



Anthropogenic aerosol forcing of the AMOC and the associated mechanisms in CMIP6 models

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Abstract. By regulating the global transport of heat, freshwater and carbon, the Atlantic Meridional Overturning Circulation (AMOC) serves as an important component of the climate system. During the late 20th and early 21st centuries, indirect observations and models suggest a weakening of the AMOC. Direct AMOC observations also suggest a weakening during the early 21st century, but with substantial interannual variability. Long-term weakening of the AMOC has been associated with increasing greenhouse gases (GHGs), but some modeling studies suggest the build up of anthropogenic aerosols (AAs) may have offset part of the GHG-induced weakening. Here, we quantify 1900-2020 AMOC variations and assess the driving mechanisms in state-of-the-art climate models from the Coupled Model Intercomparison Project phase 6 (CMIP6). The CMIP6 all forcing (GHGs, anthropogenic and volcanic aerosols, solar variability, and land use/land change) multi-model mean shows negligible AMOC changes up to ~1950, followed by robust AMOC strengthening during the second half of the 20th century (~1950-1990), and weakening afterwards (1990-2020). These multi-decadal AMOC variations are related to changes in North Atlantic atmospheric circulation, including an altered sea level pressure gradient, storm track activity, surface winds and heat fluxes, which drive changes in the subpolar North Atlantic surface density flux. Similar to previous studies, CMIP6 GHG simulations yield robust AMOC weakening, particularly during the second half of the 20th century. Changes in natural forcings, including solar variability and volcanic aerosols, yield negligible AMOC changes. In contrast, CMIP6 AA simulations yield robust AMOC strengthening (weakening) in response to increasing (decreasing) anthropogenic aerosols. Moreover, the CMIP6 all-forcing AMOC variations and atmospheric circulation responses also occur in the CMIP6 AA simulations, which suggests these are largely driven by changes in anthropogenic aerosol emissions. Although aspects of the CMIP6 all-forcing multi-model mean response resembles observations, notable differences exist. This includes CMIP6 AMOC strengthening from ~1950-1990, when the indirect estimates suggest AMOC weakening. The CMIP6 multi-model mean also underestimates the observed increase in North Atlantic ocean heat content. And although the CMIP6 North Atlantic atmospheric circulation responses—particularly the overall patterns—are similar to observations, the simulated responses are weaker than those observed, implying they are only partially externally forced. The possible causes of these differences include internal climate variability, observational uncertainties and model shortcomings—including excessive aerosol forcing. A handful of CMIP6 realizations yield AMOC evolution since 1900 similar to the indirect observations, implying the inferred AMOC weakening from 1950-1990 (and even from 1930-1990) may have a significant contribution from internal (i.e., unforced) climate variability.



ity. Nonetheless, CMIP6 models yield robust, externally forced AMOC changes, the bulk of which are due to anthropogenic aerosols.

1 Introduction

The Atlantic Meridional Overturning Circulation (AMOC) is an important component of the climate system, transporting large amounts of heat and freshwater poleward (Talley, 2008; Buckley and Marshall, 2016). The AMOC exhibits variability on a range of timescales, impacting not only surface temperature, but also precipitation and sea level in several regions (Delworth and Mann, 2000; Knight et al., 2005). The AMOC plays a central role in the climate response to anthropogenic forcing (Drijfhout et al., 2012; Winton et al., 2013; Marshall et al., 2014; Kostov et al., 2014; Marshall et al., 2015; Liu et al., 2020), and has also likely played a key role in past rapid climate change and paleoclimate shifts (Broecker, 1997).

