

54 contribute to recently observed rapid Arctic sea ice loss, extratropical NH warming, and decadal-scale 55 changes in Atlantic tropical storm activity.

56 We use ensembles of simulations that cover the period 1951-2015. In the first suite of 57 simulations (labeled "HIST") we incorporate historical estimates of changing radiative forcing from 58 human and natural sources, including greenhouse gases, aerosols, ozone, solar irradiance and 59 volcanic aerosols. In the second set (labeled "HIST+NAO") we include these same forcings, but add to 60 the model ocean an additional pattern of air-sea heat flux that corresponds to a positive phase of the 61 NAO (see Supplementary Figure S1). We multiply the pattern of extra heat flux forcing by the 62 observed value of the NAO index for that year (Fig. 1a). Differences between the sets of experiments 63 (HIST+NAO minus HIST) provide an estimate of the impact of the observed time-varying NAO on the 64 North Atlantic Ocean and global climate system. We use three climate models for robustness. 165 Idealized experiments have revealed a profound influence of the NAO on the AMOC^{10,11}. A 66 positive phase of the NAO is characterized by enhanced westerly winds across the middle latitudes of 67 the North Atlantic (see schematic in Supplementary Figure S2). During winter these strengthened 68 winds bring colder, drier air from the North American continent over the warmer ocean⁵, thereby 69 enhancing air-sea temperature differences that lead to an increased flux of heat from the ocean to the 70 atmosphere in the Labrador Sea and subpolar region of the North Atlantic. This leads to colder, 71 denser water in the upper ocean and enhanced deepwater formation in the Labrador Sea region¹². In 72 idealized simulations the increased upper ocean density in the western part of the subpolar gyre 73 creates a zonal density gradient that leads to enhanced northward flow in the upper ocean and a

74 strengthening of the AMOC after a lag of five to ten years¹³. The strengthened AMOC transports more

75 heat poleward, leading to high-latitude warming and climatic impacts. The resulting temperature

76 response is superficially counter-intuitive, with some of the largest surface ocean warming in the

77 subpolar region where the prescribed perturbations act to remove heat from the ocean (compare 78 Figures 1a and 9a in Delworth and Zeng, 2015). This can only be understood by accounting for the 79 changing transport of heat by the ocean circulation.

80 Time series of the observed NAO and its simulated impact on the Atlantic are shown in Figure 81 1. The NAO transitions from a negative phase (weakened westerly winds) in the 1960s to a strong 82 positive phase (strengthened westerly winds) in the 1980s and 1990s (Fig. 1a), with some return to 83 more neutral conditions after 2000. The simulated AMOC (Fig. 1b) responds to these NAO variations, 84 and transitions from a weakened state in the 1960s and early 1970s to a strengthened state in the 85 1990s, with gradual weakening after 2000. The AMOC changes are mirrored by variations in 86 northward ocean heat transport in the subpolar North Atlantic (Fig. 1c) as well as heat transport into 87 the Barents Sea and Arctic (Fig. 1d).

 88 The variations in poleward ocean heat transport influence Arctic sea ice^{14,15} and large-scale 89 climate. In particular, enhanced Atlantic heat transport into the Arctic can lead to net basal melting 90 and a reduction of Arctic ice mass in all seasons, resulting in reduction of winter and summer Arctic 91 sea ice extent on multidecadal time scales¹⁶. We show in Figure 2 the time series of changes in 92 observed and simulated areal extent of Arctic sea ice for both March and September, as well as the 93 linear trends over 1979-2005. The NAO variations lead to an enhancement of Arctic sea ice extent in 94 the 1960s and 1970s⁷ in response to reduced ocean heat transport into the Arctic, and a reduction in 95 sea ice extent in the 1980s through 2015 associated with enhanced ocean heat transport into the 96 Arctic. The rate of simulated sea ice reduction (1979-2005) is greater when the NAO forcing is 97 included (insets in Figure 2a and 2c). The NAO impacts are similar in both seasons, but their relative 98 impact as a fraction of the observed change is larger in winter due to the smaller observed trends in 99 winter (spatial patterns shown in Supplementary Figure S3). These results suggest that NAO-induced

100 ocean heat transport variations may have contributed to the rapid loss of Arctic sea ice in the 1990s 101 and early 2000s, especially during winter, and therefore augmented the decline due to anthropogenic 102 radiative forcing. In these simulations the NAO effect was strongest in the 1990s and early 2000s, but 103 has weakened after approximately 2005, consistent with the decline of the NAO from peak values in 104 the 1990s.

