1	Title:
2	Arctic greening and bird nest predation risk across tundra ecotones
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16	Summary paragraph
17	Alarming global-scale declines of birds numbers are occurring under changing climate <sup>1</sup> and
18	species belonging to alpine and arctic tundra are particularly affected <sup>2,3</sup> . Increased nest predation
19	appears to be involved <sup>4</sup> , but the mechanisms linking predation to climate change remain to be
20	shown. Here we test the prediction from food web theory that increased primary productivity
21	(greening of tundra) in a warming arctic leads to higher nest predation risk in tundra ecosystems.
22	Exploiting landscape-scale, spatial heterogeneity in primary productivity across alpine tundra
23	ecotones supplied with experimental nests in sub-arctic Scandinavia, we found that predation risk
24	indeed increased with primary productivity. The productivity-predation risk relationship was
25	independent of simultaneous effects of rodent population dynamics and vegetation cover at nest
26	sites. Predation risk also increased steeply with altitude, implying that species at the high-altitude
27	end of alpine tundra ecotones are particularly vulnerable. Our study contributes to an improved
28	understanding of how climate change may affect arctic-alpine ecosystems and threaten endemic

29 biodiversity through a trophic cascade.

#### 31 Main Text

Biota belonging to the globe's coldest biomes – alpine and arctic tundra – are expected to be
disproportionally exposed to global warming<sup>3,5</sup>. Indeed, declines in abundance and distribution
ranges of arctic-alpine bird species have been reported<sup>1,2,6-9</sup>. Although, these declines are
consistent with recent climate change, the ecological mechanisms involved are mostly unknown.
Unravelling such mechanisms will yield improved predictive models of future changes as well as
better basis for implementing effective management actions<sup>10,11</sup>.

Birds are often subjected to strong food web interactions, of which predation has pervasive
impacts on population dynamics and extinction risk<sup>12</sup>. Eggs and nestlings are bird life stages
particularly vulnerable to predation<sup>13</sup>. Hence, factors determining nest predation have been the
targets of a large number of studies. Yet, how climate change may affect nest predation has been
claimed to be a remaining frontier<sup>14</sup>.

Alpine and arctic birds place their nests on the ground, sometimes in tundra landscapes with 43 sparse vegetation cover. Hence, their nests can be expected to be particularly vulnerable to 44 predation since they are often very exposed (i.e. visible because of little cover) and easily 45 accessible to predator species that are present. Alpine and arctic tundra are also the biomes where 46 climate warming is most profound<sup>3,5</sup> and a critical question is how this influence nest predation 47 risk. A new study has shown that nest predation in arctic waders has increased steeply concurrent 48 with recent climate warming<sup>4</sup>, but without providing evidence for the ecological mechanisms that 49 may be involved. The most fundamental response of tundra ecosystems to climate warming is 50 increased plant biomass – the tundra is greening<sup>15,16</sup>. While increased vegetation cover could 51 yield lower exposure of bird nests to predators<sup>13</sup>, food web theory predicts that increased primary 52 productivity in tundra will render species at intermediate trophic levels (such as many ground 53 nesting birds) more suppressed by predation<sup>17</sup>. In particular, generalist consumers (omnivores 54 like corvids and foxes) that feed on a variety of food items from several trophic levels, including 55 bird nests, are expected to become more abundant as primary productivity increases. While this 56 expectation is derived from general food web theory, consumers in tundra ecosystem may be 57 particularity sensitive to a warming-induced increase in primary productivity, because primary 58 59 productivity is initially low and temperature limited in cold regions.

Here we test the prediction that higher landscape-scale primary productivity is associated with 60 higher nest predation risk within an 11 000 km<sup>2</sup> region at 70-71°N in Scandinavia (Fig. 1). The 61 study region is located in the transition between north-boreal forest and sub-arctic tundra. Like 62 large tracts of the circumpolar high north<sup>3,16,18</sup>, the region has been subjected to a spatially 63 heterogeneous greening<sup>9</sup> and ground nesting tundra birds such as ptarmigans have been declining 64 over the last decades<sup>7,8</sup>. The boreal-arctic transition zone is also expected to be particularly prone 65 to invasions by boreal predators in a warming climate, because of its close proximity to forest 66 ecosystems<sup>8</sup>. 67

We selected 9 replicate landscape areas (average area size=13.3km<sup>2</sup>) with three levels of 68 greenness (i.e. primary productivity) as assessed by the maximum Enhanced Vegetation Index 69 70 (max EVI). Within each landscape area, we distributed 20 experimental nests along two altitudinal transects (Fig. 1). Each transect spanned an ecotone (i.e. an altitude gradient) starting 71 just above the tree-line in relatively lush low-alpine shrub tundra and ending in more sparsely 72 vegetated middle-alpine tundra. This ecotone design was employed because bird species 73 74 associated with different alpine vegetation zones in other geographic regions have exhibited contrasting population declines<sup>2,6</sup> and because this ecotone also constitute a spatial gradient in 75 primary productivity and vegetation cover. We deployed experimental nests according to a much-76 used standard that provides a measure of *relative predation risk*<sup>19</sup>. The experimental nests were 77 exposed for 14 days during the local birds' breeding season of the years 2010-2014. This 5-year 78 period encompassed all phases of the multi-annual rodent population cycle known to strongly 79 influence nest predation risk through the alternative prev mechanism<sup>20</sup>. We expected the 80 predation risk to peak in the crash phase of the rodent cycle, because predators that have become 81 numerous based on abundant rodent prey in the peak phase (predator numerical response) switch 82 to alternative prey (e.g. bird nests) in the crash phase when rodent prey has become scarce 83 (predator functional response). Overall, predator functional and numerical responses should yield 84 a predation risk cycle that mirrors the rodent cycle with one-year time  $lag^{20}$ . 85

