (0.02)	
	M4	12 (0.02)	13 (0.02)	29 (0.03)	54 (0.06)	22 (0.04)	20 (0.03)	20 (0.03)	19 (0.03)	26 (0.03)	
4	R	65 (0.1)	108 (0.14)	112 (0.11)	192 (0.23)	169 (0.28)	185 (0.28)	208 (0.29)	97 (0.13)	244 (0.31)	
	M1	1 (0)	1 (0)	7 (0.01)	7 (0.01)	10 (0.02)	2 (0)	0 (0)	3 (0)	7 (0.01)	
	M2	24 (0.04)	16 (0.02)	35 (0.04)	44 (0.05)	30 (0.05)	16 (0.02)	17 (0.02)	23 (0.03)	22 (0.03)	
	M3	13 (0.02)	14 (0.02)	29 (0.03)	52 (0.06)	32 (0.05)	22 (0.03)	26 (0.04)	27 (0.04)	19 (0.02)	
	M4	5 (0.01)	3 (0)	10 (0.01)	32 (0.04)	13 (0.02)	8 (0.01)	16 (0.02)	19 (0.03)	25 (0.03)	
5	R	6 (0.01)	275 (0.35)	220 (0.23)	223 (0.31)	128 (0.22)	178 (0.27)	226 (0.33)	191 (0.26)	318 (0.43)	
	M1	3 (0)	1 (0)	8 (0.01)	5 (0.01)	0 (0)	1 (0)	2 (0)	5 (0.01)	3 (0)	
	M2	33 (0.05)	17 (0.02)	28 (0.03)	62 (0.09)	39 (0.07)	12 (0.02)	26 (0.04)	21 (0.03)	28 (0.04)	
	M3	7 (0.01)	27 (0.03)	40 (0.04)	45 (0.06)	64 (0.11)	21 (0.03)	42 (0.06)	20 (0.03)	22 (0.03)	
_	M4	1 (0)	3 (0)	5 (0.01)	5 (0.01)	3 (0.01)	3 (0)	8 (0.01)	9 (0.01)	19 (0.03)	

Moreover, individual capture-resighting histories were completed with information regarding observability of the focal individual. Few individuals have worn or missing color rings, that are usually replaced during the breeding season to minimise resighting mistakes and unobservability. Nonetheless, time of mark loss remains uncertain. Although individual identification is ensured by a virtually-unlosable inscribed metal ring, such ring is unreadable given the usual conditions of observations in the non-breeding season (see Fig. S5) but is readable in the breeding season because shags can be caught or observed at very close-range. Therefore, we considered these individuals (75 individuals, 3.3% of all individuals) as unobservable in non-breeding occasions up to the time of color-ring replacement. This information was added to the individual capture-recapture histories (in the form of "observability sequences") so that their probability of resighting was constrained to be 0 during the winters when they were unobservable (see details in Appendix S2).

Note that we have not included dead recoveries in our analyses, mainly because resighting probabilities were sufficiently high to provide precise estimates of seasonal survival (see Results). Accordingly, the precision that could have been gained by adding dead recoveries was likely to be very low, and unlikely to justify modelling an additional observation process for dead recovery.

S1.8 Details of observed switching between migratory areas in winter

Over the study period, switching between migratory sites was observed for 5.8% of consecutive resightings (i.e. in occasion o and occasion o+1) of a single migrant individual in winter (out of 1023 pairs of such resightings). Switching was observed for 9.6% of resightings of a single migrant individual in occasion o and occasion o+2 (out of 519 pairs of such resightings), that is ca. twice the proportion of switching from one occasion to the next – which is expected given that, after 2 occasions, the individuals had the opportunity to switch twice. And switching was observed for 16.1% of resightings of a single migrant individual in occasion o+3 (out of 174 pairs of such resightings), that is ca. three times the proportion of switching from one occasions. These figures suggest that the probability of switching (whatever the departure and arrival migratory area) was low in each winter occasion over the study period.

There was too little information to make accurate inferences on switching probability

depending on the departure and arrival site, and each winter occasion in each year, within the context of current analyses. For example, from one winter occasion to the next across years, for each migratory area of departure and area of arrival, in 89.8% of cases no individual was observed switching in the focal year between the focal sites, in 7% of cases only one individual, in 3.0% of cases only two individuals, and in 2‰ of cases only three individuals. The information was even scarcer considering a lag of 2 or 3 occasions between resightings of a single migrant. Nonetheless, the few observed switching events did not seem to differ greatly from randomness, with no specific directionality (i.e. no area concentrating most departures or arrivals, relative to the number of individuals resighted in the focal area). Accordingly, there was no indication of major spatio-temporal biases in the switches.

S1.9 Details of observed spatio-temporal variation in sex ratio

In each area and each occasion, inspection of the sex ratios in the samples of individuals that had been resighted indicated no major sex biases in the observed spatial locations of shags that breed on IoM (Table S3). Indeed, the proportion of males and females in each migratory site were relatively similar in most occasions, with no area being clearly occupied only by females or males in any occasion. The largest deviations from parity or near-parity involved small numbers of individuals and hence are likely to be largely explained by demographic stochasticity.

Table S3. Observed spatio-temporal repartition of the sexes across the study period. Entries indicate the proportion of females among the individuals resighted in each observed area ('R': the residency area, 'M*i*': migratory area i – on Fig. 1: i=1 for the orange points, i=2 for the brown area, i=3 for the yellow area, and i=4 for the pink area) and each occasion ('occ.') across years. The total number of individuals (males and females) resighted in the area at the time considered is given in parentheses.

Occ.	Area	Year									
		(1) 2009-10	(2) 2010-11	(3) 2011-12	(4) 2012-13	(5) 2013-14	(6) 2014-15	(7) 2015-16	(8) 2016-17	(9) 2017-18	(10) 2018-19
1	R	0.47 (722)	0.48 (827)	0.49 (1024)	0.49 (1215)	0.45 (658)	0.45 (678)	0.46 (742)	0.48 (757)	0.49 (840)	0.48 (579)
2	R	0.45 (60)	0.42 (205)	0.49 (68)	0.46 (369)	0.42 (337)	0.42 (259)	0.42 (323)	0.43 (212)	0.47 (499)	
	M1	1 (1)	0.6 (5)	NaN (0)	0.57 (30)	0.5 (12)	0.55 (11)	0.33 (3)	0.6 (5)	0.59 (17)	
	M2	0.25 (4)	0.33 (6)	0.5 (4)	0.44 (9)	0 (5)	0.25 (8)	0.5 (2)	0.5 (6)	0.71 (7)	
	M3	0.67 (12)	0.29 (7)	0.52 (21)	0.67 (42)	0.64 (36)	0.46 (13)	0.5 (22)	0.58 (19)	0.57 (14)	
	M4	0.5 (8)	0.78 (9)	0.82 (17)	0.69 (51)	0.78 (18)	0.64 (14)	0.85 (26)	0.74 (23)	0.72 (25)	
3	R	0.38 (64)	0.47 (113)	0.46 (155)	0.47 (345)	0.42 (193)	0.39 (248)	0.42 (207)	0.48 (93)	0.5 (347)	
	M1	0 (6)	0.33 (9)	0.89 (9)	0.53 (15)	0.38 (21)	0.42 (12)	0.56 (16)	0.8 (5)	0.27 (15)	
	M2	0.4 (5)	0.3 (23)	0.33 (15)	0.33 (42)	0.33 (36)	0.33 (12)	0.45 (11)	0.47 (15)	0.5 (12)	
	M3	0.36 (11)	0.44 (27)	0.55 (33)	0.39 (41)	0.69 (32)	0.6 (30)	0.43 (30)	0.59 (34)	0.41 (17)	
	M4	0.62 (13)	0.71 (14)	0.77 (31)	0.78 (54)	0.67 (21)	0.75 (20)	0.81 (21)	0.79 (19)	0.73 (26)	
4	R	0.34 (65)	0.63 (108)	0.43 (112)	0.43 (191)	0.4 (167)	0.41 (184)	0.42 (207)	0.33 (92)	0.49 (217)	
	M1	0(1)	NaN (0)	0.71 (7)	0.57 (7)	0.4 (10)	0.5 (2)	NaN (0)	0.33 (3)	0.17 (6)	
	M2	0.38 (24)	0.31 (16)	0.37 (35)	0.33 (43)	0.35 (31)	0.44 (16)	0.44 (16)	0.24 (21)	0.45 (20)	
	M3	0.08 (13)	0.07 (15)	0.25 (28)	0.36 (53)	0.55 (33)	0.36 (22)	0.5 (26)	0.39 (28)	0.37 (19)	
	M4	0.2 (5)	0.33 (3)	0.7 (10)	0.82 (33)	0.77 (13)	0.62 (8)	0.75 (16)	0.68 (19)	0.8 (25)	
5	R	0.67 (6)	0.53 (274)	0.52 (222)	0.43 (222)	0.47 (127)	0.41 (177)	0.53 (219)	0.43 (184)	0.49 (298)	
	M1	0 (3)	0 (2)	0.75 (8)	0.6 (5)	NaN (0)	0(1)	0.5 (2)	0.4 (5)	0 (3)	
	M2	0.33 (33)	0.5 (16)	0.34 (29)	0.44 (63)	0.29 (38)	0.46 (13)	0.29 (28)	0.47 (19)	0.4 (25)	
	M3	0.14 (7)	0.11 (28)	0.24 (37)	0.36 (44)	0.27 (66)	0.33 (21)	0.26 (42)	0.3 (20)	0.3 (23)	
	M4	0(1)	1 (3)	0.8 (5)	0.8 (5)	0.67 (3)	0.67 (3)	0.9 (10)	0.73 (11)	0.89 (18)	

S1.10 References

Aebischer, N. J. (1993). Immediate and delayed effects of a gale in late spring on the breeding of the shag *Phalacrocorax aristotelis*. Ibis, 135(3), 225–232.

https://doi.org/10.1111/j.1474-919X.1993.tb02838.x

Aebischer, N. J. (1995). Philopatry and colony fidelity of Shags *Phalacrocorax aristotelis* on the east coast of Britain. Ibis, 137(1), 11–18. <u>https://doi.org/10.1111/j.1474-</u>

919X.1995.tb03214.x

Alexander, M. (2018). What caused thousands of sea creatures to wash up dead on Courier Country shores? The Courrier. Available at

https://www.thecourier.co.uk/fp/news/scotland/618101/caused-thousands-sea-creatureswash-dead-courier-country-shores/. Last accessed 11 10 2019.

- Bailey, L. D., & van de Pol, M. (2016). Tackling extremes: challenges for ecological and evolutionary research on extreme climatic events. Journal of Animal Ecology, 85(1), 85–96. <u>https://doi.org/10.1111/1365-2656.12451</u>
- Barlow, E. J., Daunt, F., Wanless, S., & Reid, J. M. (2013). Estimating dispersal distributions at multiple scales: within-colony and among-colony dispersal rates, distances and directions in European Shags *Phalacrocorax aristotelis*. Ibis, 155(4), 762–778. https://doi.org/10.1111/ibi.12060
- BBC. (2012a). Clean-up after 'perfect storm' batters coast of eastern Scotland. Available at: <u>https://www.bbc.co.uk/news/uk-scotland-north-east-orkney-shetland-20746956</u>. Last accessed 11 10 2019.
- BBC. (2012b). Gales and high tides cause damage across eastern Scotland. Available at: <u>https://www.bbc.co.uk/news/uk-scotland-north-east--shetland-20739484</u>. Last accessed 11 10 2019.
- BBC. (2013a). Scotland's storm damage harbours awarded £1m for repairs. Available at: https://www.bbc.co.uk/news/uk-scotland-21383107. Last accessed 11 10 2019.
- BBC. (2013b). 'Thousands of puffins may be dead' in North Sea storms. Available at: <u>https://www.bbc.co.uk/news/uk-scotland-north-east-orkney-shetland-21941240</u>. Last accessed 11 10 2019.
- Burthe, S. J., J. Reid, M., Newell, M. A., Butler, A., Sturgeon, J., Harris, M. P., ... Daunt, F. (In prep). Selection on migration strategy during extreme winter weather in a partial

migrant.