105 The variations in poleward ocean heat transport and Arctic sea ice also impact surface air 106 temperature over the NH extratropics¹⁷ (Figure 3, and Supplementary Figure S4). The weakened 107 AMOC in the 1960s and 1970s led to a simulated extratropical NH cooling of 0.1-0.2K, followed by a 108 strengthening AMOC leading to a simulated extratropical NH warming of \sim 0.2K by the year 2000. This 109 warming is driven by enhanced ocean heat transport, but is also amplified by coupled ocean-110 atmosphere-land-ice feedbacks. The associated reductions in ice extent and snow, including on 111 surrounding continental regions, reduce albedo and increase absorbed shortwave radiation. This 112 provides an important positive feedback that amplifies the warming signal from the ocean heat 113 transport increase.

114 This simulated large-scale warming of the NH influences large-scale atmospheric circulation, 115 including a reduction in the meridional temperature gradient. This leads to a weakening of upper 116 atmosphere westerly winds in the subtropics over the Atlantic, and a reduction in the vertical shear of 117 the zonal wind (see Supplementary Figures S5 and S6). Since shear is one of the dominant factors 118 influencing tropical storm activity¹⁸, we examine changes in Atlantic tropical storm activity in 119 response to NAO-induced AMOC variations. Only one of the models (FLOR, see Methods) has sufficient 120 atmospheric resolution to credibly simulate aspects of Atlantic tropical storms¹⁹. We show in Figure 4 121 the changes in simulated tropical storm activity between 1965-1994 (reduced heat transport in 122 response to the NAO, and larger vertical wind shear) and 1995-2014 (enhanced heat transport and

123 reduced vertical wind shear). The inclusion of the NAO forcing leads to a systematic shift to more 124 frequent tropical storms in the Atlantic in the latter period. The fraction of attributable risk²⁰ of the 125 change in tropical storm activity to the imposed NAO-related flux forcing is 97%. This suggests that 126 NAO variations could have contributed to the observed increase in Atlantic tropical storm activity in 127 the post 1995 period relative to earlier decades.

128 Our results demonstrate that multidecadal changes in the NAO can have a broad impact on 129 climate through their influence on poleward ocean heat transport. These changes include modulating 130 Atlantic ocean temperature, Arctic sea ice, NH extratropical temperature, and Atlantic tropical storm 131 activity. This is consistent with model and observational analyses showing substantial Arctic and 132 Atlantic natural variability on multidecadal time scales, and is also consistent with observational 133 analyses showing the importance of ocean circulation for surface heat fluxes²¹ and North Atlantic 134 ocean heat content variations²². There are a number of uncertainties associated with these results, 135 including details of the observed NAO flux forcing, the models' response to the NAO, and the response 136 of the climate system to ocean heat transport variations, including cloud and shortwave radiation 137 feedbacks. The experiments shown here impose only NAO-related heat flux anomalies. We have 138 conducted additional simulations that also imposed NAO-related wind stress anomalies, and the 139 principal results are similar to those shown here (Supplementary Fig. S7). However, wind stress 140 anomalies are an important factor influencing direct wind-driven AMOC variability, especially at 141 interannual time scales²³. The current work has demonstrated that NAO-induced AMOC changes 142 could have played a substantial role in observed rapid changes in Arctic sea ice (primarily in winter), 143 extratropical temperature change, and Atlantic tropical storm activity over the last several decades. 144 This study has implications both for the study of past climates and for projections of future 145 climate. Proxy reconstructions indicate substantial multidecadal variability of the NAO over the past