86 Predation risk among the 900 experimental nests exhibited profound temporal and spatial

variation (Fig. 2). A GLMM model that included the following four additive fixed effects

88 adequately accounted for this variation: *Primary productivity* (max EVI) at the landscape-level

89 (see Fig. 1), *altitude* (i.e. elevation in meters above the alpine tree-line) and *vegetation cover* at

nest sites, and year (i.e. the phase of the rodent cycle). In accordance with the prediction, the 90 predation risk increased with landscape-scale primary productivity (max EVI) (Fig. 2a). 91 Landscape areas with the highest productivity level had 72% higher predation risk (odds ratio: 92 2.44, 95% CI [1.25, 4.77]) than landscapes with the lowest productivity level. The largest 93 contrast was between the lowest and intermediate max EVI-levels (Fig. 2a), while the contrast 94 between the highest and the intermediate levels was not significant (Supplementary Table 2). 95 However, as a model with max EVI as a linear, continuous predictor variable appeared to predict 96 predation risk about equally well (Fig. 2a, Supplementary Table 3), the evidence for a non-linear 97 effect is not strong. Within the ecotone transects the predation risk increased linearly with altitude 98 (Fig. 2b); an increase of 100 m yielded 43% higher predation risk (odds ratio: 1.91, 95% CI 99 100 [1.32, 2.81]). Moreover, nests with very little vegetation cover had 112% higher predation risk (odds ratio: 3.26, 95% CI [1.35, 8.69]) than nests that were almost totally concealed by the 101 102 ground vegetation. The largest contrast was between the lowest and the intermediate cover levels (Fig. 2c). As expected, altitude and vegetation cover were negatively correlated (Spearman r = -103 104 0.30), but only moderately, owing to much small-scale patchiness in vegetation cover. A model without cover included yielded an even stronger effect of altitude (odds ratio: 2.48, 95% CI [1.71, 105 106 3.72]). Finally, predation risk peaked in the crash year 2012 of the 4-year rodent cycle (Fig. 2d) when it was 495% higher (odds ratio: 11.08, 95% CI [5.11, 26.68]) than in the preceding rodent 107 108 pre-peak year 2010 and 46% higher than the following pre-peak year in 2014 (odds ratio: 1.92, 95% CI [1.07, 3.50]). 109

We were able to attribute 54% of predation events to either mammals or birds based on marks left on a plasticine egg in the experimental nest. The majority (80%) of these events with known predator type were due to bird predation (beak marks), but there were no apparent trends in this proportion in space or time.

The difference in nest predation risk between landscape areas with contrasting primary productivity, located some tens of kilometers apart in our sub-arctic study region, was of similar magnitude to those previously found across major latitudinal, bio-climatic tundra zones several thousand kilometers apart in the Canadian Arctic<sup>19</sup>. The Canadian study also used experimental nests with quail eggs, but did not measure primary productivity or control for the strong impact of the rodent cycle<sup>21</sup>. Thus, our study provides a more direct test of the prediction from food web theory<sup>17,22</sup>; i.e. that a negative impact of increased primary productivity on intermediate trophic
level in the food web (that includes ground nesting birds) is mediated through enhanced
predation.

123 While the effect of primary productivity and nest site vegetation cover was according to the prediction, the enhanced predation risk with increasing altitude is intriguing. The altitude effect 124 was strong even when nest site vegetation cover was corrected for in the GLMM model. This 125 indicates that the increased predation pressure with altitude did not result from increased nest 126 visibility. A mechanism that may underlie the altitude effect is a constant proportional spillover 127 128 of mobile predators (e.g. corvids) from the more productive (low-altitude) onto the less productive (high-altitude) sections of the tundra landscape<sup>22</sup>, causing an increasing predator-prev 129 ratio with increasing altitude. Such risk gradients resulting from shifting victim-enemy ratios 130 have been demonstrated for other organisms (e.g. insects)<sup>23</sup>. In our case an altitudinal risk 131 gradient imply that bird species associated with high-altitude alpine vegetation zones may be 132 particularly vulnerable to climatic warming, a prediction that seems to be consistent with bird 133 population trends from other alpine regions<sup>6</sup>. 134