Since April 2004, the AMOC has been directly monitored at 26.5°N by the RAPID array (McCarthy et al., 2012). The RAPID array shows a strong decline in the first part of the record and a slower increase afterwards. This record suggests an overall AMOC decline at a rate as high as 0.4 Sv yr⁻¹ (Smeed et al., 2014; Sévellec et al., 2017; Smeed et al., 2018; Frajka-Williams et al., 2019). The causes of this recent AMOC slow-down remain highly debated, and may be related to natural decadal variability (Zhao and Johns, 2014; Jackson et al., 2016; Yan et al., 2018). However, longer-term evidence, including sea surface temperature fingerprints and coral-based proxies, also suggest AMOC weakening—by about 0.2 Sv decade⁻¹ during the 20th century—as part of climate change (Rahmstorf et al., 2015; Caesar et al., 2018).

Although climate models disagree on the precise magnitude of the AMOC weakening—and differ substantially in their representation of the strength and depth of the AMOC—model simulations predict AMOC weakening in response to increasing greenhouse gases (Gregory et al., 2005; Solomon et al., 2007; Drijfhout and Hazeleger, 2007; Cheng et al., 2013; Kirtman et al., 2013; Kostov et al., 2014). By the end of the 21st century, for example, models estimate a 24-39% decline in the AMOC, with larger weakening under larger increases in future GHG emissions (Weijer et al., 2020). This has been related to reduced ocean heat loss, and secondarily through increased freshwater input at high latitudes, both of which decrease the density of sea water in the subpolar North Atlantic (i.e., the sinking region) (Thorpe et al., 2001). For example, decreased Arctic sea-ice, via positive buoyancy anomalies caused by anomalous surface heat and freshwater fluxes, may help explain weakening of the AMOC (Sévellec et al., 2017; Liu et al., 2019). Warming of the tropical Indian Ocean—by means of atmospheric teleconnections and changes in ocean salinity and circulation—may exert a stabilizing effect on the AMOC, attenuating its recent weakening (Hu and Fedorov, 2019). Overall, our understanding of how anthropogenic perturbations impact the AMOC remain limited.

There is considerable debate on the role of anthropogenic aerosols in driving North Atlantic climate variability. One study argued anthropogenic aerosols are the dominant driver of Atlantic Multidecadal Variability (a broad term encompassing Atlantic climate variability), primarily through aerosol-cloud interactions and modification of net surface shortwave radiation (Booth et al., 2012). However, this result was based on a single climate model, the Hadley Centre Global Environmental Model version 2, Earth System configuration (HadGEM2-ES). Subsurface inconsistencies between observations and HadGEM2-ES were also



noted, and long-term trends in sea surface temperatures may be too sensitive to HadGEM2-ES' aerosol loading (Zhang et al., 2013). Others have also suggested a role of anthropogenic forcing, including aerosols, in driving Atlantic Multidecadal Variability (Evan et al., 2009; Otterå et al., 2010; Chang et al., 2011; Allen et al., 2015; Murphy et al., 2017; Bellomo et al., 2018). Anthropogenic aerosols may also impact the AMOC, including strengthening the AMOC and increasing the northward cross-equatorial ocean heat transport (Delworth and Dixon, 2006; Cai et al., 2006, 2007; Cowan and Cai, 2013; Collier et al., 2013; Menary et al., 2013; Cheng et al., 2013). Menary et al. (2013)—using the same HadGEM2-ES model discussed above—finds AMOC strengthening in response to increasing anthropogenic aerosols. They argue that this is primarily driven by increased salinification of the North Atlantic subpolar gyre via increased evaporation, decreased flux of ice through the Fram Strait and increased salt advection from the subtropical Atlantic. This study, like many of the earlier studies, relies on a single climate model. Very recently, however, Menary et al. (2020) use the new Coupled Model Intercomparison Project phase 6 (CMIP6) (Eyring et al., 2016) archive to show a $\sim 10\%$ AMOC strengthening from 1850-1985, which they attribute to aerosol forcing.