168 **References**

- 169 1. Vaughan, D. G. *et al.* in *Climate Change 2013: The Physical Science Basis. Contribution of Working*
- 170 *Group 1 to the Fofth Assessment Report of the Intergovernmental Panel on Climate Change.*
- 171 (Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA., 2013).
- 172 2. Hartmann, D. L. *et al.* in *Climate Change 2013: The Physical Science Basis. Contribution of Working*
- 173 *Group 1 to the Fofth Assessment Report of the Intergovernmental Panel on Climate Change.*
- 174 (Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA., 2013).
- 175 3. Kossin, J. P. & Vimont, D. J. A More General Framework for Understanding Atlantic Hurricane
- 176 Variability and Trends. *Bull. Am. Meteorol. Soc.* **88,** 1767–1781 (2007).
- 177 4. Bindoff, N.L., et al. *Detection and Attribution of Climate Change: from Global to Regional.*
- 178 (Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA., 2013).
- 179 5. Yeager, S. G., Karspeck, A. & Danabasoglu, G. Predicted slow-down in the rate of Atlantic sea ice 180 loss. *Geophys. Res. Lett.* (2015). doi:10.1002/2015GL065364
- 181 6. Li, J., Sun, C. & Jin, F.-F. NAO implicated as a predictor of Northern Hemisphere mean temperature 182 multidecadal variability. *Geophys. Res. Lett.* **40,** 5497–5502 (2013).
- 183 7. Miles, M. W. *et al.* A signal of persistent Atlantic multidecadal variability in Arctic sea ice. *Geophys.* 184 *Res. Lett.* **41,** 463–469 (2014).
- 185 8. Gillett, N. P. *et al.* Attribution of polar warming to human influence. *Nat. Geosci.* **1,** 750–754 (2008).
- 186 9. Hurrell, J. W. & Deser, C. North Atlantic climate variability: The role of the North Atlantic
- 187 Oscillation. *J. Mar. Syst.* **78,** 28–41 (2009).
- 188 10. Eden, C. & Jung, T. North Atlantic interdecadal variability: oceanic response to the North Atlantic 189 Oscillation (1865-1997). *J. Clim.* **14,** 676–691 (2001).
- 190 11. Delworth, T. L. & Zeng, F. The impact of the North Atlantic Oscillation on climate through its
- 191 influence on the Atlantic Meridional Overturning Circulation. *J. Clim.* **Accepted,** (2015).
- 192 12. Danabasoglu, G. *et al.* Variability of the Atlantic Meridional Overturning Circulation in CCSM4. *J.* 193 *Clim.* **25,** 5153–5172 (2012).
- 194 13. Yeager, S. & Danabasoglu, G. The Origins of Late-Twentieth-Century Variations in the Large-Scale 195 North Atlantic Circulation. *J. Clim.* **27,** 3222–3247 (2014).
- 196 14. Mahajan, S., Zhang, R. & Delworth, T. L. Impact of the Atlantic Meridional Overturning Circulation
- 197 (AMOC) on Arctic Surface Air Temperature and Sea Ice Variability. *J. Clim.* **24,** 6573–6581 (2011).
- 198 15. Day, J. J., Hargreaves, J. C., Annan, J. D. & Abe-Ouchi, A. Sources of multi-decadal variability in Arctic
- 199 sea ice extent. *Environ. Res. Lett.* **7,** 034011 (2012).
- 200 16. Zhang, R. Mechanisms for low-frequency variability of summer Arctic sea ice extent. *Proc. Natl.*
- 201 *Acad. Sci.* **112,** 4570–4575 (2015).
- 202 17. Chylek, P. *et al.* Isolating the anthropogenic component of Arctic warming. *Geophys. Res. Lett.* **41,** 203 3569–3576 (2014).
- 204 18. Gray, W. Global view of the origin of tropical disturbances and storms. *Mon. Weather Rev.* **96,** 669– 205 700 (1968).
- 206 19. Vecchi, G. A. *et al.* On the Seasonal Forecasting of Regional Tropical Cyclone Activity. *J. Clim.* **27,** 207 7994–8016 (2014).
- 208 20. Stone, D. A. & Allen, M. R. The End-to-End Attribution Problem: From Emissions to Impacts. *Clim.*
- 209 *Change* **71,** 303–318 (2005).
- 210 21. Gulev, S. K., Latif, M., Keenlyside, N., Park, W. & Koltermann, K. P. North Atlantic Ocean control on
- 211 surface heat flux on multidecadal timescales. *Nature* **499,** 464–467 (2013).
- 212 22. McCarthy, G. D., Haigh, I. D., Hirschi, J. J.-M., Grist, J. P. & Smeed, D. A. Ocean impact on decadal
- 213 Atlantic climate variability revealed by sea-level observations. *Nature* **521,** 508–510 (2015).
- 214 23. Smeed, D. A. *et al.* Observed decline of the Atlantic meridional overturning circulation 2004-2012. 215 *Ocean Sci.* **10,** 29–38 (2014).
- 216 24. Ortega, P. *et al.* A model-tested North Atlantic Oscillation reconstruction for the past millennium.
- 217 *Nature* **523,** 71–74 (2015).
- 218 25. Robson, J., Hodson, D., Hawkins, E. & Sutton, R. Atlantic overturning in decline? *Nat. Geosci.* **7,** 2–3 219 (2014).
- 220 26. Hermanson, L. *et al.* Forecast cooling of the Atlantic subpolar gyre and associated impacts.
- 221 *Geophys. Res. Lett.* **41,** 5167–5174 (2014).
- 222 27. Dee, D. P. *et al.* The ERA-Interim reanalysis: configuration and performance of the data
- 223 assimilation system. *Q. J. R. Meteorol. Soc.* **137,** 553–597 (2011).
- 224 28. Delworth, T. L. *et al.* GFDL's CM2 global coupled climate models. Part I: Formulation and 225 simulation characteristics. *J. Clim.* **19,** (2006).
- 226 29. Donner, L. J. *et al.* The Dynamical Core, Physical Parameterizations, and Basic Simulation
- 227 Characteristics of the Atmospheric Component AM3 of the GFDL Global Coupled Model CM3. *J.*
- 228 *Clim.* **24,** 3484–3519 (2011).
- 229 30. Zhang, S., Harrison, M. J., Rosati, A. & Wittenberg, A. System Design and Evaluation of Coupled
- 230 Ensemble Data Assimilation for Global Oceanic Climate Studies. *Mon. Weather Rev.* **135,** 3541–
- 231 3564 (2007).
- 232
- 233 Acknowledgements
- 234 We thank M. Harrison, H, Murakami, and A. Wittenberg for valuable comments on a preliminary
- 235 version of this manuscript, along with two anonymous reviewers.
- 236