- CEH. (2013). Puffin 'wreck' in Scotland. News & Media blog. <u>https://www.ceh.ac.uk/news-</u> and-media/blogs/puffin-wreck-scotland. Last accessed 11 10 2019.
- Daunt, F., Afanasyev, V. J., Silk, R. D., & Wanless, S. (2006). Extrinsic and intrinsic determinants of winter foraging and breeding phenology in a temperate seabird.
 Behavioral Ecology and Sociobiology, 59(3), 381–388. <u>https://doi.org/10.1007/s00265-005-0061-4</u>
- Daunt, F., Reed, T. E., Newell, M., Burthe, S., Phillips, R. A., Lewis, S., & Wanless, S. (2014). Longitudinal bio-logging reveals interplay between extrinsic and intrinsic carry-over effects in a long-lived vertebrate. Ecology, 95(8), 2077–2083. https://doi.org/10.1890/13-1797.1
- Frederiksen, M., Daunt, F., Harris, M. P., & Wanless, S. (2008). The demographic impact of extreme events: stochastic weather drives survival and population dynamics in a longlived seabird. Journal of Animal Ecology, 77(5), 1020–1029.

https://doi.org/10.1111/j.1365-2656.2008.01422.x

- Fridolfsson, A.-K., & Ellegren, H. (1999). A simple and universal method for molecular sexing of non-ratite birds. Journal of avian biology, 30(1), 116–121. https://doi.org/10.2307/3677252
- Grémillet, D., Tuschy, I., & Kierspel, M. (1998). Body temperature and insulation in diving great cormorants and European shags. Functional Ecology, 12(3), 386–394.

https://doi.org/10.1046/j.1365-2435.1998.00199.x

Grémillet, D., Chauvin, C., Wilson, R. P., Le Maho, Y., & Wanless, S. (2005). Unusual feather structure allows partial plumage wettability in diving great cormorants *Phalacrocorax carbo*. Journal of Avian Biology, 36(1), 57–63. https://doi.org/10.1111/j.0908-8857.2005.03331.x

- Griffiths, R., Double, M. C., Orr, K., & Dawson, R. J. G. (1998). A DNA test to sex most birds. Molecular Ecology, 7(8), 1071–1075. <u>https://doi.org/10.1046/j.1365-</u> 294x.1998.00389.x
- Grist, H., Daunt, F., Wanless, S., Nelson, E. J., Harris, M. P., Newell, M., ... Reid, J. M.
 (2014). Site fidelity and individual variation in winter location in partially migratory
 European shags. PLOS ONE, 9(6), e98562. <u>https://doi.org/10.1371/journal.pone.0098562</u>
- Grist, H., Daunt, F., Wanless, S., Burthe, S. J., Newell, M. A., Harris, M. P., & Reid, J. M. (2017). Reproductive performance of resident and migrant males, females and pairs in a partially migratory bird. Journal of Animal Ecology, 86(5), 1010–1021. https://doi.org/doi.org/10.1111/1365-2656.12691
- Harris, M. P., & Wanless, S. (1996). Differential responses of Guillemot Uria aalge and Shag Phalacrocorax aristotelis to a late winter wreck. Bird Study, 43(2), 220–230. https://doi.org/10.1080/00063659609461014
- IPCC (2001) Climate Change: The Scientific Basis. Cambridge, UK: Cambridge University Press.
- Lewis, S., Phillips, R.A., Burthe, S.J., Wanless, S., & Daunt, F. (2015). Contrasting responses of male and female foraging effort to year-round wind conditions. Journal of Animal Ecology, 84(6), 1490–1496. <u>https://doi.org/10.1111/1365-2656.12419</u>
- Met Office, UK. (2019). *Climate summaries*. Available at:
 <u>http://www.metoffice.gov.uk/climate/uk/summaries</u>. Last accessed 27 04 2019. [*Note*: This page contained monthly summaries for 2001–2019 on 27th April 2019. Following refreshment of the Met Office website content, on 11th October 2019 only the 2018–2019 summaries were available on this webpage. However, archives of the 2001–2017 summaries can be found on specialised websites such as <u>https://web.archive.org/</u>]

duration assumption of mark–recapture models: a test using simulated and empirical data from an endangered tortoise population. Journal of Applied Ecology, 42(6), 1096–1104. https://doi.org/10.1111/j.1365-2664.2005.01084.x

- Potts, G. R. (1969). The influence of eruptive movements, age, population size and other factors on the survival of the shag (*Phalacrocorax aristotelis* (L.)). Journal of Animal Ecology, 38(1), 53–102. <u>https://doi.org/10.2307/2740</u>
- Schreiber, E. A. (2001). Climate and weather effects on seabirds. In E.A. Schreiber & J. Burger (Eds.), *Biology of Marine Birds* (pp. 179–215). London, UK: CRC Press. <u>https://doi.org/10.1201/9781420036305-10</u>
- Reid, J. M., & Daunt, F. (2013). Major wreck of Shags in North-east Scotland, British Bird News & Comments. Available at: <u>https://britishbirds.co.uk/article/major-wreck-of-shags-</u> in-north-east-scotland/. Last accessed 11 10 2019.
- Snow, B. K. (1963). The behaviour of the shag. British Birds, 56, 77–103.
- Strod, T., Arad, Z., Izhaki, I., & Katzir, G. (2004). Cormorants keep their power: visual resolution in a pursuit-diving bird under amphibious and turbid conditions. Current Biology, 14(10), R376–R377. <u>https://doi.org/10.1016/j.cub.2004.05.009</u>
- Swann, R.L., and A. D. K. Ramsay. 1979. An analysis of shag recoveries from North West Scotland. Ringing and Migration, 2(3), 137–143.

https://doi.org/10.1080/03078698.1979.9673746

APPENDIX S2

Additional details on modelling and Stan code

Contents:

S2.1 Details of the prior distributions (p. 1)

S2.2 Rationale underlying the model code (p. 2)

S2.3 Model code (p. 5)

S2.4 References (p. 12)

S2.1 Details of the prior distributions

We used uninformative uniform priors for all parameters. All parameters were probabilities, either single probabilities of binary outcomes (e.g. survival probability of residents at a given occasion) or sets of probabilities of categorical outcomes, i.e. probability simplexes summing up to 1 (e.g. set of probabilities of moving to each of the migratory areas conditional on departing from the residency area at a given winter occasion). Accordingly, we used uniform(0,1) distribution as the prior for any single probabilities of a binary outcome, and Dirichlet(1,...,1) as the prior for any set of probabilities of a categorical outcome. By using such priors, we remained objective regarding our general preconceptions on the values that the parameters could take.

Such priors are commonly employed, and are typically appropriate in Bayesian analyses of (multistate) capture-recapture models (see e.g. Kéry & Schaub 2012). It was also convenient to use uninformative uniform priors given the complexity of formulating priors that would properly capture the different levels of prior knowledge available on different parameters. Further, it would have been challenging to define joint distributions leading to sensible priors on compound, higher-level aspects of the biological system being modelled (e.g. the migratory fraction). Accordingly, and by using uninformative uniform priors for all parameters, we relied essentially on the information contained in the data in providing evidence regarding inferences on the posterior probability of the model parameters.

S2.2 Rationale underlying the model code

We formulated a general code (see below) that can be directly applied to data from any partially migratory population with seasonal encounters, with flexibility regarding the data structure. The key attributes are that individual capture-resighting data are collected across one residency site (as named in the code bellow) or "area" (as named in main text) and *n* migratory sites ($n \ge 1$; "areas" in main text), which gives n+2 possible observation events (i.e. n+1 events for positive resightings in each surveyed site and 1 event for absence of resighting). The study timeframe is regular, consisting of one breeding season in the beginning of each year (during which all individuals are located in the residency site) and *x* subsequent winter occasions, which gives x+1 capture-resighting occasions per year. However, resighting effort in the last year can stop before the last possible occasion of the year. All the necessary information regarding the spatiotemporal specificities of the observation design is provided as data input, together with the unique capture-recapture histories (capture-resighting and observability sequences; see Appendix S1) and corresponding individual frequencies in each possible sex assignment (i.e. female, male, or unknown).

The capture-recapture histories must agree with the observation design. From the time when the individuals enter the dataset up to the last time point, each point in the corresponding capture-recapture sequence is an observation event coded as 1, or 2, or ..., or n+2 (see e.g. in code below). Further, each point in the corresponding observability sequence is either 0 or 1 depending on whether the individual was observable or not (see Appendix S1, and code below). By convenience, these sequences are filled with 0s before the individual enters the dataset. Note that the model code is currently general enough to be fitted to datasets in which new

individuals enter at any occasion across years (although here, Isle of May shags entered the dataset only during breeding occasions). Moreover, we formulated a single code for the analyses with and without sex effects. A variable provided as data input specifies whether sex effects are included (and hence only the resighting histories of individuals of known sex are analysed) or not (and hence all resighting histories of individuals of known and unknown sex are analysed).

Whatever the dataset, the code follows the model structure presented in the main text. Nonetheless, this code can be easily tweaked to apply or remove specific constraints. For example, one could exclude the "ghost area" (i.e. unobservable migratory state) to comply with the assumption of no Markovian temporary emigration outside the observed sites. To do so, one would change the code below to specify (i) that the number of sites is equal to the number of observation events minus one (instead of the number of observation events, l. 83 in the code below), (ii) that the number of observable migratory sites is equal to the number of migratory sites (instead of the number of migratory sites plus one, l. 85 in the code below), and (iii) to remove l. 235–236 that are meant to set detection probability at zero in the penultimate state (i.e. the unobservable migratory area if there is one). One could also tweak the code to apply or remove specific dependences on parameter variation (e.g. location, time- or occasion-dependence, etc.), or even use hyper-parameters controlling distributions underlying hierarchical variations ("random effects", e.g. across individuals, sites, or time). More generally, this code has the potential to be extended for various further investigations related to partial migration dynamics.

Small "hacks" can be used so that specificities of the model structure could be added or removed by means of bespoke inclusion variables provided as data input. To do so, the modeller would use appropriate if/else statements (given the potential values of the inclusion variables) in the declaration of (transformed) parameters, following a similar logic as employed

in the code below to include or not sex-dependence in the parameters. Such "hacks" would allow the use of a single flexible code for any model structure, but at the expense of overcomplexifying the code and potentially slowering its execution for posterior sampling.

S2.4 References

Kéry, M., & Schaub, M. (2012). Bayesian population analysis using WinBUGS: a hierarchical perspective. Boston, USA: Academic Press.