As expected, the predation risk peaked in the crash year (2012) of the regional-scale, 4-year 135 rodent cycle. However, predation risk estimates did not quite exhibit the expected symmetrical, 136 one-year lagged cycle relative to the rodent dynamics<sup>20</sup>, since the predation risk in the rodent pre-137 peak year 2014 did not drop to the low level of the pre-peak year 2012. Accordingly, the link 138 between the population dynamics of ptarmigan and the rodent cycle appear presently weaker than 139 it was four to five decades ago<sup>24</sup>. Increased availability of food sources such as carrion from 140 ungulate populations<sup>25</sup>, may have caused a decoupling from the rodent cycle due to omnivore 141 nest predators. Inter-annual variation and long-term changes in population density and breeding 142 phenology within the community of ground nesting birds may also have disturbed the match 143 between the rodent cycle and nest predation risk. 144

Like previous studies, we have resorted to time-for-space substitution<sup>17</sup> and experimental prey items<sup>26</sup> for inferring that tundra ecosystems in a warming climate may become subjected to a trophic cascade that yields increased predation pressures on endemic biodiversity. Indeed, although our 5-year study is relatively long-term - especially in context of nest predation studies<sup>14</sup> - it is nevertheless too short to simultaneously study temporal trends in climate, vegetation

productivity and predation. However, food web theory<sup>22</sup> predicts predation to increase with 150 primary productivity regardless of whether the productivity increases across space or time. 151 Moreover, when we infer that nest predation risk is enhanced when primary production increases 152 in tundra ecosystems, we also borrow support from analogous empirical findings from other 153 ecosystems, where primary productivity has been boosted because of human land use. In 154 particular, experimental nests in forest ecosystems have higher predation rates when the forest is 155 encroached by more productive agricultural fields<sup>27, 28</sup>. Finally, generalist predators originally 156 belonging to boreal ecosystems are presently increasing in the high north<sup>3,5,25</sup>. In our study 157 region, omnivorous corvids (*Corvus* spp.) numerically dominate the predator guild across the 158 focal alpine ecotone<sup>29</sup> and are major predators of tundra bird nests<sup>30</sup>. New studies and 159 160 technologies are much needed to reveal how different predator species are responding to a greening tundra and how this affects bird species with different nesting habitats and life history 161 162 strategies.

Increased productivity (greening) is a fundamental tundra ecosystem response to global warming 163 likely to have cascading impacts in terms of changed trophic interactions in the food web<sup>3,5</sup>. By 164 here substantiating empirically the prediction from food web theory, that arctic greening leads to 165 increased predation pressures on vulnerable prey species, our study contributes to an improved 166 understanding of how climate change may affect arctic ecosystems through a trophic cascade. 167 Unravelling such changed interactions in tundra food webs may also be helpful for biodiversity 168 conservations under climate change<sup>11</sup>. While the ongoing greening of the Arctic may be 169 impossible to counteract by means of local management, actions made to halt the increase of 170 generalist predators may nevertheless be a management option to preserve alpine-arctic birds in a 171 warming climate. Indeed, such actions are currently implemented in northern Fennoscandia to 172 safeguard the critically endangered population of lesser white-fronted goose (Anser erythropus)<sup>31</sup>. 173

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### 184 Author contributions

- 185 RAI and JAH conceived the study. JAH and JUJ analyzed the data. AVT, MJG and MAS
- 186 conducted the experiment. RAI wrote the manuscript with contribution from all authors.
- 187

# **188** Competing interests

189 There are no competing interests.

# 190 **References**

- P. A. Stephens, L. R. Mason, R. E. Green, R. D. Gregory, J. R. Sauer, J. Alison, A. Aunins,
   L. Brotons, S. H. Butchart, T. Campedelli, T. Chodkiewicz, P. Chylarecki, O. Crowe, J. Elts,
   V. Escandell, R. P. Foppen, H. Heldbjerg, S. Herrando, M. Husby, F. Jiguet, A. Lehikoinen,
   A. Lindstrom, D. G. Noble, J. Y. Paquet, J. Reif, T. Sattler, T. Szep, N. Teufelbauer, S.
- 195 Trautmann, A. J. van Strien, C. A. van Turnhout, P. Vorisek, S. G. Willis, Consistent 196 response of bird populations to climate change on two continents. *Science* **352**, 84-87 (2016).
- P. R. Elsen, M. W. Tingley, Global mountain topography and the fate of montane species under climate change. *Nat. Clim. Ch.* 5, 772 (2015).
- 199 3. "Arctic Biodiversity Assessment. Status and trends in Arctic biodiversity.," *CAFF* 200 (Conservation of Arctic Flora and Fauna, Akureyri, 2013).
- 4. T. Kubelka, M. Šálek, P. Tomkovich, Z.Végvári, R.P. Freckleton, T. Székely. Global pattern of nest predation is disrupted by climate change in shorebirds. *Science* 362, 680–683
   (2018).
- E. Post, M. C. Forchhammer, M. S. Bret-Harte, T. V. Callaghan, T. R. Christensen, B.
   Elberling, A. D. Fox, O. Gilg, D. S. Hik, T. T. Høye, R. A. Ims, E. Jeppesen, D. R. Klein, J.
   Madsen, A. D. McGuire, S. Rysgaard, D. E. Schindler, I. Stirling, M. P. Tamstorf, N. J. C.
   Tyler, R. van der Wal, J. Welker, P. A. Wookey, N. M. Schmidt, P. Aastrup, Ecological
   dynamics across the arctic associated with recent climate change. *Science* 325, 1355-1358
   (2009).
- 6. M. W. Tingley, W. B. Monahan, S. R. Beissinger, C. Moritz, Birds track their Grinnellian
  niche through a century of climate change. *Proc Natl Acad Sci USA* 106 Suppl 2, 1963719643 (2009).
- 7. A. Lehikoinen, M. Green, M. Husby, J. A. Kålås, Å. Lindström, Common montane birds are
  declining in northern Europe. *J. Avian Biol.* 45, 3-14 (2014).
- 8. B. Elmhagen, J. Kindberg, P. Hellstrom, A. Angerbjorn, A boreal invasion in response to climate change? Range shifts and community effects in the borderland between forest and tundra. *Ambio* 44 Suppl 1, S39-50 (2015).