237 Author contributions

238 T.L.D. designed the study, conducted analyses, and wrote the paper. F. Z. conducted the model 239 simulations, contributed to the analyses. L. Z. conducted analyses of wind shear and decadal 240 predictions. G.A.V. conducted analyses of changes in tropical storm activity, and contributed ideas for 241 analyses and interpretation of results. All helped to improve the manuscript. 242 243 244 Figures 245 246 Figure 1 Time series of NAO and associated changes in ocean circulation. (a) Time series of the 247 observed NAO index based on differences in normalized Dec-Mar sea level pressure between Portugal 248 and Iceland (positive values associated with stronger mid-latitude westerly winds). (b) Response of 249 the model AMOC to the NAO flux forcing, calculated as the AMOC in the HIST+NAO simulations minus 250 the AMOC in the HIST simulations. The AMOC index is calculated as the maximum value in depth of 251 the annual mean streamfunction of the flow at 50°N. Units are Sverdrups (Sv; 1 Sv = 10^6 m³s⁻¹). The 252 diamonds indicate the mean response using all three models. The shaded bars denote the 5-95% 253 confidence interval around the mean response as calculated from resampling the control simulations. 254 (c) Same as (b) for ocean heat transport at $50°N$). (d) Same as (b) for ocean heat transport into 255 Barents Sea (calculated as zonal heat transport across a line connecting Norway and Spitsbergen at 256 approximately 10 \textdegree E; note the different vertical scales in (c) and (d)). 257 258 Figure 2 Observed and simulated changes in Arctic sea ice extent. (a) Time series of change in March

259 Arctic sea ice area relative to the 1979-1990 mean (units are 10^{12} m²; sea ice extent refers to area

260 with sea ice concentration greater than 15%). Blue curve shows the observations (from the National 261 Snow and Ice Data Center; http://nsidc.org/data). The squares show the multi-model mean for 262 HIST+NAO (black) and HIST (red). The colored bars (green for HIST+NAO, tan for HIST) indicate the 263 5-95% range around the multi-model mean, where the distribution is estimated based on resampling 264 control simulations for each. The grey bars indicate where the tan and green bars overlap. The inset 265 shows the linear trend from 1979 to 2005 of March Arctic sea ice area in observations (black circle), 266 CM2.1 (circles), FLOR (diamonds), and CM3 (squares). Tan (green) symbols are from HIST 267 (HIST+NAO). (b) Difference in ice extent calculated as HIST+NAO minus HIST. The bars indicate the 5- 268 95% range as estimated from resampling the control simulations. (c) Same as (a) for September. (d) 269 Same as (b) for September.