The newest generation of coupled climate and earth system models, CMIP6, represents a significant opportunity to evaluate the role of external forcing, including anthropogenic aerosols, on North Atlantic climate and the AMOC. Similar to the very recent results of Menary et al. (2020), we show that a large suite of state-of-the-art climate models simulate robust strengthening of the AMOC from ~ 1950 -1990, and that this response is largely driven by anthropogenic aerosols. Furthermore, CMIP6 models yield robust AMOC weakening from ~ 1990 -2020, with anthropogenic aerosols again playing an important role. We also show that these responses are related to atmospheric circulation changes, including an altered sea level pressure gradient, storm track, surface winds and heat fluxes, which ultimately drive changes in the surface density flux in the subpolar North Atlantic.

2 Methods

2.1 AMOC Calculation

The AMOC is defined as the maximum stream function (ψ) below 500 m at 28°N in the Atlantic Ocean. It is calculated by integrating the northward sea water velocity (vo) with depth, z , along the western (x_w) to the eastern boundaries (x_e) of the Atlantic Ocean:

$$\psi(z) = \int_z^0 \int_{x_w}^{x_e} vo(x, z') dx dz'. \quad (1)$$

The AMOC percent change is estimated from the least-squares regression slope (r_s) of the non-normalized AMOC time series using: $100 \times \frac{r_s \times N}{AMOC(N=1)}$, where N is the number of years (e.g., 30 for 1990-2020) and $AMOC(N=1)$ is the initial AMOC strength (e.g., in 1990 for 1990-2020). The quoted AMOC percent change uncertainties are estimated as the standard error, defined as $\frac{\sigma}{\sqrt{n_m}}$, where σ represents the standard deviation across each model mean AMOC percent change and n_m is the number of models.



Following prior work, we estimate an inferred AMOC as the subpolar North Atlantic (45-60°N and 0-50°W) minus the
90 Northern Hemisphere (0-60°N and 0-360°) surface temperature anomaly, scaled by 2.3 Sv K⁻¹ (Rahmstorf et al., 2015). Our
inferred AMOC conclusions are qualitatively the same with alternative scalings (Caesar et al., 2018), since we apply the same
scaling to both observations and CMIP6.

2.2 SDF Calculation

The surface density flux (SDF) indicates the loss or gain of density (buoyancy) of the ocean surface due to thermal (radiation,
95 sensible and latent heat) and haline (sea-ice melting/freezing, brine rejection, precipitation minus evaporation) exchanges (Liu
et al., 2017, 2019). An increase in subpolar North Atlantic SDF is associated with strengthening of the AMOC; a decrease in
SDF is associated with weakening of the AMOC. Surface density flux is define as:

$$SDF = -\alpha \frac{SHF}{c_p} - \rho(0, SST) \beta \frac{SFWF \times SSS}{1 - SSS}, \quad (2)$$

where c_p , SST, and SSS are the specific heat capacity and sea surface temperature and salinity, respectively; α and β are
100 thermal expansion and haline contraction coefficients; and $\rho(0, SST)$ is the density of freshwater with a salinity of zero and
the temperature of SST. SHF represents the net surface heat flux into ocean (positive downward), which is estimated as a sum
of shortwave (SW) and longwave (LW) radiation, sensible (SHFLX) and latent (LHFLX) heat fluxes, and heat fluxes from
sea ice melting and other minor sources. SFWF represents net surface freshwater flux into ocean (positive downward) and is
estimated as precipitation + runoff + ice melting – evaporation. The first term $-\alpha \frac{SHF}{c_p}$ represents the thermal contribution
105 (TSDF); the second term $-\rho(0, SST) \beta \frac{SFWF \times SSS}{1 - SSS}$ represents the haline contribution (HSDF) to the density flux.