- T. V. Callaghan, C. Jonasson, T. Thierfelder, Z. Yang, H. Hedenås, M. Johansson, U. Molau,
   R. Van Bogaert, A. Michelsen, J. Olofsson, D. Gwynn-Jones, S. Bokhorst, G. Phoenix, J. W.
- Bjerke, H. Tømmervik, T. R. Christensen, E. Hanna, E. K. Koller, V. L. Sloan, Ecosystem
  change and stability over multiple decades in the Swedish subarctic: complex processes and
  multiple drivers. *Philos. Trans. R. Soc. London Ser. B* 368, (2013).
- 10. J. L. Blois, P. L. Zarnetske, M. C. Fitzpatrick, S. Finnegan, Climate change and the past,
   present, and future of biotic interactions. *Science* 341, 499-504 (2013).
- 11. T. P. Dawson, S. T. Jackson, J. I. House, I. C. Prentice, G. M. Mace, Beyond predictions:
   Biodiversity conservation in a changing climate. *Science* 332, 53-58 (2011).
- 12. T. E. Martin, Avian life history evolution in relation to nest sites, nest predation, and food.
   *Ecol. Monogr.* 65, 101-127 (1995).
- T. E. Martin, Nest predation and nest sites: New perspectives on old patterns. *Bioscience* 43, 523-532 (1993).
- 14. J. D. Ibáñez-Álamo, R. D. Magrath, J. C. Oteyza, A. D. Chalfoun, T. M. Haff, K. A.
  Schmidt, R. L. Thomson, T. E. Martin, Nest predation research: recent findings and future
  perspectives. J. Ornithol. 156, 247-262 (2015).
- 15. F. S. Chapin, 3rd, M. Sturm, M. C. Serreze, J. P. McFadden, J. R. Key, A. H. Lloyd, A. D.
  McGuire, T. S. Rupp, A. H. Lynch, J. P. Schimel, J. Beringer, W. L. Chapman, H. E.
  Epstein, E. S. Euskirchen, L. D. Hinzman, G. Jia, C. L. Ping, K. D. Tape, C. D. Thompson,
  D. A. Walker, J. M. Welker, Role of land-surface changes in arctic summer warming. *Science* 310, 657-660 (2005).
- 16. L. Xu, R. B. Myneni, F. S. Chapin Iii, T. V. Callaghan, J. E. Pinzon, C. J. Tucker, Z. Zhu, J.
  Bi, P. Ciais, H. Tømmervik, E. S. Euskirchen, B. C. Forbes, S. L. Piao, B. T. Anderson, S.
  Ganguly, R. R. Nemani, S. J. Goetz, P. S. A. Beck, A. G. Bunn, C. Cao, J. C. Stroeve,
  Temperature and vegetation seasonality diminishment over northern lands. *Nat. Clim. Ch.* 3, 581 (2013).
- P. Legagneux, G. Gauthier, N. Lecomte, N. M. Schmidt, D. Reid, M. C. Cadieux, D.
  Berteaux, J. Bêty, C. J. Krebs, R. A. Ims, N. G. Yoccoz, R. I. G. Morrison, S. J. Leroux, M.
  Loreau, D. Gravel, Arctic ecosystem structure and functioning shaped by climate and
  herbivore body size. *Nat. Clim. Ch.* 4, 379 (2014).
- 18. I. H. Myers-Smith, S. C. Elmendorf, P. S. A. Beck, M. Wilmking, M. Hallinger, D. Blok, K.
  D. Tape, S. A. Rayback, M. Macias-Fauria, B. C. Forbes, J. D. M. Speed, N. BoulangerLapointe, C. Rixen, E. Lévesque, N. M. Schmidt, C. Baittinger, A. J. Trant, L. Hermanutz, L.
- 250 Laponite, C. Rixen, E. Levesque, N. W. Schnhut, C. Battinger, A. J. Hant, E. Hermanutz, E.
  251 S. Collier, M. A. Dawes, T. C. Lantz, S. Weijers, R. H. Jørgensen, A. Buchwal, A. Buras, A.
  252 T. Naito, V. Ravolainen, G. Schaepman-Strub, J. A. Wheeler, S. Wipf, K. C. Guay, D. S.
  253 Hik, M. Vellend, Climate sensitivity of shrub growth across the tundra biome. *Nat. Clim. Ch.*
- **5**, 887 (2015).
- 19. L. McKinnon, P. A. Smith, E. Nol, J. L. Martin, F. I. Doyle, K. F. Abraham, H. G. Gilchrist,
  R. I. Morrison, J. Bety, Lower predation risk for migratory birds at high latitudes. *Science*327, 326-327 (2010).
- 258 20. R. A. Ims, E. Fuglei, Trophic interaction cycles in tundra ecosystems and the impact of
   climate change. *Bioscience* 55, 311-322 (2005).
- 260 21. O. Gilg, N. G. Yoccoz, Ecology. Explaining bird migration. Science 327, 276-277 (2010).
- 261 22. L. Oksanen, T. Oksanen, The logic and realism of the hypothesis of exploitation ecosystems.
   262 Am Nat 155, 703-723 (2000).
- 263 23. J. L. Maron, S. Harrison, Spatial pattern formation in an insect host-parasitoid system.
   264 Science 278, 1619-1621 (1997).