Stan Development Team. (2020). Stan Modelling Language Users Guide and Reference

Manuals, Version 2.22. http://mc-stan.org

APPENDIX S3

Preliminary analysis of model capabilities

Contents:

S3.1 Checking model capability for inference (p. 1)

S3.2 Example of model performance in analysis of simulated data (p. 3)

S3.3 Stan code for simulating datasets (p. 14)

S3.4 References (p. 19)

S3.1 Checking model capability for inference

Before analysing the real dataset but with knowledge of its structure and apparent properties, we assessed the performance of our model (without sex effects) in terms of providing useful, unbiased and accurate estimates of the survival probabilities of migrants and residents, as well as movement and detection parameters.

To do so, we simulated datasets for the same number of individuals entering the dataset in each breeding season as in the real dataset (i.e. same sample sizes and initial times of individual capture-recapture histories) and the same observability sequences (see Appendix S1, S2). We simulated individual histories based on the model structure (see Stan simulation code below) using reasonable parameter values chosen given knowledge derived from previous analyses of Isle of May shags (Frederiksen, Daunt, Harris, & Wanless, 2008; Grist et al., 2014, 2017) and crude expectations derived from our broad understanding acquired during data collection and inspection (see main text; Appendix S1; and next section). We then fitted the model to the simulated datasets to draw posterior samples from which to evaluate how the model was able to estimate the parameter values used to simulate the data.

To assess whether the parameters were identifiable, and assess bias and precision, we plotted graphical summaries of the posterior distributions alongside the priors and the parameter values used to simulate data. Here, we provide the example of one simulated dataset. Other simulated datasets (e.g. with different assumptions regarding the number of individuals moving to the "ghost" area, or the occurrence of decreases in survival probability, etc.) led to similar conclusions.

All these simulations and analyses suggested that all survival probabilities were effectively identifiable, as were most other parameters. All parameter values used for the simulation were contained in their posterior probability distribution (the simulated parameter values were often close to the mean of the corresponding posterior distributions, rarely away from the 95%CI limits, and always within the 99% limits), thus indicating no major biases. Most importantly given our present objectives, survival probabilities were all estimable with high precision. However, uncertainty in the posterior of some other parameters was high, due to small sample sizes for resightings in some combinations of time and state. In particular, inferences on the probability of moving to a given migratory area (conditional on departing) and the probability of returning from a given migratory area (back to the residency area) were prone to uncertainty and seemed often weakly identifiable (i.e. with a posterior distribution looking clearly similar to the prior distribution) in our simulations.

The derived migratory fraction was well estimated with good precision, but in mid-winter time occasions (occasion 3 and 4: October and November-December) the migratory fraction was often biased up or biased down – although the estimates were not radically different from the simulated values. The biases in this compound derived quantity in mid-winter occasions are likely to be due to a lack of information in the data regarding the location of individuals and an accumulation of uncertainty among migratory sites. Nonetheless, departure and resighting probabilities were usually estimable with relatively good precision. Overall, these investigations suggest that our model is reliable and that our dataset should be sufficiently informative to tackle our main objective: the estimation of seasonal survival probabilities in migrants versus residents.

S3.2 Example of model performance in analysis of simulated data

For the present example, we drew survival probabilities of residents and migrants independently at each time step, at random from a normal distribution on the logit scale with a mean of log(0.98/(1-0.98)) and a variance of 0.1. Accordingly, these survival probabilities were drawn with small temporal deviations around the expectation of 0.98 on the natural scale (see Fig. S6, S7). Given that there are 5 time steps per year, this leads to the expectation of 0.98⁵=0.9 for the annual survival probability, which is realistic for adult shags that breed on the Isle of May under relatively good year-round conditions (see Frederiksen et al., 2008). However, for two time steps, we arbitrarily set survival to low values in order to simulate the occurrence of high mortality induced by ECEs (see Frederiksen et al 2008; main text, Appendix S1). We did so for survival probability in late winter 2012-13 and 2017-18, hence matching two periods of extreme weather that were known to have occurred in the east coast of Scotland (see main text, Appendix S1). We set survival probability at 0.55 for residents and 0.85 for migrants in late-winter 2012-13, and 0.70 for residents and 0.40 for migrants in 2017-18, hence inducing large differences between residents and migrants to simulate strong selection during these ECEs but with no a priori on consistency in the direction of such selection.

Having different survival probabilities for migrants and residents in the last time step of the data was also intended to provide the opportunity to clearly assess whether these parameters were effectively identifiable separately from resighting probability in the last time point, and from each other. In general, the final survival and detection probabilities often cannot be identified separately (due to parameter redundancy; only their product is fully identifiable), as well understood in a capture-recapture model with two states (alive/dead) and two events (resighted/not resighted) in which the two parameters (survival and resighting probability) are fully time-dependent (i.e. the Cormack-Jolly-Seber model; McCrea & Morgan 2014). However, it is also known that adding structures of dependencies or covariation can make initially redundant parameters become identifiable separately (McCrea & Morgan 2014).

In the current case, our simulations indicate that our model structure provides effective identifiability of the only three parameters involved in the last time step: survival probability of residents and migrants, and detection probability in the residency area. This is likely to be because transition from six different states is formulated probabilistically by only two elementary parameters: survival of residents for the first state, and migrants for the other five states. Because surviving individuals transition to the same state ('R') for the breeding season, only one resighting probability is to be estimated. This reduces the number of unknowns, and instead of having two identifiable products (of pairs of redundant parameters: 'survival probability * resighting probability') that are independent, we have two products that both involve the same resighting probability. As a consequence, there is apparent effective identifiability (and indeed, posterior distributions of the parameters clearly peak off the uniform[0,1] prior), although it might be a specific numerical case. Finally, exploratory analyses of a more complex model that included additional terminal occasions showed that estimated survival probabilities of residents and migrants for 2017-2018 are correct as reported and interpreted in the main text.

Other parameter values were chosen using the same kind of procedure as for survival probabilities (i.e. drawn at random from a distribution with reasonable expectation and temporal deviations around it; but see values in Fig. S9 to S19). Detection probability in the residency area was drawn to be always very high during the breeding season, and relatively high but quite variable during the winter occasions. Detection probabilities in the migratory areas were drawn so that it was always low in the first migratory site (mimicking the area grouping together all

opportunistic resighting locations that were not regularly surveyed), and usually moderate but quite variable in the other migratory areas (mimicking the areas that were regularly surveyed). The probability of departing from the residency area was drawn to be quite variable among years, but with a relatively high (0.5) expectation just after the breeding season, a moderate expectation just after September (0.35), and a low expectation in mid-winter and late-winter (0.15). The probability of moving to a given migratory area (conditional on departure) was drawn to be the highest for the "ghost" area (around 0.5), and hence from very low to relatively low for the other areas. The probability of returning (to the residency area) was drawn to be very low just after September, relatively low in mid-winter, and moderate to relatively high in late-winter. The probability of switching to another migratory site (conditional on not returning) was set to 0.03.

Once the data were simulated, sampling of the posterior was performed using 10 MCMC chains with 1000 warmup iterations and then 1000 monitored iteration for sampling, yielding 10,000 iterations in the end. There was no indication of issues regarding the reliability of the inference algorithm (in particular, no indication of divergent numerical trajectories). The Gelman-Rubin-Brooks \hat{R} statistics indicated good convergence of the Markov chains, with all \hat{R} <1.01 (Brooks & Gelman 1998). Effective sample sizes were all >2000, and MCMC standard errors were all <5% of the standard deviation of the corresponding posterior sample, indicating that the uncertainty associated with the Monte Carlo approximation (due to the imperfection of the pseudorandom sampling procedure) was negligible.

Hereafter, we present graphics of most parameters: we plotted the parameter values used for data simulation alongside their prior distributions in the model, and their posterior distributions obtained from the analysis of the simulated data (Fig. S6 to S20).


Figure S6. Estimation of seasonal survival probability of residents from simulated data. Survival time steps span consecutive time points (departure time point is indicated by the corresponding annual occasion, numbered 1-5 on the top row). The prior distribution is in grey (same prior for all parameters on this graph) and the posterior distribution is in black: the central dot indicates the mean, the inner segment is the 95% interval and the outer segment is the 99.9% interval. Red dots indicate the values used to simulate the dataset being analysed



Figure S7. Estimation of seasonal survival probability of migrants from simulated data. See legend of Fig. S6 for further specifications. Note that all the individuals are located in the residency area during the breeding season (occasion 1 in each year), hence there is no survival probability of migrants for time steps starting at occasion 1.



Figure S8. Estimation of annual survival probability of (a) full-winter residents and (b) fullwinter migrants (derived from seasonal survival probabilities) from simulated data. See legend of Fig. S6 for further specifications on plotted values.



Figure S9. Estimation of the resighting probability in the residency area from simulated data. See legend of Fig. S6 for further specifications. Note that all the individuals present are sighted with certainty in the first time point of the study (they are all entering the dataset, in the residency site), accordingly there is no resighting probability at this occasion.



Figure S10. Estimation of the resighting probability in migratory area 1 from simulated data. See legend of Fig. S6 for further specifications. Note that all the individuals are in residency area during the breeding season (occasion 1), accordingly there is no resighting probability in any migratory area at this occasion.



Figure S11. Estimation of the resighting probability in migratory area 4 from simulated data. See legend of Fig. S6 for further specifications. Note that all the individuals are in residency area during the breeding season (occasion 1), accordingly there is no resighting probability in any migratory area at this occasion. Graphical summaries for the estimation for migratory area 2 and 3 are not shown, but the general pattern is the same (although with different simulated values).



Figure S12. Estimation of the probability of departing from the residency area from simulated data. See legend of Fig. S6 for further specifications. Note that all residents are constrained to stay in the residency area from late winter (occasion 5) to the breeding season (occasion 1), accordingly there is no estimated departing probability at this time step (i.e. it is constrained to be 0).



Figure S13. Estimation of the probability of moving to migratory area 1 (conditional on departure from the residency area) from simulated data. See legend of Fig. S6 for further specifications. Note that all residents are constrained to stay in the residency area from late winter (occasion 5) to the next breeding season (occasion 1), accordingly there is no probability of moving to any migratory area at this time step.



Figure S14. Estimation of the probability of moving to migratory area 2 (conditional on departure from the residency area) from simulated data. See legend of Fig. S6 for further specifications. Note that all residents are constrained to stay in the residency area from late winter (occasion 5) to the next breeding season (occasion 1), accordingly there is no probability of moving to any migratory area at this time step. Graphical summaries for the estimation for migratory area 3 and 4 are not shown, but the general pattern is the same (although with different simulated values).



Figure S15. Estimation of the probability of moving to migratory area 5 – the "ghost" area, corresponding to an unobservable state – (conditional on departure from the residency area) from simulated data. See legend of Fig. S6 for further specifications. Note that all residents are constrained to stay in the residency area from late winter (occasion 5) to the next breeding season (occasion 1), accordingly there is no probability of moving to any migratory area at this time step.



Figure S16. Estimation of the probability of returning to the residency area from migratory area 1 from simulated data. See legend of Fig. S6 for further specifications. Note that all individuals are in the residency area during the breeding season (occasion 1), accordingly there is no probability of returning from any migratory area at the time step starting from occasion 1. Further, all migrants are returning to the residency area between late-winter (occasion 5) and the next breeding season, accordingly the probability of returning from any migratory area is constrained to be 1 at this time step.