2.3 OHC Calculation

The ocean heat content (OHC) is estimated from the ocean potential temperature for each model vertical level. It is derived by
spatially integrating over the North Atlantic (0-60°N; 7.5-75°W) upper-ocean (0-700 m) (e.g., Zhang et al., 2013), and then
multiplying by reference values for sea water density (ρ) and specific heat capacity (C) of 1025 kg m⁻³ and 3985 J kg⁻¹ K⁻¹,
110 respectively (Palmer and McNeall, 2014). Ocean heat content is calculated for each vertical level according to the following
equation:

$$\Phi_z = \sum_{i,j} \rho C \theta_{i,j,z} V_{i,j,z}, \quad (3)$$

where Φ_z is the ocean heat content for model vertical level, z ; θ is the potential temperature at that vertical level; V is the
grid cell volume; and i, j are the latitudes and longitudes that cover the North Atlantic. Equation (3) is subsequently integrated
115 throughout the upper ocean (0-700 m) to get the North Atlantic upper ocean heat content, with units of Joules.

Observed OHC data comes from NOAA National Centers for Environmental Information (NCEI). This observed upper-
ocean heat content is derived from a yearly averaged dataset of objectively analyzed ocean temperature anomalies since 1955
(Levitus et al., 2012).



2.4 Decomposition of Latent and Sensible Heat Fluxes

120 Using Monin-Obukhov similarity theory (Monin and Obukhov, 1954), latent (LHFLX) and sensible (SHFLX) heat fluxes can be decomposed into wind, moisture and temperature components according to:

$$LHFLX = -L_v \rho_{air} u_* q_* \quad (4)$$

$$SHFLX = -c_{p,air} \rho_{air} u_* \theta_* \quad (5)$$

125 where L_v is the latent heat of vaporization; $c_{p,air}$ is the specific heat capacity of air at constant pressure; ρ_{air} is the surface air density; u_* is the surface velocity scale (m s^{-1} , also referred to as the surface friction velocity); q_* is the surface humidity scale (kg kg^{-1}); and θ_* is the surface temperature scale (K) (Grachev and Fairall, 1997; Maronga, 2014). The velocity scale can be estimated from observed or simulated surface wind stress (τ) as $u_* = \sqrt{\frac{|\tau|}{\rho_{air}}}$. Given values for latent and sensible heat fluxes and Eqs. (4-5), the moisture and temperature scales can be calculated as the residual. The validity of this methodology
130 has been verified in MERRA2, where all fields (e.g., u_* , q_* , θ_* , and the surface heat fluxes) are archived.

LHFLX and SHFLX trends can then be decomposed into wind, moisture and temperature components according to:

$$\delta LHFLX \approx -L_v \rho_{air} (u_{c*} \delta q_* + q_{c*} \delta u_*) \quad (6)$$

$$\delta SHFLX \approx -c_{p,air} \rho_{air} (u_{c*} \delta \theta_* + \theta_{c*} \delta u_*) \quad (7)$$

135 where δ represents the trend and u_{c*} , q_{c*} and θ_{c*} represent climatological values at each grid box. ρ_{air} is assumed to be constant for each grid box. Cross checking the estimated and actual LHFLX and SHFLX trends shows very close agreement. The first (second) term in Eq. (6) represents the moisture (wind) component of $\delta LHFLX$. Similarly, the first (second) term in Eq. (7) represents the temperature (wind) component of $\delta SHFLX$.

2.5 Storm Track Activity

140 We define the extratropical cyclone (storm track) activity using temporal variance statistics, band-pass filtered using a 24-hour difference filter (Chang et al., 2015; Allen and Luptowitz, 2017):

$$pp = \overline{[PSL(t+24hour) - PSL(t)]^2}, \quad (8)$$

where PSL is the daily sea level pressure and pp is the 24-hour difference filtered variance of sea level pressure. The overbar corresponds to time averaging over each year.