- 24. Henden, J.A., R.A. Ims, E. Fuglei, Å.Ø. Pedersen, Changed Arctic-alpine food web
  interactions under rapid climate warming: Implication for Ptarmigan Research. *Wildl. Biol.*https://doi.org/10.2981/wlb.00240 (2017).
- 268 25. Sokolov, A.A., Sokolova, N.A., Ims, R.A., Brucker, L. & Ehrich, D. 2015. Emergent rainy
   winter warm spells may promote boreal predator expansion into the Arctic. *Arctic* 69, 121 129.
- 26. T. Roslin, B. Hardwick, V. Novotny, W. K. Petry, N. R. Andrew, A. Asmus, I. C. Barrio, Y.
  Basset, A. L. Boesing, T. C. Bonebrake, E. K. Cameron, W. Dattilo, D. A. Donoso, P. Drozd,
- C. L. Gray, D. S. Hik, S. J. Hill, T. Hopkins, S. Huang, B. Koane, B. Laird-Hopkins, L.
- Laukkanen, O. T. Lewis, S. Milne, I. Mwesige, A. Nakamura, C. S. Nell, E. Nichols, A.
  Prokurat, K. Sam, N. M. Schmidt, A. Slade, V. Slade, A. Suchankova, T. Teder, S. van
  Nouhuys, V. Vandvik, A. Weissflog, V. Zhukovich, E. M. Slade, Higher predation risk for
  insect prey at low latitudes and elevations. *Science* 356, 742-744 (2017).
- 278 27. H. Andrén, Corvid density and nest predation in relation to forest fragmentation: A landscape
   279 perspective. *Ecology* 73, 794-804 (1992).
- 280 28. I. Storch, E. Woitke, S. Krieger, Landscape-scale edge effect in predation risk in forestfarmland mosaics of central Europe. *Landscape Ecol.* 20, 927-940 (2005).
- 282 29. S. T. Killengreen, E. Strømseng, N. G. Yoccoz, R. A. Ims, How ecological neighbourhoods
  283 influence the structure of the scavenger guild in low arctic tundra. *Divers. Distr.* 18, 563-574
  284 (2012).
- R. A. Ims, J.-A. Henden, A. V. Thingnes, S. T. Killengreen, Indirect food web interactions
   mediated by predator-rodent dynamics: relative roles of lemmings and voles. *Biol. Let.* 9,
   20130802 (2013).
- 31. F. Marolla, T. Aarvak, I.J. Øien, J.P. Mellard, J.A. Henden, S. Hamel, A. Stien, T. Tveraa,
  N.G. Yoccoz, R.A. Ims, Assessing the effect of predator control on an endangered goose
  population subjected to predator-mediated food web dynamics. *J. Appl. Ecol.* (in press)
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Fig. 1. Study design. Map of the study region in northern Scandinavia (middle inset map) with the location of the 9 landscape areas (white dots). The right inset map exemplify how the 2 altitudinal ecotone transects were placed within each landscape area, where black dots are the 10 nest sites per transects. The altitudes (meters above sea level) are given for lowest and highest sites, while the shapes around each transect denote the buffer zones over which max EVI was estimated for each landscape area. The degree of greenness is proportional to max EVI according to the color scale bar inset. Cross-hatched areas denote sub-alpine mountain birch forest.



Fig. 2. Estimated nest predation risk per 14-days exposure periods. Risk estimates are
functions of (a) max EVI both modelled as a three-level categorical variable (black dots and
lines) and as a continuous predictor (broken gray line), (b) altitude (meters) above the alpine treeline, (c) three ordinal levels of vegetation cover and (d) year and the phases of the rodent
population cycle. Error bars denote 95% confidence intervals for the fixed effects, while small
gray dots are random effects from the GLMM. The multi-annual rodent density cycle is shown as
a grey stippled curve in panel d.