Figure S17. Estimation of the probability of returning to the residency area from migratory area 3 from simulated data. See legend of Fig. S6 for further specifications. Note that all individuals are in the residency area during the breeding season (occasion 1), accordingly there is no probability of returning from any migratory area at the time step starting from occasion 1. Further, all migrants are returning to the residency area between late-winter (occasion 5) and the next breeding season, accordingly the probability of returning from any migratory area is constrained to be 1 at this time step. Graphical summaries for the estimation for migratory area 2 and 4 are not shown, but the general pattern is the same (although with different simulated values).



Figure S18. Estimation of the probability of returning to the residency area from migratory area 5 – the "ghost" area, corresponding to an unobservable state – from simulated data. See legend of Fig. S6 for further specifications. Note that all individuals are in the residency area during the breeding season (occasion 1), accordingly there is no probability of returning from

any migratory area at the time step starting from occasion 1. Further, all migrants are returning to the residency area between late-winter (occasion 5) and the next breeding season, accordingly the probability of returning from any migratory area is constrained to be 1 at this time step.



Figure S19. Estimation of the probability of switching to another migratory area (i.e. the probability of not remaining in the same migratory area, on Fig. 2b: $1 - \sigma_{ii} = 4^* \sigma_{ik}$, with $k \neq i$). See legend of Fig. S6 for further specifications. Note that this probability is set constant across time (and apply to time steps between winter occasions) in our model.



Figure S20. Estimation of the migratory fraction (derived from movement and survival parameters). See legend of Fig. S6 for further specifications. The first prior is for the migratory fraction in occasion 2, the second prior is for the migratory fraction in occasion 3 to 5. Note that all individuals are located in the residency area during the breeding season (occasion 1), accordingly the migratory fraction is constrained to be 0 in this occasion.

S3.4 References

- Brooks, S. P., & Gelman, A. (1998). General methods for monitoring convergence of iterative simulations. Journal of Computational and Graphical Statistics, 7(4), 434–455. https://doi.org/10.1080/10618600.1998.10474787
- Frederiksen, M., Daunt, F., Harris, M. P., & Wanless, S. (2008). The demographic impact of extreme events: stochastic weather drives survival and population dynamics in a long-lived seabird. Journal of Animal Ecology, 77(5), 1020–1029. <u>https://doi.org/10.1111/j.1365-</u> 2656.2008.01422.x
- Grist, H., Daunt, F., Wanless, S., Nelson, E. J., Harris, M. P., Newell, M., ... Reid, J. M.
 (2014). Site fidelity and individual variation in winter location in partially migratory
 European shags. PLOS ONE, 9(6), e98562. <u>https://doi.org/10.1371/journal.pone.0098562</u>
- Grist, H., Daunt, F., Wanless, S., Burthe, S. J., Newell, M. A., Harris, M. P., & Reid, J. M. (2017). Reproductive performance of resident and migrant males, females and pairs in a partially migratory bird. Journal of Animal Ecology, 86(5), 1010–1021.

https://doi.org/doi.org/10.1111/1365-2656.12691

McCrea, R. S., & Morgan, B. J. (2014). Analysis of capture-recapture data. London, UK: Chapman and Hall/CRC.

APPENDIX S4

Posterior predictive checks

Contents:

S4.1 Posterior predictive checks of goodness of fit (p. 1)

S4.2 Stan code for replicating data from posterior samples (p. 12)

S4.3 Assessing confidence in the inferences (p. 14)

S4.4 References (p. 16)

S4.1 Posterior predictive checks of goodness of fit

We evaluated the goodness of fit of our main models through posterior predictive checks (Gelman, Meng, & Stern, 1996; Gelman et al., 2014; and see e.g. Chambert, Rotella, & Higgs, 2014). Such checks assess the ability of the model to generate data that resemble the original data. To do so, we visually assessed the discrepancy between original observations and their posterior predictions (i.e. distributions of the replicated data generated under the model). If the model fits the data, the data should fall into the posterior predictive distribution, while a lack of fit would be indicated by a systematic discrepancy between real and replicated data (i.e. the real data point would be outside the distribution of the replicated data; Gelman et al., 2014).

We first focused on a general aspect of the data: the number of individuals in each possible observation event across time, once they entered the dataset (Fig. S21 to S26). Accordingly, in each sample of the posterior distribution (i.e. at each of the 15,000 monitored iteration of the MCMC chains), we used the parameter values to draw replicates of the capture-resighting sequence of every individual, from the time they entered the dataset. We then plotted summaries of the posterior predictive distributions of the counts for each observation event across time, alongside counts derived from the real data. For the model without sex effects, all

the real counts of the observation events were highly plausible under their posterior predictive distribution (Fig. S21 to S26), indicating a good fit. These posterior checks led to similar conclusion for the model with sex effects (graphics not shown). These checks point towards good performances of our inferences on the survival, movement and resighting probabilities. Indeed, these inferences can be used to predict individual trajectories that could lead to the cross-sectional censuses of the real observations events that happened at each occasion across the study period.



Figure S21. Real counts and posterior predictive distributions of the number of individuals observed in the residency area (read area on Fig. 1) across the study period. Diamonds (bright red) indicate the count in the real data. Circles (darkest colour) indicate the posterior predictive mean, inner (thick) line segments indicate the 50% interval of the distribution, middle line segments indicate the 95% interval, and outer (thin) line segments indicate the 99.9% interval.



Figure S22. Real counts and posterior predictive distributions of the number of individuals observed in migratory area 1 (orange points on Fig. 1) across the study period. See Fig. S21 for legend specifications.



Figure S23. Real counts and posterior predictive distributions of the number of individuals observed in migratory area 2 (brown area on Fig. 1) across the study period. See Fig. S21 for legend specifications.



Figure S24. Real counts and posterior predictive distributions of the number of individuals observed in migratory area 3 (yellow area on Fig. 1) across the study period. See Fig. S21 for legend specifications.



Figure S25. Real counts and posterior predictive distributions of the number of individuals observed in migratory area 4 (pink area on Fig. 1) across the study period. See Fig. S21 for legend specifications.



Figure S26. Real counts and posterior predictive distributions of the number of individuals that were not resigned across the study period. See Fig. S21 for legend specifications.

We then focused on finer details of the data: the number of individuals observed as residents, and migrants (whatever their migratory area), given previous (re-)sighting either as migrants or as residents in a given occasion, for every possible occasion across the study period (e.g. Fig. S27 to S35). For example, given that 723 individuals entered the data in 2009 (during occasion 1, the breeding season), we replicated 723 trajectories starting from the resident state in occasion 1 in 2009 (at each of 15,000 monitored iterations of the MCMC chains). We hence compared how many of these individuals were resighted either as residents or as migrants in every subsequent occasion in the real data with their corresponding posterior predictive distributions (Fig. S27). Then, we did the same for the 25 individuals that were resighted as migrants in occasion 2 in 2009 (Fig. S28; and replicating histories starting from the migratory state of the real observation for each of the 25 individuals. We did the same for the 60 individuals that were resighted as residents in occasion 2 in 2009 (Fig. S29), and so on given real data censuses of observed residents and migrants in all subsequent occasions (e.g. Fig. S30 to S35).

The fit was good considering resighting sequences subsequent to sighting in the residency area at each breeding season across the study period (e.g. Fig. S27, S30, S33; other possible departure occasions not shown). The fit was also good considering resighting sequences subsequent to sighting in the residency area or in a migratory area in winter occasions, up to the next breeding season in the following breeding seasons (e.g. Fig. S28-29, S31-32, S34-35; other possible departure occasions not shown). Indeed, most of the corresponding data points were comprised within the bulk of their posterior predictive distribution; they were very rarely outside the 95%CRI, and always within the 99.9%CRI. These checks therefore show the good performances of our model in replicating individual trajectories that lead to censuses of observed migrants and residents that look similar to the real data. It indicates that the model is self-consistent in predicting the population proportions of individuals that will survive, be in the residency area or a migratory area, and be resighted there, across the study period, at least when starting from a breeding season (with all individuals being in the residency area), within any given annual cycle and over years. In conclusion, our model is reliable regarding cross-sectional, population-level inferences on survival, movement, and resighting processes made at any occasion. We found only a few occasional systematic discrepancies (notably, data points outside the 95%CRI of their posterior predictive distributions) of small amplitude (always within the 99.9% limits of their posterior predictive distribution), indicating some small lack of fit, likely to be due to subtle heterogeneities (e.g. related to punctual age, or cohort differences) that are not taken into account given the current resolution of our model. Such subtle differences may be of interest for finer demographic analyses of partial migration, but were not of concern given our present objectives.

However, again considering the sequences starting from winter occasions, migrants were clearly more likely to remain migrants over years, and residents to remain residents, in the real data than in their posterior predictive distributions (e.g. Fig. S28–29, S31–32, S34–35; other possible

departure occasions not shown here). Indeed, corresponding data points were very often outside the 95%CRI and often clearly outside the 99.9%CRI. This was not of concern regarding our present objectives of cross-sectional, population-level inferences on survival probability in residents vs. migrants. Nonetheless, this indicated that our model could be improved to include individual memory regarding the previous location and hence being able to fit individual trajectories in a longitudinal fashion more adequately. Such improvements would allow to make inferences on individual migratory strategies, their degree of canalization and plasticity, and potential carry-over effects on survival. These improvements might also allow getting more precision in the survival estimates of migrants vs. residents.



Figure S27. Real counts and posterior predictive distributions across the study period of the number of individuals resighted as residents (in red) or migrants (in orange) or never resighted again (in grey), given sighting on the Isle of May during the breeding season (occasion 1) in 2009–10. Diamonds (brightest points) indicate the count in the real data, circles indicate the posterior predictive mean, inner (thick) line segments indicate the 50% interval of the distribution, middle segments indicate the 95% interval, and outer (thin) line segments indicate the 99.9% interval.



Figure S28. Real counts and posterior predictive distributions across the study period of the number of individuals resigned as residents (in red) or migrants (in orange) or never resigned again (in grey), given sighting as residents during September (occasion 2) in 2009–10. See Fig. S27 for legend specifications.



Figure S29. Real counts and posterior predictive distributions across the study period of the number of individuals resigned as residents (in red) or migrants (in orange) or never resigned again (in grey), given sighting as migrants during September (occasion 2) in 2009–10. See Fig. S27 for legend specifications.



Figure S30. Real counts and posterior predictive distributions across the study period of the number of individuals resigned as residents (in red) or migrants (in orange) or never resigned again (in grey), given sighting as on the Isle of May during the breeding season (occasion 1) in 2012–13. See Fig. S27 for legend specifications.



Figure S31. Real counts and posterior predictive distributions across the study period of the number of individuals resighted as residents (in red) or migrants (in orange) or never resighted again (in grey), given sighting as residents during October (occasion 3) in 2012–13. See Fig. S27 for legend specifications.



Figure S32. Real counts and posterior predictive distributions across the study period of the number of individuals resigned as residents (in red) or migrants (in orange) or never resigned again (in grey), given sighting as migrants during October (occasion 3) in 2012–13. See Fig. S27 for legend specifications.



Figure S33. Real counts and posterior predictive distributions across the study period of the number of individuals resighted as residents (in red) or migrants (in orange) or never resighted again (in grey), given sighting on the Isle of May during the breeding season (occasion 1) in 2016–17. See Fig. S27 for legend specifications.