145 2.6 Anthropogenic Aerosol Effective Radiative Forcing

Anthropogenic aerosol Effective Radiative Forcing (ERF) is estimated from the net top-of-the-atmosphere (TOA) radiative fluxes (the sum of net longwave and shortwave fluxes) using ~ 30 years of data from fixed sea surface temperature (SST) simulations (Forster et al., 2016). More specifically, anthropogenic aerosol ERF is the net TOA radiative flux difference between piClim-Control and piClim-aer simulations (i.e., piClim-aer – piClim-Control). These two simulations are identical in all ways
150 except piClim-Control features preindustrial aerosol and precursor gas emissions whereas piClim-aer features present-day (i.e., 2014) aerosol and precursor gas emissions. Twelve models are available for the aerosol ERF calculation. The transient anthropogenic aerosol ERF is calculated in a similar fashion, using the histSST and histSST-piAer experiments. Only three models are available for the transient aerosol ERF calculation, including MIROC6, UKESM1-0-LL, and NorESM2-LM, and these simulations end in 2014.

155 2.7 Trend and Correlation Significance

Multi-model ensemble mean trends are based on the ensemble mean time series for each model. All time series are normalized by subtracting each model's long-term (1900-2020) climatology. Trends are based on a least-squares regression and significance is based on a standard t -test. The lead-lag correlation analysis is based on Pearson's correlation coefficient. The 95% confidence intervals for the lead-lag correlations are estimated by first transforming the Pearson's correlation coefficient (r) to
160 a Fisher's z -score (r_z). The corresponding standard error of the z distribution is defined as: $\sigma_z = \frac{1}{\sqrt{N-3}}$, where N is the number of years. The confidence interval under the transformed system is calculated as: $r_z \pm z_{\frac{\alpha}{2}} \times \sigma_z$, where $z_{\frac{\alpha}{2}}$ is calculated from the inverse of the cumulative distribution function and α is 0.05 for a 95% confidence interval. The transformation is reversed to obtain the lower and upper bounds of the confidence interval. Similar lead-lag correlation results are obtained under detrended and non-detrended time series.

165 3 Results

3.1 CMIP6 All Forcing Simulations

Figure 1a shows the 1900-2020 CMIP6 all forcing ensemble mean normalized AMOC time series based on 24 models and 95 realizations (Supplementary Figure 1 shows the models and number of realizations used). Relatively small change occurs up to ~ 1950 , after which the AMOC strengthens through ~ 1990 , and then rapidly weakens through present-day (2020). 83% (92%)
170 of the models yield a positive (negative) AMOC trend from 1950-1990 (1990-2020). The 1950-1990 (1990-2020) ensemble mean strengthening (weakening) represents a 7.7 ± 1.6 (-11.4 ± 1.8) percent change (Supplementary Figure 1). These and all subsequent percent changes are relative to the beginning year of the time period (Methods Section). As these multi-decadal AMOC variations are based on the ensemble mean from a relatively large number of models, they are not due to internal climate variability. Instead, they are driven by external forcing.



175 We note that the non-normalized climatological AMOC strength varies considerably across CMIP6 models (Supplementary
Table 1). Over the present-day (2005-2018), the CMIP6 simulated AMOC ranges from 9.1 Sv (NESM3) to 30.3 Sv (NorESM2-
MM). The corresponding multi-model mean AMOC strength and one-sigma uncertainty across models is 19.8 and 5.6 Sv,
respectively (similar values are obtained over the entire 1900-2020 time period at 20.5 and 5.8 Sv). This is similar to but
somewhat larger than that from the RAPID array at 17.5 Sv with an interannual standard deviation of 1.4 Sv. Re-estimating
180 Fig. 1a using only those models that simulate a climatological AMOC strength within one standard deviation of the RAPID
observations (i.e., 16.1 to 18.9 Sv) yields 8 models. This model subset yields similar 1950-2020 results, including AMOC
strengthening from ~1950-1990, followed by weakening (not shown).