#### 312 Methods

#### 313 <u>Field work</u>

314 Two altitudinal ecotone transects within each of 9 landscape areas (Fig. 1) were established with 315 a minimum distance of 2 kilometers between the transects in order to reduce the chance of predation from the same predator individuals. The starting point of each transect was just above 316 the tree-line of the subalpine mountain birch (*Betula pubescens*) forest, which ranged about 50 – 317 350 meter above sea level among the landscape areas. From the starting point 10 experimental 318 nest-sites were placed at fixed 200 meter distance intervals (Fig. 1), generally upslope so as to 319 span the low-alpine to the middle-alpine vegetation zone within each transect. Typically, the low-320 321 alpine zone is characterized by continuous vegetation with erect shrubs (e.g. Betula nana), while 322 in the middle-alpine zone the vegetation is more discontinuous with prostrate vascular plants and increasing dominance of cryptogams<sup>32</sup>. At each nest site, we made an experimental nest similar to 323 nests of ptarmigan (Lagopus spp.) and waders (Charadriinae) by scraping a small bowl in the 324 ground by hand. Two eggs - one quail (*Coturnix sp.*) egg and one plasticine egg made to mimic a 325 quail egg - were placed in the nest. Quail eggs have similar coloration to the eggs of ground 326 nesting tundra birds (Supplementary Fig. 1). We used mixture of colored plasticine to create 327 similar plasticine eggs. The purpose of the plasticine eggs was to acquire predator identity from 328 bite marks<sup>33</sup>. They were attached to the ground by a steel wire to hinder removal by the predators. 329 A small tape mark was placed at a fixed distance (10 meters) and angle from the nest to aid the 330 331 recovery of the nests. We used rubber gloves to minimize human scent that could attract predators using olfactory cues. Predation on such experimental nests has been found to correlate 332 with real bird nests in tundra habitats<sup>34</sup>, meaning that they are indicative of spatial and temporal 333 variation in *relative* predation risk. However, care should be taken not to extrapolate predation 334 335 rates on experimental nests to absolute predation rate on real nests. In particular, it is likely that the eggs of experimental nests without incubating birds are more exposed than natural nests, and 336 thus more subjected to predators using vision (i.e. birds). 337

The amount of ground vegetation that could conceal the eggs was scored on a three-level ordinal scale for each nest; 1: the eggs were fully visible from above, 2: some branches of vascular plants intercepted the view of the eggs and 3: most of the eggs were concealed by vegetation cover (see Supplementary Fig. 1). Also, natural bird nests in tundra habitats may vary much with respect to

vegetation cover both between and within species<sup>35</sup>. We also measured the maximum height of 342 the vascular plants within a triangular sampling frame with sides of 40 cm centered on the nest. 343 These height measurements were strongly correlated with the ordinal vegetation level score (see 344 Supplementary Fig. 2). We used the ordinal scores as three levels of a categorical vegetation 345 cover predictor in the statistical analyses as to facilitate more robust statistical estimation of 346 putative interaction effects (see "Statistical analyses"). Small-scale patchiness of vegetation both 347 in the low- and middle-alpine vegetation zones, owing to mosaics of ridges and snow beds, 348 rendered the correlation between relative altitude and vegetation cover at the nest sites to be only 349 moderately negative (r=-0.3). This indicates that we were able to obtain relatively unbiased 350 estimates of the independent effects of primary productivity (at the landscape level), and altitude 351 352 and vegetation cover (at the nest site level).

353 The experimental nests were deployed during the week 23-30 June each year, which is within the incubation period for ground nesting tundra birds in the study region<sup>35</sup>. All nests were recovered 354 355 14 days after deployment. This exposure period is shorter than the typical incubation periods for ptarmigan and waders in tundra (range:18-24 days<sup>35</sup>). On the other hand, experimental nests 356 without incubating birds are probably overall more exposed than natural nests and we expected 357 the shorter exposure time to compensate for this. Nests where at least one egg was missing 358 359 without any remaining signs or evidently eaten at the site (egg shells remaining), were recorded as predation events. The identity of predators was determined as bird and mammal when marks 360 361 from beaks or teeth, respectively, were left on the plasticine eggs.

Small rodents (voles and lemmings) had a distinct 4-year population cycle with strong interspecific and spatial synchrony across the study region<sup>31,36,37</sup>. In order to determine the phases of the rodent cycle during the 5-year study period we used data from the trapping program described in ref. 36 conducted near the landscape areas in Varanger, Nordkinn and Ifjord (see Fig. 1). The rodent population trajectory shown in Figure 2d is presented as number of snap-trapped rodents per 100 trap-nights in summer.