Figure S34. Real counts and posterior predictive distributions across the study period of the number of individuals resigned as residents (in red) or migrants (in orange) or never resigned again (in grey), given sighting as residents during mid-winter (November-December, occasion 4) in 2016–17. See Fig. S27 for legend specifications.



Figure S35. Real counts and posterior predictive distributions across the study period of the number of individuals resigned as residents (in red) or migrants (in orange) or never resigned again (in grey), given sighting as residents during mid-winter (November-December, occasion 4) in 2016–17. See Fig. S27 for legend specifications.

S4.2 Stan code for replicating data from posterior samples

The following bits of code are intended to be included within the main model code (provided in Appendix S2), so that data will be replicated at each iteration of the Markov chains for posterior sampling. The counts of the number of individuals in each possible observation event across time, once they entered the dataset, are named "counts" or "event counts" in the code below. The finer counts of the number of individuals observed as residents, and migrants (whatever their migratory area), given previous (re-)sighting either as migrants or as residents in a given occasion, for every possible occasion across the study period, are designated here as "fates" and stored in an object named "farray" for "fates array". In the "fates array", rows indicate the time and super-state (i.e. resident or migrant) being the starting point of the focal individual resighting sequences, and columns indicate all the possible resighting times and super-states (given sighting at the aforementioned starting point) plus a last column for the individuals that are never resighted again.

generated quantities {

^{... //} keep previous blocks as in the original code (see Appendix S2)

^{... //} keep declaration of the variables as in the original code (see Appendix S2)

int farray_rep[N_osite*(N_time-N_year)+N_year-1,N_osite*(N_time-N_year)+N_year]; // replicate of the "fates array", for posterior checking int counts_rep[N_event,N_time]; // replicate of event counts at each time, for posterior checking // above: monitored, below: unmonitored

int<lower=0,upper=N state> state rep[N time]; // temporarily store replicated individual state

int<lower=0,upper=N event> crs rep[N time]; // temporarily store replicated individual observation event

simplex[N_state] ps_bis; // temporarily store state-transition probabilities given replicated state, as a simplex for use in categorical_rng()
simplex[N_event] po_bis; // temporarily store observation probabilities given replicated state, as a simplex for use in categorical_rng()
int current row; // temporarily store focal row of the "fates array" (see below)

int freqh; // temporarily store the number of individuals that have the same unique capture-resignting history in the original dataset

^{... //} keep the rest of the content of the generated quantity block as in the original code (see Appendix S2)

farray rep = rep array(0,N osite*(N time-N year)+N year-1,N osite*(N time-N year)+N year);

```
20
         counts rep = rep array(0,N event,N time);
21
         llk rep = 0;
22
23
       for (s in 1:N sex) {
24
         // replicate individual capture-recapture histories based on model parameter values in the posterior sample
25
         // and fill the observation event counts and "fates array" to summarize the replicated histories
26
         for (h in 1:N crs)
27
           for (r in F time[h]:N trans)
28
             if (crs[h,r]>0 && crs[h,r]<N event && sum(obs[h,r:N time])>0) {
29
               if (occ[r]==1)
                  current row = N osite*(r-year[r])+year[r];
30
31
               else
32
                  current row = N osite*(r-year[r]-1)+year[r]+crs[h,r];
33
                if (N sex==1)
34
                 freqh = sum(freq[h,]);
35
               else
36
                 freqh = freq[h,s];
37
                for (i in 1:freqh) {
38
                 state rep[r] = crs[h,r];
39
                 crs rep[r] = crs[h,r];
40
                 for (t in (r+1):N time) {
                   if(state rep[t-1]<N state) {</pre>
41
42
                     ps bis = ps[s,state rep[t-1],t-1];
43
                      state rep[t] = categorical rng(ps bis);
44
                   }
45
                   else
46
                      state rep[t] = N state;
47
                   if (obs[h,t]==1) {
48
                     po bis = po[s,state rep[t],t];
49
                     crs rep[t] = categorical rng(po bis);
50
                     if (crs rep[t]<N event)</pre>
51
                       if (occ[t]==1)
52
                          farray rep[current row, N osite*(t-year[t])+year[t]-1] += 1;
53
                        else
54
                          farray rep[current row, N osite*(t-year[t]-1)+year[t]-1+crs rep[t]] += 1;
55
                   }
56
                   else
57
                     crs rep[t] = N site;
58
                   if(r==F time[h])
59
                      counts rep[crs rep[t],t] += 1;
60
                 }
                 if (min(crs rep[(r+1):N time])==N site)
61
                   farray rep[current row, N osite*(N time-N year)+N year] += 1;
62
63
               }
64
             }
65
       }
66
67
     }
```

S4.3 Assessing confidence in the inferences

A crucial point of any statistical data analysis is to assess whether the inferences from the model make sense. The most straightforward way of doing so is to compare the inferences with knowledge that has not been included formally in the model (either in the priors or the likelihood). In our case, such information comes from previous analyses of annual survival in shags breeding on Isle of May that used dead recovery data from 1965–2005 and did not consider winter movements (Frederiksen, Daunt, Harris, & Wanless, 2008), from analyses of migratory movements and associated breeding success during 2010-2012 (Grist et al., 2014, 2017), and from broad understanding of our study system derived from field experience.

Regarding the survival probabilities that are of current primary interest, our estimated annual survival values under good or bad conditions are very similar to those estimated by Frederiksen et al. (2008). Further, the estimated timings of low survival matched known extreme climatic events that occurred during our study period. Furthermore, the fact that survival was lower in residents than migrants in two ECEs makes sense, given the northerly spatial distribution of migrants and the opportunity for sheltering against winter storms offered by such locations (see main text, Appendix S1). We also verified that the detection probability was very high during the breeding season, which was highly expected given the intensive effort carried on individual monitoring during the breeding season on the Isle of May (see main text, Appendix S1). Detection probability in winter in the different areas and time points also made sense given variability the resighting effort and efficiency carried out in the different areas (see main text, Appendix S1, Appendix S4). Moreover, inferences on movement parameters and resulting migratory fraction also made sense given previous analyses and field experience regarding the timings of migration (most departure in September-October, and most returns in February-March; Grist et al., 2014). This was also the

case regarding the proportion of individuals regularly resighted as residents or migrants, or never resighted during the winter and hence likely being migrants in an unobserved location modelled through the "ghost" site.

Another source of confidence in the results comes from sensitivity analyses that we performed during model development. We made a number of choices regarding model structure, that were motivated by the will to account for much of the potential spatio-temporal variation in individual histories, and by convenience for some parameters presumed to be less influential (see main text). We hence complied with our primary aim to make inferences on survival in residents vs. migrants at a fine temporal resolution while retaining as much as possible of the uncertainty associated with the movements and observation processes. Nonetheless, other plausible models could have been applied to our problem. We fitted some of these alternative models to our dataset in the course of model development, to check the answer they provided. We notably fitted an alternative model that considered only observable migratory states (i.e. no "ghost area"), we also fitted models that included location-dependent switching probabilities (conditional on not returning to the residency area), as well as models that did not included time-dependence in survival and/or movement probabilities. The most robust inferences are those that do not change radically between models. The key point that emerged is that all models that included temporal variation in survival provided very similar inferences on survival of migrants versus residents. The alternative models also provided analogous inferences regarding the migratory fraction, indicating that there was always a non-negligible part of the population located in migratory areas, typically roughly around a half. Models that did not included temporal variation in survival led to major sampling issues. The outputs (notably, bimodality in the posterior samples of survival and resighting probabilities) strongly suggested that the model could not properly fit the disappearance of many individuals

after the ECEs. All these observations were re-assuring regarding the robustness of the signal in our dataset for the main results presented and discussed in our paper.

We also applied our model and its above-mentioned alternative versions to a simplified version of the dataset in which all observed migratory areas were grouped as a single migratory area (i.e. there was only one possible observation event for migrant, with no distinction of the location). Accordingly, a single observable migratory state was considered, and no spatial heterogeneity in resighting probability was taken into account. The models fitted to this simplified dataset also provided very similar posterior probabilities for the survival probabilities of migrants and residents, and analogous inferences regarding the migratory fraction, which was again reassuring regarding the robustness of our main results.

S4.4 References

- Chambert, T., Rotella, J. J., & M. D. Higgs. (2014). Use of posterior predictive checks as an inferential tool for investigating individual heterogeneity in animal population vital rates. Ecology and Evolution, 4(8), 1389–1397. <u>https://doi.org/10.1002/ece3.993</u>
- Frederiksen, M., Daunt, F., Harris, M. P., & Wanless, S. (2008). The demographic impact of extreme events: stochastic weather drives survival and population dynamics in a long-lived seabird. Journal of Animal Ecology, 77(5), 1020–1029. <u>https://doi.org/10.1111/j.1365-2656.2008.01422.x</u>
- Gelman, A., Meng, X.-L., & Stern, H. (1996). Posterior predictive assessment of model fitness via realized discrepancies. Statistica Sinica, 6(4), 733–760.
- Gelman, A., Carlin, J. B., Stern, H. S., Dunson, D. B., Vehtari, A., & Rubin, D. B. (2014).Bayesian data analysis (3rd ed.). New York, USA: Chapman and Hall/CRC.
- Grist, H., Daunt, F., Wanless, S., Nelson, E. J., Harris, M. P., Newell, M., ... Reid, J. M. (2014).

Site fidelity and individual variation in winter location in partially migratory European shags.

PLOS ONE, 9(6), e98562. https://doi.org/10.1371/journal.pone.0098562

Grist, H., Daunt, F., Wanless, S., Burthe, S. J., Newell, M. A., Harris, M. P., & Reid, J. M.

(2017). Reproductive performance of resident and migrant males, females and pairs in a

partially migratory bird. Journal of Animal Ecology, 86(5), 1010-1021.

https://doi.org/doi.org/10.1111/1365-2656.12691

APPENDIX S5

Summary of the posterior samples

Contents:

S5.1 Foreword and sampling details (p. 1)
S5.2 Survival probabilities (p. 2)
S5.3 Resighting probabilities (p. 12)
S5.4 Movement probabilities (p. 15)
S5.5 Migratory fraction (p. 22)
S5.6 Annual-cycle path probabilities (p. 24)
S5.7 References (p. 26)

S5.1 Foreword and sampling details

Here, we present graphical summaries of the posterior samples for every parameter in our main model (without sex effects) fitted to the complete dataset, except for seasonal survival probabilities (already presented in Fig. 3 of the paper). We also present graphical summaries of annual survival probabilities for different possible paths in the annual cycle, and the migratory fraction. Further, we present numerical summaries of the differences in survival probabilities between migrants and residents. For the model including sex effects fitted to the reduced dataset consisting of capture-resighting histories of sexed individuals, we present graphical summaries of the posterior samples for seasonal survival probabilities and the migratory fraction. We also present numerical summaries of the sex bias in survival of residents and migrants, and the resident-migrant survival difference, and the migratory fraction.

Detailed numerical summaries of the posterior samples for all parameters and derived quantities of the two models, and complete corresponding posterior samples, are archived as Rdata files with the dataset (Acker et al. 2020; <u>https://doi.org/10.5061/dryad.c2fqz616r</u>).