270

271 Figure 3 Response of Northern Hemisphere extratropical $(23°N-90°N)$ surface air temperature to 272 NAO heat flux forcing. The diamonds indicate the multi-model ensemble mean difference (HIST+NAO 273 minus HIST). The shading indicates the 5-95% limits around that mean as estimated from resampling 274 the control simulations.

275

276 Figure 4 Probability distribution functions of changes in Atlantic tropical cyclone activity for the 277 1995-2014 period relative to the 1965-1994 period. Values along the x-axis indicate percentage 278 changes in the number of tropical storms for 1995-2014 relative to the number for 1965-1994. The 279 black curve is based on HIST. The fact that the black curve is approximately symmetric around zero 280 indicates that the model simulates no systematic change in tropical storm activity in response to 281 radiative forcing change for the 1995-2014 period relative to the 1965-1994 period. In contrast, the 282 red curve is from HIST+NAO simulations. The fact that the red curve is to the right of the black curve 283 and is not symmetric around zero indicates an enhanced probability of an increase in tropical cyclone 284 activity for the 1995-2014 period relative to the earlier period when NAO forcing is included. The 285 observed change is indicated by the vertical blue line. The PDFs are generated by resampling the 286 numbers of storms each year from the model simulations (see Supplementary Information for 287 details).

- 288
- 289
- 290 **Methods**

291 **Models**

292 We use three climate models and subject them to identical forcings from NAO related surface flux 293 anomalies. The first model is the Geophysical Fluid Dynamics Laboratory (GFDL) CM2.1 model ²⁸. 294 This is a fully coupled ocean-atmosphere model, with land and atmospheric resolution of 295 approximately 200 km in the horizontal, and 24 vertical levels in the atmosphere. The ocean 296 component has horizontal resolution of approximately 100 km, with finer resolution in the tropics, 297 and 50 levels in the vertical. This model has been used in a wide variety of studies of climate 298 variability, predictability and change, and extensive model output from past studies is available at 299 http://nomads.gfdl.noaa.gov/CM2.X/ and http://nomads.gfdl.noaa.gov:8080/DataPortal/cmip5.jsp. 300 The second model used is called CM2.5 FLOR¹⁹, referred to here as "FLOR", where "FLOR" stands for 301 Forecast oriented Low Ocean Resolution. This model uses atmospheric physics that are very similar 302 to CM2.1, but has a higher spatial resolution in the atmosphere. The horizontal resolution of the 303 atmosphere and land model is approximately 50 km (versus 200 km in CM2.1). The number of 304 vertical levels in the atmosphere has increased from 24 in CM2.1 to 32 in FLOR. The ocean component 305 of FLOR is similar to that in CM2.1. The third model used is CM3²⁹. This has a similar horizontal spatial 306 resolution as CM2.1, but has substantially increased vertical resolution (48 layers), and includes

307 representations of the indirect effect of aerosols and interactive chemistry. As in the other two

308 models, the horizontal resolution of the ocean component is approximately 1° .

309

310 **Experiments**

311 For each model, simulations over the period 1861-2015 have been conducted in which the model is 312 driven by changing concentrations of atmospheric greenhouse gases, ozone, and aerosols 313 (anthropogenic and volcanic), as well as land use changes and solar irradiance changes. For the 314 period 1861-2005 these are based on observational estimates, while after 2005 they are based on 315 projections using the Radiative Concentration Pathways scenario 4.5 (RCP4.5; see http://cmip-316 pcmdi.llnl.gov/cmip5/forcing.html for details). For CM3 ozone is directly predicted in the model. For 317 each model we conduct ensembles of simulations starting from widely separated points in a long 318 control simulation. Ensemble sizes are 10, 5, and 5 members for CM2.1, FLOR, and CM3 respectively.