368

369 <u>Landscape area primary productivity</u>

We used MODIS Enhanced Vegetation Index (EVI) as a measure of vegetation productivity at 370 the spatial scale of the 9 landscape areas included in this study. Both NDVI and EVI are suitable 371 proxies for vegetation productivity, but the advantages of EVI include a lower sensitivity to 372 viewing angle variations and a smoother, more symmetrical seasonal profile with a narrower 373 peak greenness period<sup>38</sup>. The landscape scale was chosen as previous studies have shown that 374 nest predators typically are wide ranging and that landscape level characteristics are often 375 important predictors of predation rate<sup>39-41</sup>. The most abundant nest predators in sub-arctic tundra 376 - red fox (Vulpes vulpes) and raven (Corvus corax) - have home ranges that most often exceed 377 the size of the landscape areas (>20km<sup>2</sup>) in this study<sup>42,43</sup>. Moreover, we focused on the inter-378 annual variation in site productivity (rather than within season variation) and selected temporal 379 380 and spatial resolution of the MODIS data expected to provide estimates that most robustly reflected the difference in primary productivity among the landscape areas. Therefore, we chose 381 the MOD13O1 product<sup>44</sup>, which is a temporally coarse 16-day composite product with a pixel 382 size of 250 m. We extracted EVI data for the four 16-day periods covering the peak of the 383 384 growing season (day 177, 193, 209 and 225, representing late June – mid August) for the years 2010 – 2014. MODIS VI products are supplied with two measures of data quality, the Pixel 385 386 Reliability index (PR), which is a simplified 5-level ranking of overall pixel quality, and the Vegetation Index Quality (VI QA). We used both these indices to judge the quality of the data on 387 388 a pixel level. We initially kept all pixels with a PR value of either 0 (='Good data – use with confidence') or 1 (='Marginal data – useful but look at other QA'). Since it was clear from visual 389 390 inspection of the data that some pixels with PR=1 contained erroneous values, we further examined the VI QA, and kept only those pixels, which were in the best VI QA category ("VI 391 produced with good quality"). For each remaining pixel we calculated annual growing season 392 maximum EVI as the max EVI over the four 16-day periods. To obtain annual estimates of site 393 productivity for each of the 9 landscape areas, we used all pixels located within a 500 meter 394 buffer around the experimental nest sites within the landscapes (Fig. 1), and calculated the 395 average maximum EVI over all pixels within each landscape. We used estimates based average 396 max EVI over both buffer zones per landscape area (Fig. 1) because this yields estimates less 397 affected by local noise (measurement errors) than estimates based on smaller spatial scales and 398 subsets of pixels (i.e. transects within landscapes). 399

## 401 <u>Statistical analyses</u>

We analysed the data using Generalized Linear Mixed-effects Models (GLMM) with a logit-link 402 function applied to the binomial response variable that recorded predation events or non-events 403 per experimental nests. The predictions from this model are thus probabilities of predation (i.e. 404 405 predation risk). Fixed effects included in this model was landscape-scale *primary productivity* (max EVI), relative *altitude* in the ecotone transects, nest *vegetation cover* and *year*. The max 406 407 EVI values per landscape area and year formed three non-overlapping groups with the following averages and ranges of values: 0.37 [0.33, 0.38], 0.42 [0.40, 0.44], 0.48 [0.46, 0.54]. To better 408 409 facilitate tests of interaction terms and identification of possible non-linear effects, the productivity predictor was modelled as a categorical variable with three nominal levels based on 410 411 the clusters of max EVI values. The means for the three max EVI were evenly spaced on a linear scale and this facilitated the identification of possible non-linear effects based on estimates of 412 contrasts (see legend to Supplementary Table 2). Because the alpine tree-line was situated at 413 different altitudes across the study region (Fig. 1), we used *relative altitude* as a continuous 414 415 variable measured as the altitude difference (meters) between the lowest nest site adjacent to the tree-line and the focal nest site in each transect. Year (2010-2014) and vegetation cover (ordinal 416 levels: 1, 2 and 3) was modelled as categorical variables. GLMMs were fitted using nest site 417 nested within transects nested within landscape as random effects<sup>45</sup>, thus taking into account the 418 repeated censuses within nest sites, transects and landscapes. GLMMs were fitted using the lme4 419 package in the software R  $(3.4.0)^{46}$ . 420

Model selection started from four pre-defined candidate models<sup>47</sup>. In addition to 421 considering the main baseline model containing only additive effects of the four predictors 422 423 (which all were statistically significant), we also considered three additional models that included biologically meaningful interaction terms (see footnotes to Supplementary Table 1): One with 424 altitude\*max EVI, one with year\*max EVI and one with year\*altitude. Log-Likelihood ratio tests 425 426 and AIC-values were used to compare candidate models and to identify the most parsimonious 427 model (see Supplementary Table 1). Logit-scale parameters estimates (slope parameters and 428 contrasts) and associated test statistics from the most parsimonious model are provided in Supplementary Table 2, while odds ratios with 95% confidence intervals are presented in the 429 430 main text. Predation risk estimates on a probability scale for all levels and full ranges of the

431 predictor variables are presented in Fig. 2. We also compared a model with max EVI taken as 432 continuous, linear predictor against the best model with the same predictor taken as a categorical 433 variable (see above). This comparison was made based a Log-Likelihood test and AIC-values for 434 the two models (Supplementary Table 3). As a second check of non-linear effect of max EVI we 435 tested both the contrast (i.e. difference) between Max EVI levels 2 and 1 and between levels 3 436 and 2 (see caption to Supplementary Table 2).

The GLMMs were fitted using the Laplace approximation<sup>45</sup> and the "bobyga" optimizer in 437 the package lme4. The models were checked for constant variance of the residuals, presence of 438 outliers and approximate normality of the random effects. We also checked for potential 439 collinearity/confounding between predictors of which only altitude and vegetation cover were 440 moderately confounded (Spearman r = -0.30). Finally, we estimated pseudo- $R^2$  values for the the 441 most parsimonious GLMM model based on the function *r.squaredGLMM* in the *MuMIn* package 442 in the software  $R^{48}$ . Pseudo- $R^2$  values both for the fixed effects only (marginal model) and fixed 443 and random effects combined (full model), as well as for the two computation methods 444 445 ("theoretical" and "delta") provided by the R-package, are given in Supplementary Table 2.