Sampling of the posterior distribution was performed using 10 Markov chains with 1000 warmup iterations followed by 1500 monitored iteration (with no thinning), yielding 15,000 samples in total. There was no indication of issues regarding the reliability of the inference algorithm (in particular, no divergent numerical trajectories). The Gelman-Rubin-Brooks *r*-hat statistics (Brooks & Gelman 1998) indicated good convergence of the chains, with all *r*-hat <1.01. Effective sample sizes were all >1500 (and much larger for most parameters, including survival probabilities), and Monte Carlo standard errors were all <5% of the standard deviation of the corresponding posterior sample (and much lower for most parameters, including survival probabilities). This indicates that uncertainty of estimates due to imperfect (pseudorandom) sampling is negligible. Precision of the sampling is sufficiently high so that all posterior means can be reported with 2 decimal place precision (and most of them could be reported with ≥ 3 decimal place precision). See Lunn, Jackson, Best, Thomas, and Spiegelhalter (2012) and Gelman et al. (2014) for further on MCMC methods for posterior sampling (and more generally on Bayesian data analysis).

S5.2 Survival probabilities

Seasonal survival in the model without sex effects

In the main text, we provided graphical summaries for seasonal survival probabilities in residents and migrants (Fig. 3). Hereafter, we provide numerical summaries of the difference in seasonal survival probability between residents and migrants (Table S4). This difference was calculated as "migrant survival probability minus resident survival probability" in each posterior sample (i.e. each iteration of the Markov chains).

Year	Occ.	Mean	SD	2.5%	97.5%	Pr(∆>0)
2009–10	2	0.00	0.02	-0.04	0.04	0.38
	3	0.00	0.02	-0.04	0.04	0.49
	4	0.00	0.01	-0.03	0.03	0.55
	5	-0.01	0.02	-0.06	0.02	0.21
2010-11	2	-0.01	0.02	-0.05	0.03	0.35
	3	0.00	0.01	-0.03	0.03	0.59
	4	-0.01	0.02	-0.05	0.02	0.26
	5	0.01	0.02	-0.03	0.04	0.78
2011-12	2	0.00	0.03	-0.06	0.05	0.46
	3	-0.01	0.02	-0.06	0.03	0.27
	4	0.01	0.02	-0.03	0.04	0.66
	5	-0.01	0.02	-0.05	0.02	0.42
2012-13	2	-0.04	0.04	-0.13	0.04	0.16
	3	0.00	0.04	-0.07	0.08	0.52
	4	0.02	0.07	-0.11	0.16	0.65
	5	0.31	0.05	0.20	0.41	1.00
2013-14	2	0.00	0.03	-0.07	0.05	0.47
	3	-0.03	0.03	-0.09	0.03	0.18
	4	0.00	0.03	-0.06	0.06	0.51
	5	-0.03	0.04	-0.11	0.04	0.20
2014-15	2	-0.02	0.02	-0.07	0.01	0.14
	3	0.01	0.02	-0.03	0.04	0.69
	4	0.00	0.02	-0.05	0.04	0.49
	5	-0.01	0.02	-0.06	0.03	0.34
2015-16	2	-0.02	0.02	-0.06	0.01	0.17
	3	0.01	0.02	-0.02	0.04	0.69
	4	0.05	0.02	0.01	0.09	0.99
	5	-0.01	0.02	-0.06	0.03	0.36
2016-17	2	0.00	0.03	-0.07	0.04	0.46
	3	0.05	0.03	-0.01	0.11	0.94
	4	0.00	0.02	-0.04	0.04	0.46
	5	0.00	0.02	-0.06	0.04	0.52
2017-18	2	-0.05	0.03	-0.12	0.00	0.04
	3	0.02	0.03	-0.04	0.07	0.80
	4	0.00	0.03	-0.07	0.06	0.48
	5	0.26	0.04	0.17	0.33	1.00

Table S4. Posterior summary of the difference in seasonal survival probability between

 residents and migrants ("migrant minus resident survival probability").

Notes: 'Occ.' is the departure occasion of the time step considered, 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (i.e. the 2.5% and 97.5% quantiles of the distribution), ' $Pr(\Delta>0)$ ' is the posterior probability that the focal difference is positive. ECEs are in bold, and non-ECE episodes with strong support for a given sign difference are in italics. Note that comparison of the estimates between occasions should account for differences in the length of interval between occasions, and of occasions themselves.

We assessed the support of the difference through the posterior probability that it was positive, calculated as the proportion of posterior samples in which the difference was positive.

Note that we arbitrarily chose to focus on the probability that it was positive, but it is the complement of the probability that it was negative (and the probability that the reverse difference was negative). This choice thus does not matter in itself, but it is necessary to remain consistent across calculations in the way the difference is formulated and which sign (positive or negative) is used to assess its support.

Annual survival in the model without sex effects

In Fig. 4 of main text, we provided graphical summaries of annual survival probabilities for full-winter migration and residence. Here, we provide numerical summaries of the difference in annual survival probability between full-winter migration and residence (Table S5).

Table S5. Posterior summary of the difference in (derived) annual survival probability between full-winter residence and full-winter migration (calculated as "migrant survival probability minus resident survival probability").

Year	Mean	SD	2.5%	97.5%	Pr(Δ>0)
2009–10	-0.02	0.03	-0.08	0.05	0.28
2010-11	-0.01	0.03	-0.07	0.05	0.41
2011-12	-0.02	0.04	-0.09	0.06	0.35
2012-13	0.21	0.04	0.12	0.29	1.00
2013-14	-0.06	0.05	-0.15	0.04	0.12
2014-15	-0.02	0.03	-0.08	0.04	0.25
2015-16	0.03	0.03	-0.03	0.09	0.84
2016-17	0.04	0.04	-0.05	0.12	0.79
2017-18	0.21	0.05	0.11	0.30	1.00

Note: 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (2.5% and 97.5% quantiles of the distribution), ' $Pr(\Delta>0)$ ' is the posterior probability that the focal difference is positive. ECE years are in bold.

In addition, we provide graphical summaries for annual survival probabilities of two other possible paths through the annual cycle (Fig. 2a), to illustrate the importance of migration timings (Fig. S36): "late-winter departure" (i.e. remain resident up to occasion 4 and then be migrant in occasion 5, circannual phenotypic sequence 'R-R-R-M'), and "late-winter return"

(i.e. leaving the residency area by occasion 1 but returning by occasion 5, circannual phenotypic sequence 'R-M-M-M-R'). We also included full-winter migration and full-winter residence in this latter graph (Fig. S36). On this graph, it clearly appears that late-winter location which is driving the major differences in annual survival between the different paths, that resulted from the severe late-winter ECEs in 2012-13 and 2017-18.



Figure S36. Annual survival probabilities of adult shags that bred on the Isle of May, derived for full-winter residence (i.e. annual path from occasion 1 to occasion 5 is RRRRR with 'R' for 'resident'; red squares), full-winter migration (i.e. annual path RMMMM with 'M' for 'migrant'; orange circles), late-winter return (i.e. annual path RMMMR; pink triangles) and late-winter migration (i.e. annual path RRRRM; brown diamonds). Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals.

Indeed, annual survival probability for late-winter departure was similar to that for fullwinter migration (Δ : 0.03 [-0.05,0.11] in 2012-13 and 0.01 [-0.09,0.10] in 2017-18, Pr(Δ >0): 0.55 and 0.74 respectively) and clearly higher than for full-winter residence (Δ : 0.21 [0.14,0.30] in 2012-13 and 0.23 [0.15,0.30] in 2017-2018, Pr(Δ >0): 1.00 for both). In contrast, annual survival probability for late-winter return was clearly lower than for full-winter migration (Δ : -0.21 [-0.27,-0.14] in 2012-13 and -0.23 [-0.29,-0.15] in 2017-18, Pr(Δ >0): 0.00 for both) and similar to that for full-winter residence (Δ : 0.00 [-0.06,0.06] in 2012-13 and -0.02

[-0.08,0.04] in 2017-2018, $Pr(\Delta>0)$: 0.45 and 0.26 respectively). Accordingly, annual survival probability was clearly higher for late-winter departure than for late-winter return (Δ : 0.21 [0.09,0.35] in 2012-13 and 0.25 [0.14,0.36] in 2017-2018, $Pr(\Delta>0)$: 1.00 for both).

These results can be extended to a comparison of all 16 possible paths through the annual cycle of partial migration (Fig. 2a). This shows that the location in late winter (occasion 5) drives the annual survival differences between the different paths in 2012-13 and 2017-18 (Figure S37). In other years, there is no clear evidence for such differences, or the differences are relatively small (Figure S37; and see summaries provided in Electronic Supplementary Material and posterior samples archived with the data for further numerical details). Note that details of the probabilities of realizing each of the 16 possible paths, or dying before late winter, are in Appendix S5.6.



Figure S37. Annual survival probabilities of adult shags that bred on the Isle of May, derived for all 16 possible paths through the annual cycle (Fig. 2a). The 8 annual paths that end by the phenotype 'R' (i.e. resident in late winter, occasion 5) are in red, the 8 paths that end by the phenotype 'M' (i.e. migrant in late winter, occasion 5) are in orange. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals.

Seasonal survival in the model with sex effects

In the main text, we provided graphical summaries for sex-dependent seasonal survival probabilities in residents and migrants but only in ECE years (Fig. 5). Here, we provide the complete graphical summary for all years (Fig. S37). Further, we provide numerical summaries of the sex bias in seasonal survival probability in residents and migrants (i.e. 'female minus male survival difference'; Table S6, S7), and in the difference in survival between residents and migrants (i.e. 'migrant-resident male survival difference' minus 'migrant-resident female survival difference'). We also provide similar summaries of sex biases in annual survival probability for full-winter residence and migration (Table S8, S9; see Fig. 5 for graphics).



Figure S38. Migration- and sex-dependent seasonal survival probabilities of adult shags that bred on the Isle of May. Point estimates are posterior means (female residents: red down-triangles, male residents: red squares, female migrants: orange up-triangles, male migrants: orange circles), inner and outer line segments indicate 50% and 95% credible intervals. Survival time steps span consecutive time points (departure time point is indicated by the corresponding annual occasion, numbered 1-5 on the top row). In the breeding season, all surviving individuals are in the residency area, hence there is no migrant survival probability following annual occasion 1.

Table S6. Posterior summary of the sex bias in seasonal survival probability ("female minusmale survival probability"), in resident and migrant adult shags that bred on the Isle of May.