319 We call these experiments "HIST".

320

321 A second ensemble of simulations is performed for each model that is identical to the first ensemble

322 described above, except that at each time step an extra pattern of surface heat flux is added to the

323 model ocean. This heat flux has the same spatial signature as the observed NAO, and was derived by

324 computing a linear regression at each grid point between the time series of seasonal mean (Dec-Mar)

325 surface heat flux anomalies from the ECMWF-Interim reanalysis²⁷ and an observed NAO index (Dec-

326 Mar mean; data obtained from NCAR/UCAR Data Climate Guide at

327 https://climatedataguide.ucar.edu/climate-data/hurrell-north-atlantic-oscillation-nao-index-station-

328 based). This pattern therefore yields the surface heat flux anomaly pattern associated with a unit

329 change in the observed NAO index (the pattern is shown in Extended Data Figure 1). The flux 330 anomalies were added only in the months of December-March, the period of maximum deepwater 331 formation in the North Atlantic The pattern of heat flux anomalies was applied only over the Atlantic 332 north of the Equator, up to and including the Greenland and Barents Seas, but excluding the Arctic. 333 The heat flux anomalies were normalized such that their areal integral is zero. The anomalies 334 therefore do not add or subtract heat from the system; they merely rearrange the surface fluxes 335 consistent with the NAO. The heat flux anomalies added each year are calculated as the regression 336 coefficient multiplied by the observed NAO index that year. We call these experiments "HIST+NAO". 337 Additional experiments were performed that also imposed NAO related wind stress anomalies in 338 addition to heat flux anomalies; the primary results of these experiments are consistent with those 339 using only heat flux anomalies.

340

341 We note that the differences between the HIST+NAO experiments and the HIST experiments are 342 primarily attributable to the imposed NAO additional NAO flux anomalies, but we note that each 343 simulation also computes its own internal NAO variability. This internally computed NAO variability 344 acts in addition to the imposed fluxes, and therefore is a source of noise that complicates the 345 interpretation of the results. We have resampled the NAO from long control simulations of each 346 model, and estimate that for these ensemble sizes the 5-95% limits of yearly ensemble mean NAO 347 differences are -0.99 to +0.99. Since our primary results come from extended periods with absolute 348 NAO values greater in one, this analysis suggests that such internal variability is modest compared to 349 the signal from the imposed NAO forcing.

350

351 **Decadal Prediction**

352 Ten-member ensembles of decadal hindcast/prediction experiments have been conducted using the 353 CM2.1 and FLOR models. In these prediction experiments the models are initialized from the 354 observed state of the climate system as estimated using GFDL's Ensemble Coupled Data Assimilation 355 (ECDA) system³⁰. These hindcasts/predictions are initialized on January 1 of each year from 1961 to 356 2015, and the hindcasts/predictions are run for ten years forward in time from that point. The 357 simulations are forced with estimates of observed changes in radiative forcing from 1861 to 2005, 358 and by estimates of forcing based on the Radiative Concentration Pathways scenario 4.5 (RCP4.5; see 359 http://cmip-pcmdi.llnl.gov/cmip5/forcing.html for details) from 2006 onwards. These prediction 360 experiments provide the basis for the AMOC predictions shown in Supplementary Figure S8. 361 362 **Data Availability**

- 363 Source for the observed NAO index: Hurrell, James & National Center for Atmospheric Research Staff
- 364 (Eds). Last modified 20 Oct 2015. "The Climate Data Guide: Hurrell North Atlantic Oscillation (NAO)
- 365 Index (station-based)." Retrieved from https://climatedataguide.ucar.edu/climate-data/hurrell-
- 366 north-atlantic-oscillation-nao-index-station-based. ECMWF-interim reanalysis data²⁷ downloaded
- 367 from http://apps.ecmwf.int/datasets/data/interim_full_moda/. Observed sea ice extent obtained
- 368 from the National Snow and Ice Data Center (http://nsidc.org/data).
- 369

370 **Code availability**

- 371 The source code for the models used in this study is available as follows: CM2.1,
- 372 http://www.gfdl.noaa.gov/accessing-cm2-1p1; FLOR, http://www.gfdl.noaa.gov/cm2-5-and-flor-
- 373 quickstart; CM3, Atmospheric component, http://www.gfdl.noaa.gov/am3.
- 374