The AMOC is related to surface density fluxes in the subpolar North Atlantic (Liu et al., 2019, 2017), which modulate
deepwater formation in the deep convection region. We define the subpolar North Atlantic region as 45-60°N and 0-50°W. We
185 get similar results with alternate definitions of the subpolar North Atlantic region (e.g. 45-65°N and 10-60°W). Figure 1 also
includes the corresponding time series for the subpolar North Atlantic surface density flux (SDF), as well as its thermal (TSDF)
component. The AMOC and SDF exhibit similar multi-decadal variations, including an increase (decrease) from ~1950-1990
(1990-2020). Moreover, most of the temporal variation in SDF is consistent with TSDF. The haline SDF component (HSDF)
is two orders of magnitude weaker (not shown). Multi-decadal variations in TSDF are largely consistent with latent (LHFLX)
190 and sensible (SHFLX) heat fluxes (Fig. 1d-e). Similar temporal evolution also occurs for the subpolar North Atlantic surface
wind (SFWD), which is a component of both LHFLX and SHFLX. Moreover, the sea level pressure gradient (dPSL) between
Europe (30-45°N and 0-30°E) and the subpolar North Atlantic also exhibits similar temporal evolution consistent with surface
wind variations (Fig. 1g-h), as does the subpolar North Atlantic extratropical cyclone (storm track) activity (Fig. 1i-j). We also
mention here that the multi-decadal evolution of these variables is generally out of phase with the subpolar North Atlantic net
195 downward surface shortwave radiation (SW; Fig. 1f).

Figure 2 shows subpolar North Atlantic lead-lag Pearson correlations (r ; Methods Section) based on the CMIP6 all forcing
annual mean ensemble mean. The subpolar North Atlantic 550 nm aerosol optical thickness (AOT; a measure of the extinction
of radiation by aerosols) and SW exhibit the maximum correlation at -0.89 with zero lag (Fig. 2a). The subpolar North
Atlantic net surface shortwave radiation and AMOC exhibit maximum correlation at -0.84 , with SW leading the AMOC
200 by ~ 12 years (Fig. 2b). Similarly, the subpolar North Atlantic net surface shortwave radiation and surface temperature are
maximally correlated at 0.90 with zero lag (Fig. 2c); and surface temperature and AMOC have maximum correlation of -0.85 ,
with AMOC leading by ~ 12 years (Fig. 2d). Thus, the subpolar North Atlantic net surface shortwave radiation and surface
temperature are temporally in sync with aerosol optical thickness, all three of which lead the AMOC by ~ 12 years.

Figure 2e shows that the Europe-subpolar North Atlantic sea level pressure gradient and the subpolar North Atlantic surface
205 wind have a maximum (and significant) correlation of 0.69 at zero lag, which is consistent with geostrophy. Similarly, maximum
correlations at zero lag occur between subpolar North Atlantic surface wind and surface density flux ($r = 0.86$; Fig. 2g) and
between the Europe-subpolar North Atlantic sea level pressure gradient and subpolar surface density flux ($r = 0.58$; Fig. 2i).
Similar results exist between both the sea level pressure gradient and surface wind and the thermal component of the surface
density flux; the thermal component of the surface density flux also shows a maximum and significant correlation at zero



210 lag with latent ($r = 0.79$) and sensible ($r = 0.94$) heat fluxes (not shown). Thus, the Europe-subpolar North Atlantic pressure
gradient, as well as the subpolar North Atlantic surface wind and surface density and heat fluxes are temporally in sync and
significantly correlated. These responses are similar to, and generally consistent with, North Atlantic Oscillation (NAO)-like
variability driving air-sea fluxes (Eden and Jung, 2001). However, correlations between these variables (i.e., SDF, SFWD, and
dPSL) and the AMOC all have maximum (and significant) correlations at a 4-5 year lead, ranging from 0.66 to 0.78 (Fig. 2f,h,j).
215 The 5-year lead correlation where the subpolar North Atlantic surface density flux leads and AMOC is likely related to signal
propagation via Kelvin waves/boundary currents, which impact the AMOC in the lower latitudes (e.g., 28°N) (Kawase, 1987;
Huang et al., 2000; Johnson and Marshall, 2002; Cessi et al., 2004; Zhang, 2010).