Year	Occ.	Residents			Migrants						
		Mean	SD	2.5%	97.5%	$Pr(\Delta > 0)$	Mean	SD	2.5%	97.5%	Pr(∆>0)
2009–10	1	0.01	0.02	-0.02	0.04	0.68					
	2	0.00	0.04	-0.09	0.07	0.46	0.00	0.02	-0.04	0.05	0.57
	3	0.00	0.02	-0.05	0.05	0.54	0.00	0.03	-0.07	0.05	0.50
	4	0.00	0.02	-0.04	0.05	0.61	-0.01	0.03	-0.08	0.04	0.45
	5	0.01	0.02	-0.02	0.04	0.64	-0.05	0.06	-0.21	0.03	0.14
2010-11	1	-0.01	0.01	-0.04	0.02	0.32					
	2	0.00	0.02	-0.05	0.04	0.50	0.00	0.02	-0.05	0.05	0.51
	3	0.00	0.02	-0.04	0.04	0.49	0.00	0.02	-0.05	0.03	0.42
	4	0.00	0.02	-0.04	0.03	0.41	0.00	0.03	-0.05	0.05	0.52
	5	0.01	0.02	-0.03	0.04	0.68	-0.01	0.03	-0.08	0.04	0.37
2011-12	1	0.00	0.01	-0.04	0.02	0.37					
	2	-0.01	0.03	-0.08	0.04	0.38	0.00	0.04	-0.07	0.09	0.48
	3	-0.01	0.02	-0.07	0.03	0.34	0.02	0.03	-0.04	0.10	0.74
	4	-0.02	0.02	-0.07	0.03	0.24	0.01	0.02	-0.04	0.06	0.61
	5	-0.01	0.02	-0.05	0.02	0.26	0.02	0.03	-0.03	0.09	0.80
2012–13	1	0.00	0.03	-0.06	0.05	0.45					
	2	0.00	0.05	-0.10	0.09	0.48	-0.05	0.06	-0.16	0.07	0.20
	3	0.00	0.05	-0.11	0.09	0.49	-0.04	0.06	-0.16	0.06	0.22
	4	-0.06	0.11	-0.28	0.15	0.29	0.10	0.08	-0.06	0.24	0.90
	5	-0.14	0.06	-0.27	-0.01	0.01	-0.28	0.07	-0.41	-0.14	0.00
2013–14	1	0.00	0.03	-0.05	0.05	0.49		~ ~ -		• • -	
	2	-0.07	0.04	-0.15	0.00	0.02	-0.02	0.05	-0.12	0.07	0.32
	3	-0.02	0.03	-0.10	0.04	0.31	-0.03	0.05	-0.13	0.05	0.26
	4	-0.09	0.05	-0.19	0.00	0.03	-0.05	0.05	-0.16	0.03	0.12
		0.00	0.05	-0.10	0.09	0.49	-0.02	0.06	-0.14	0.09	0.39
2014–15	1	0.01	0.01	-0.02	0.04	0.66	0.02	0.02	0.02	0.11	0.77
	2	0.00	0.01	-0.03	0.03	0.55	0.03	0.03	-0.03	0.11	0.77
	3	0.00	0.02	-0.05	0.04	0.45	0.00	0.02	-0.05	0.05	0.46
	4	0.01	0.02	-0.03	0.00	0.72	0.01	0.03	-0.05	0.07	0.6/
2015 16	<u></u>	-0.01	0.02	-0.03	0.02	0.20	0.02	0.04	-0.05	0.10	0.74
2015-16	1	0.00	0.01	-0.02	0.03	0.62	0.00	0.02	0.05	0.06	0.47
	2	0.00	0.01	-0.03	0.05	0.40	0.00	0.03	-0.03	0.00	0.47
	3	0.00	0.02	-0.04	0.05	0.04	0.00	0.02	-0.04	0.04	0.31
	4	0.07	0.03	-0.04	0.15	0.98	-0.01	0.03	-0.00	0.04	0.38
2016 17		0.01	0.03	0.03	0.07	0.00	0.05	0.04	-0.03	0.10	0.78
2010-17	2	0.00	0.02	-0.05	0.05	0.55	0.01	0.05	-0.07	0.13	0.57
	2	-0.03	0.02	-0.03	0.05	0.33	0.01	0.05	-0.07	0.15	0.57
		0.05	0.03	-0.05	0.05	0.58	0.00	0.02	-0.04	0.05	0.50
	+ 5	-0.01	0.03	-0.05	0.00	0.30	0.01	0.05	-0.04	0.15	0.00
2017 18	<u></u>	0.01	0.02	-0.04	0.02	0.38	0.05	0.04	-0.02	0.15	0.71
201/-10	2	0.01	0.02	-0.02	0.02	0.73	0.03	0.05	-0.06	0.13	0 72
	2	-0.02	0.02	-0.02	0.05	0.75	0.05	0.05	-0.00	0.15	0.72
	4	0.01	0.04	-0.07	0.09	0.60	-0.02	0.05	-0.12	0.12	0.31
	5	-0.08	0.07	-0.22	0.07	0.15	0.02	0.06	-0.10	0.15	0.61

Notes: 'Occ.' is the departure occasion of the time step considered, 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (i.e. the 2.5% and 97.5% quantiles of the distribution), 'Pr(Δ >0)' is the posterior probability that the focal difference is positive. In the breeding season, all surviving individuals are in the residency area, hence there is no migrant survival probability following annual occasion 1 (and thus no sex difference in this occasion in migrants). ECEs are in bold.

Table S7. Posterior summary of the sex bias in the seasonal survival difference between resident and migrant shags that bred on the Isle of May (i.e. 'migrant-resident male survival difference' minus 'migrant-resident female survival difference'), providing estimates of sexspecific selection.

Year	Occ.	Mean	SD	2.5%	97.5%	$Pr(\Delta_{\Delta} > 0)$
2009–10	2	-0.01	0.04	-0.10	0.08	0.43
	3	0.00	0.04	-0.07	0.09	0.53
	4	0.01	0.04	-0.06	0.10	0.61
	5	0.06	0.06	-0.03	0.22	0.86
2010-11	2	0.00	0.03	-0.07	0.07	0.50
	3	0.00	0.03	-0.05	0.06	0.56
	4	0.00	0.03	-0.06	0.06	0.43
	5	0.02	0.03	-0.04	0.09	0.71
2011-12	2	-0.01	0.05	-0.12	0.08	0.42
	3	-0.03	0.04	-0.12	0.04	0.22
	4	-0.02	0.03	-0.10	0.04	0.25
	5	-0.03	0.03	-0.11	0.03	0.16
2012-13	2	0.04	0.07	-0.10	0.18	0.73
	3	0.04	0.07	-0.10	0.19	0.71
	4	-0.16	0.13	-0.41	0.09	0.10
	5	0.13	0.09	-0.05	0.32	0.92
2013-14	2	-0.05	0.06	-0.17	0.07	0.19
	3	0.01	0.06	-0.10	0.13	0.58
	4	-0.03	0.07	-0.16	0.10	0.31
	5	0.02	0.08	-0.14	0.17	0.58
2014–15	2	-0.02	0.04	-0.11	0.04	0.26
	3	0.00	0.03	-0.07	0.06	0.48
	4	0.00	0.04	-0.08	0.08	0.50
	5	-0.03	0.04	-0.12	0.05	0.20
2015-16	2	0.00	0.03	-0.06	0.06	0.51
	3	0.00	0.03	-0.06	0.06	0.52
	4	0.07	0.04	0.00	0.16	0.97
	5	-0.02	0.05	-0.10	0.07	0.36
2016-17	2	-0.01	0.05	-0.13	0.09	0.46
	3	-0.03	0.05	-0.15	0.06	0.25
	4	-0.01	0.04	-0.09	0.07	0.42
	5	-0.07	0.05	-0.17	0.03	0.08
2017-18	2	-0.02	0.05	-0.13	0.09	0.39
	3	-0.04	0.06	-0.16	0.06	0.22
	4	0.03	0.06	-0.08	0.15	0.71
	5	-0.09	0.08	-0.26	0.07	0.13

Notes: 'Occ.' is the departure occasion of the time step considered, 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (i.e. the 2.5% and 97.5% quantiles of the distribution), ' $Pr(\Delta_{\Delta}>0)$ ' is the posterior probability that the focal difference is positive. ECEs are in bold
Year	Full-winter residence				Full-winter migration					
	Mean	SD	2.5%	97.5%	Pr(Δ>0)	Mean	SD	2.5%	97.5%	Pr(∆>0)
2009-10	0.01	0.05	-0.09	0.10	0.64	-0.05	0.07	-0.22	0.06	0.27
2010-11	0.00	0.03	-0.07	0.06	0.46	-0.02	0.04	-0.10	0.05	0.29
2011-12	-0.05	0.04	-0.13	0.02	0.08	0.04	0.05	-0.06	0.16	0.79
2012-13	-0.13	0.05	-0.23	-0.04	0.00	-0.19	0.05	-0.30	-0.08	0.00
2013-14	-0.14	0.06	-0.27	-0.02	0.01	-0.10	0.05	-0.20	0.01	0.03
2014-15	0.00	0.03	-0.06	0.07	0.55	0.06	0.05	-0.03	0.15	0.90
2015-16	0.08	0.04	0.00	0.15	0.98	0.02	0.04	-0.06	0.11	0.70
2016-17	-0.03	0.05	-0.13	0.05	0.23	0.07	0.06	-0.04	0.20	0.89
2017-18	-0.07	0.07	-0.21	0.06	0.15	0.03	0.08	-0.11	0.18	0.67

Table S8. Posterior summary of the sex bias in (derived) annual survival probability of shags that bred on the Isle of May (expressed as "female minus male survival probability"), for full-winter residence and full-winter migration.

Notes: 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (i.e. the 2.5% and 97.5% quantiles of the distribution), ' $Pr(\Delta>0)$ ' is the posterior probability that the focal difference is positive. ECE years are in bold.

Table S9. Posterior summary of the sex bias in the (derived) annual survival difference between full-winter residence and full-winter migration (i.e. 'migrant-resident male survival difference' minus 'migrant-resident female survival difference'), providing evidence of sex-specific selection.

Year	Mean	SD	2.5%	97.5%	$Pr(\Delta_{\Delta} > 0)$
2009–10	0.06	0.09	-0.10	0.26	0.74
2010-11	0.02	0.06	-0.09	0.13	0.62
2011-12	-0.09	0.07	-0.24	0.05	0.10
2012-13	0.06	0.08	-0.10	0.22	0.76
2013-14	-0.05	0.09	-0.23	0.14	0.31
2014-15	-0.05	0.06	-0.18	0.07	0.19
2015-16	0.05	0.06	-0.07	0.18	0.81
2016-17	-0.11	0.09	-0.28	0.06	0.10
2017-18	-0.11	0.09	-0.29	0.08	0.13

Notes: 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (i.e. the 2.5% and 97.5% quantiles of the distribution), ' $Pr(\Delta > 0)$ ' is the posterior probability that the focal difference is positive. ECE years are in bold.

S5.3 Resighting probabilities

Here we provide graphical summaries of the posterior distribution of the resighting probability in the residency area (Fig. S38) and in the migratory areas (Fig. S39 to S42), from the model without sex effects.



Figure S39. Resighting probability in the residency area of shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. The annual occasion, numbered 1-5, is indicated on the top row. In the first time point (occasion 1, year 1), all present individuals are entering the dataset and hence sighted with certainty. Therefore there is no resighting probability at occasion 1, year 1.



Figure S40. Resighting probability in migratory area 1 (orange points on Fig. 1), of shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. During the breeding season, all individuals are in the residency area, therefore there is no detection probability in any migratory area at

occasion 1.



Figure S41. Resighting probability in migratory area 2 (brown area on Fig. 1), of shags that bred on the Isle of May. See Fig. S39 for legend specifications.



Figure S42. Resighting probability in migratory area 2 (yellow area on Fig. 1), of shags that bred on the Isle of May. See Fig. S39 for legend specifications.



Figure S43. Resighting probability in migratory area 2 (pink area on Fig. 1), of shags that bred on the Isle of May. See Fig. S39 for legend specifications.