About one-half of the predation events (46%) could not be attributed to either mammals 446 447 or birds because the plasticine eggs was removed or did not have clear marks. This combined with the fact that 80% of the events with known predator type were due to birds, vielded predator 448 449 identity data that were unsuitable for GLMM analyses. To explore whether there were significant patterns in the proportions of events with known predator type, the data were aggregated into a 450 451 set of two-dimensional cross-tables; i.e. one for each of the main predictor variable max EVI, altitude, vegetation cover and year. The altitudes were binned on three ordinal classes per transect 452 453 for this table. The cross-tables were subjected to binomial goodness of fit tests; i.e. assessing whether there were significant deviances from constant proportions across the levels of each 454 predictor variable. 455

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457 <u>Data availability</u>

The data that support the findings of this study are available from the corresponding author uponrequest.

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461 <u>Code availability</u>:

462 The R code used to analyze the data are available from the corresponding author upon request.

464	References
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465	32.	A. Moen, A. Lillethun, A. Odland, Vegetation. (Norwegian Mapping Authority,
466		Hønefoss, 1999), pp. 200.
	22	

- 467 33. P. W. Bateman, P. A. Fleming, A. K. Wolfe, A different kind of ecological modelling: the
  468 use of clay model organisms to explore predator-prey interactions in vertebrates. *J. Zool.*469 301, 251-262 (2017).
- 470 34. L McKinnon, PA Smith, E Nol, JL Martin, FI Doyle, KF Abraham, HG Gilchrist, RIG
  471 Morrison, J Bêty, Suitability of artificial nests—response. Science 328, 46-47 (2010).

472 35. Haftorn, S. Birds of Norway (Universitetsforlaget Oslo, 1971).

- 473 36. R. A. Ims, N. G. Yoccoz, S. T. Killengreen, Determinants of lemming outbreaks. *Proc.*474 *Natl. Acad. Sci. USA* 108, 1970-1974 (2011).
- R.A. Ims, S.T. Killengreen, D. Ehrich, Ø. Flagstad, S. Hamel, J.-A. Henden, I. Jensvoll,
  N.G. Yoccoz. Ecosystem drivers of an arctic fox population at the western fringe of the
  Eurasian Arctic. *Polar Research* 36, DOI:10.1080/17518369.2017.1323621(2017)
- 478 38. Huete, A., K. Didan, , T. Miura, E.P., Rodrigues, X. Gao, L.G. Ferreira, Overview of the
  479 radiometric and biophysical performance of the MODIS vegetation indices. *Remote Sens.*480 *Env.* 83, 195-213.
- 481 39. H. Andrén, P. Angelstam, E. Lindstrom, P. Widen, Differences in predation pressure in relation to habitat fragmentation an experiment. *Oikos* 45, 273-277 (1985).
- 483 40. T. M. Donovan, P. W. Jones, E. M. Annand, F. R. Thompson, Variation in local-scale 484 edge effects: Mechanisms and landscape context. *Ecology* **78**, 2064-2075 (1997).
- 485 41. S. Kurki, A. Nikula, P. Helle, H. Lindén, Landscape fragmentation and forest composition
  486 effects on grouse breeding success in boreal forests. *Ecology* 81, 1985-1997 (2000).
- 487 42. S. M. Harju, C. V. Olson, J. E. Hess, B. Bedrosian. Common raven movement and space
  488 use: influence of anthropogenic subsidies within greater sage grouse nesting habitat.
  489 *Ecosphere* 9 Article e02348 (2018)
- 43. Walton, Z., G. Samelius, M. Odden, T. Willebrand. Variation in home range size of red
  foxes *Vulpes* along a gradient of productivity and human landscape alteration. *PloS*492 *ONE* 12: Article e0175291 (2017).
- 493 44. K. Didan, MOD13Q1 MODIS/Terra Vegetation Indices 16-Day L3 Global. doi:
  494 10.5067/MODIS/MOD13Q1.006 (NASA EOSDIS Land Processes DAAC, 2015).
- 495 45. J. Pinheiro, D. Bates, *Mixed-Effects Models in S and S-PLUS*. (Springer, New York, 2000).
- 497 46. D. Bates, M. Machler, B. M. Bolker, S. C. Walker, Fitting Linear Mixed-Effects Models
  498 Using lme4. J. Stat. Software 67, 1-48 (2015).
- 47. K. P. Burnham, D. R. Anderson. Model selection and multimodel inference: a practical information-theoretic approach. (Springer, New York, ed. 2, 2002).
- 501 48. S. Nakagawa, H. Schielzeth. A general and simple method for obtaining R<sup>2</sup> from
   502 Generalized Linear Mixed-effects Models. *Methods in Ecology and Evolution* 4, 133–142
   503 (2013)
- 504
- 505