S5.4 Movement probabilities

Here we provide graphical summaries of the posterior distribution of the probability of departing from the residency area (Fig. S43), the probability of moving in each migratory area (conditional on departure; Fig. S44 to S48), the probability of returning from each migratory area (Fig. S49 to S53), and the probability to switch to another migratory area (conditional on not returning; Fig. S54), from the model without sex effects.



Figure S44. Probability of departing from the residency area, in shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. All residents stay in the residency area from late winter (occasion 5) to the breeding season (occasion 1), thus departing probability is constrained to 0 at this time step.



Figure S45. Probability of moving to migratory area 1 (oranges points on Fig. 1), conditional on departure, in shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. All residents stay in the residency area from late winter (occasion 5) to the breeding season (occasion 1), thus there is no probability of moving to any migratory area at this time step.



Figure S46. Probability of moving to migratory area 2 (brown on Fig. 1), conditional on departure, in shags that bred on the Isle of May. See further legend specifications in Fig. S44.



Figure S47. Probability of moving to migratory area 3 (yellow on Fig. 1), conditional on departure, in shags that bred on the Isle of May. See further legend specifications in Fig. S44.



Figure S48. Probability of moving to migratory area 4 (pink on Fig. 1), conditional on departure, in shags that bred on the Isle of May. See further legend specifications in Fig. S44.



Figure S49. Probability of moving to migratory area 5 (i.e. the "ghost" area, corresponding to the unobservable migratory state), conditional on departure, in shags that bred on the Isle of May. See further legend specifications in Fig. S44.



Figure S50. Probability of returning to the residency area from migratory area 1 (orange points on Fig. 1), in shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. All individuals are in the residency area during the breeding season (occasion 1), accordingly there is no probability of returning from any migratory area at the time step starting from occasion 1. Further, all migrants are returning to the residency area between late-winter (occasion 5) and the next breeding season, accordingly the probability of returning from any migratory area is constrained to be 1 at this time step.



Figure S51. Probability of returning to the residency area from migratory area 2 (brown on Fig. 1), in shags that bred on the Isle of May. See Fig. S49 for further legend specifications.



Figure S52. Probability of returning to the residency area from migratory area 3 (yellow on Fig. 1), in shags that bred on the Isle of May. See Fig. S49 for further legend specifications.



Figure S53. Probability of returning to the residency area from migratory area 4 (pink on Fig. 1), in shags that bred on the Isle of May. See Fig. S49 for further legend specifications.



Figure S54. Probability of returning to the residency area from migratory area 5 (i.e. the "ghost" area, corresponding to the unobservable migratory state), in shags that bred on the Isle of May. See Fig. S49 for further legend specifications.



Figure S55. Probability of switching to another migratory area (i.e. the probability of not remaining in the same migratory area, on Fig. 2b: $1-\sigma_{ii}=4^*\sigma_{ik}$, with $k\neq i$), in shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. This probability was set constant across time (and apply to time steps between winter occasions) in our model.

S5.5 Migratory fraction

Here we provide graphical summaries of the migratory fraction, from the model without sex effects (Fig. S55). We also provide such graphical summaries from the model including sex effects (Fig. S56), as well as numerical summaries of sex differences in the migratory fraction (Table S10).



Figure S56. Migratory fraction of shags that bred on the Isle of May. Point estimates are posterior means, inner and outer line segments indicate 50% and 95% credible intervals. The annual occasion, numbered 1-5, is indicated on the top row. In the breeding season, all individuals are in the residency area, thus the migratory fraction is constrained to be 0.



Figure S57. Sex-dependent migratory fraction of shags that bred on the Isle of May. Point estimates are posterior means (female: brown triangles, males :orange circles), inner and outer line segments indicate 50% and 95% credible intervals. The annual occasion, numbered 1-5, is indicated on the top row). In the breeding season, all individuals are in the residency area, hence the migratory fraction is constrained to be 0.

Table S10.	Posterio	r summary	of the se	x bias	in the	migratory	fraction	of shags	that	bred	on
the Isle of N	May (i.e. '	female mi	nus male	migrat	ory fra	action').					

Year	Occ.	Mean	SD	2.5%	97.5%	Pr(∆>0)
2009–10	2	0.04	0.16	-0.29	0.33	0.63
	3	-0.07	0.19	-0.49	0.25	0.41
	4	-0.09	0.20	-0.47	0.27	0.37
	5	-0.18	0.19	-0.49	0.24	0.17
2010-11	2	0.06	0.14	-0.21	0.32	0.66
	3	-0.01	0.08	-0.17	0.15	0.47
	4	-0.02	0.08	-0.19	0.15	0.42
	5	-0.07	0.08	-0.24	0.09	0.17
2011-12	2	0.33	0.19	0.03	0.67	0.99
	3	0.19	0.15	-0.15	0.47	0.89
	4	0.06	0.14	-0.22	0.31	0.66
	5	0.03	0.12	-0.22	0.26	0.61
2012-13	2	0.21	0.09	0.03	0.37	0.99
	3	0.00	0.06	-0.12	0.13	0.52
	4	-0.08	0.06	-0.19	0.05	0.11
	5	-0.01	0.09	-0.17	0.16	0.44
2013-14	2	0.09	0.06	-0.03	0.20	0.93
	3	0.07	0.06	-0.05	0.19	0.88
	4	0.06	0.07	-0.07	0.20	0.83
	5	-0.05	0.08	-0.22	0.11	0.27
2014–15	2	0.19	0.10	-0.02	0.36	0.96
	3	0.11	0.07	-0.04	0.24	0.93
	4	-0.08	0.08	-0.24	0.06	0.12
	5	-0.07	0.08	-0.24	0.09	0.19
2015–16	2	0.09	0.08	-0.08	0.24	0.87
	3	-0.01	0.07	-0.14	0.14	0.45
	4	-0.01	0.06	-0.14	0.10	0.41
	5	-0.09	0.10	-0.30	0.09	0.19
2016–17	2	0.22	0.11	0.07	0.48	1.00
	3	0.03	0.16	-0.30	0.34	0.56
	4	-0.07	0.14	-0.35	0.21	0.30
	5	0.07	0.11	-0.15	0.29	0.72
2017-18	2	0.10	0.06	-0.02	0.21	0.94
	3	0.04	0.05	-0.06	0.12	0.79
	4	0.04	0.06	-0.07	0.14	0.75
	5	0.01	0.07	-0.14	0.13	0.57

Notes: 'Occ.' is the annual occasion, 'SD' is the standard deviation of the posterior distribution, '2.5%' and '97.5%' are the limits of the 95% credible interval (i.e. the 2.5% and 97.5% quantiles of the distribution), ' $Pr(\Delta > 0)$ ' is the posterior probability that the focal difference is positive.

S5.6 Annual-cycle path probabilities

Here we provide numerical summaries of the probabilities of realizing each of the different possible annual paths through the partial migration cycle (Fig. 2a) from occasion 1 (breeding season) to occasion 5 (i.e. the last occasion, late winter), or dying at some point before occasion

5, depending on being alive in occasion 1 of the focal year (Table S11). These derived probabilities were calculated in each posterior sample of the state-process probabilities.

Table S11. Posterior summaries of the annual-cycle path probabilities, i.e. the probabilities of winter fates in a given year depending on being alive in the occasion 1 of that year (derived from the main model without sex effects). Summaries across years are provided for each possible path through the partial-migration cycle, i.e. each possible annual sequence of phenotypes: migrant ('M') or resident ('R') ('R-X₂-X₃-X₄-X₅', where 'X_o' in occasion *o* is either 'R' or 'M'). Summary across years is also provided for all individual fates that led to death ('D') by occasion 5 ('R-X₂-X₃-X₄-D', where 'X_o' is either 'R', 'M', or 'D'), collapsed here together as one type of outcome.

Path	Ra	Grand mean		
	Min.	Max.		
R-R-R-R-R	0.18 [0.10,0.27]	0.51 [0.42,0.60]	0.31 [0.26,0.36]	
R-R-R-R-M	0.01 [0.00,0.02]	0.09 [0.05,0.16]	0.03 [0.02,0.04]	
R-R-R-M-R	0.00 [0.00,0.01]	0.01 [0.00,0.04]	0.01 [0.00,0.01]	
R-R-R-M-M	0.00 [0.00,0.02]	0.05 [0.02,0.10]	0.03 [0.02,0.04]	
R-R-M-R-R	0.00 [0.00,0.01]	0.07 [0.01,0.20]	0.02 [0.01,0.04]	
R-R-M-R-M	0.00 [0.00,0.00]	0.01 [0.00,0.01]	0.00 [0.00,0.00]	
R-R-M-M-R	0.00 [0.00,0.01]	0.17 [0.01,0.34]	0.03 [0.01,0.06]	
R-R-M-M-M	0.01 [0.00,0.02]	0.14 [0.02,0.25]	0.07 [0.05,0.09]	
R-M-R-R-R	0.03 [0.01,0.06]	0.13 [0.02,0.28]	0.07 [0.04,0.11]	
R-M-R-R-M	0.00 [0.00,0.01]	0.01 [0.00,0.04]	0.01 [0.00,0.01]	
R-M-R-M-R	0.00 [0.00,0.00]	0.01 [0.00,0.02]	0.00 [0.00,0.00]	
R-M-R-M-M	0.00 [0.00,0.00]	0.01 [0.00,0.03]	0.01 [0.00,0.01]	
R-M-M-R-R	0.02 [0.01,0.05]	0.08 [0.03,0.16]	0.05 [0.04,0.07]	
R-M-M-R-M	0.00 [0.00,0.00]	0.02 [0.01,0.04]	0.01 [0.00,0.01]	
R-M-M-R	0.03 [0.01,0.05]	0.18 [0.03,0.42]	0.07 [0.04,0.10]	
R-M-M-M	0.08 [0.04,0.15]	0.31 [0.08,0.51]	0.19 [0.16,0.22]	
R-X-X-X-D	0.06 [0.04,0.08]	0.31 [0.25,0.37]	0.11 [0.10,0.12]	

Notes: All individuals are in the residency site during the breeding season, accordingly all paths start as resident ('R'). Each posterior summary is given as the posterior mean with 95% credible interval between brackets. For the focal path across the 9 years of study: 'Min' is the estimation for the year with the minimum posterior mean, 'Max' is the estimation for the year with the maximum posterior mean, and 'Grand mean' is the estimation for the average across years. Full-winter residence and full-winter migration, the two paths that are most likely to be realised, are in bold.

S5.7 References

Acker, P., Daunt, F., Wanless, S., Burthe, S., Newell, M. A., Harris, M. P., ..., Reid, J. M.(2020) Data from: Strong survival selection on seasonal migration versus residence induced by extreme climatic events. Dryad Digital Repository,

https://doi.org/10.5061/dryad.c2fqz616r

- Brooks, S. P., & Gelman, A. (1998). General methods for monitoring convergence of iterative simulations. Journal of Computational and Graphical Statistics, 7(4), 434–455. <u>https://doi.org/10.1080/10618600.1998.10474787</u>
- Gelman, A., Carlin, J. B., Stern, H. S., Dunson, D. B., Vehtari, A., & Rubin, D. B. (2014).Bayesian data analysis (3rd ed.). New York, USA: Chapman and Hall/CRC.
- Lunn, D., Jackson, C., Best, N., Thomas, A., & Spiegelhalter, D. (2012). The BUGS book: A practical introduction to Bayesian analysis. New York, USA: CRC press.