Figure 3 shows that the Europe-subpolar North Atlantic sea level pressure gradient and the subpolar North Atlantic surface
wind, and surface density are significantly correlated with the net downward surface shortwave radiation and surface temper-
220 ature, with the latter two variables leading by 6-8 years. For example, the maximum correlation between the subpolar North
Atlantic surface temperature and the Europe-subpolar North Atlantic sea level pressure gradient is -0.67 at a 6-year lag (Fig-
ure 3a). Similarly, the maximum correlation between the subpolar North Atlantic net downward surface shortwave radiation
and the Europe-subpolar North Atlantic sea level pressure gradient is -0.65 at a 6-year lag (Figure 3b). Similar, but somewhat
stronger correlations exist between the subpolar North Atlantic surface temperature/net downward surface shortwave radiation
225 and both surface wind and surface density flux.

Reasons for the delay between changes in the subpolar North Atlantic surface temperature/shortwave radiation and the
subsequent pressure gradient/surface wind responses are not clear. We do note, however, that this appears to be a robust
relationship. Figure 4 shows CMIP6 ensemble mean 1950-2020 spatial correlation maps between the net downward surface
shortwave radiation and sea level pressure, including temporally in sync correlations (i.e., not lagged), and with PSL lagged
230 by 7 years (based on Fig. 3b). In both cases, significant negative correlations occur over Europe (and North America), implying
an increase in surface shortwave radiation is associated with a decrease in European sea level pressure (and vice versa). This
is consistent with an increase in net surface shortwave radiation and enhanced heating driving a reduction in surface pressure
(and vice versa), particularly over the continents where the change in anthropogenic aerosol emissions is largest. Although
significant positive correlations occur over the subpolar North Atlantic under both cases—implying an increase (decrease) in
235 surface shortwave radiation is associated with weakening (strengthening) of the Icelandic Low—this signal is much stronger
when PSL is lagged by 7 years. Thus, an increase (decrease) in surface shortwave radiation is associated with weakening
(strengthening) of the climatological pressure gradient between the subpolar North Atlantic and Europe (see also Fig. 1).

To summarize these results, the subpolar North Atlantic net downward surface shortwave radiation, surface temperature and
aerosol optical thickness lead the Europe-subpolar North Atlantic sea level pressure gradient and the subpolar North Atlantic
240 surface wind, surface density and heat fluxes by 6-8 years (and the AMOC by 12 years); the Europe-subpolar North Atlantic
sea level pressure gradient and the North Atlantic surface wind and surface density and heat fluxes lead the AMOC by 4-5
years. Although a correlation analysis does not show causation, this analysis suggests that AMOC multi-decadal variability is
initiated by North Atlantic aerosol optical thickness perturbations to net surface shortwave radiation and surface temperature,



245 which subsequently affect the sea level pressure gradient and surface wind—and via latent and sensible heat fluxes—the surface density flux through its thermal component.

Figure 5 shows the 1990-2020 CMIP6 all forcing ensemble mean annual mean spatial trend map, and the corresponding model agreement on the sign of the trend, for the surface density flux and its thermal component. Consistent with Fig. 1, SDF significantly decreases from 1990-2020 in the subpolar North Atlantic, with high (80-100%) model agreement (Fig. 5a,b). Most of this SDF decrease is driven by the thermal component (Fig. 5c,d). The haline component yields very weak increases (Supplementary Figure 2). Moreover, decomposing the thermal SDF into its respective components shows that latent and sensible heat fluxes are the dominant drivers (Supplementary Figure 2). Consistently, the CMIP6 all forcing 1990-2020 ensemble mean surface wind trend—a component of latent and sensible heat fluxes—shows significant reductions with high (80-100%) model agreement in the subpolar North Atlantic. These surface wind trends are consistent with the corresponding PSL trends, including a weakened Europe-subpolar North Atlantic pressure gradient (Fig. 5e-h), as well as a decrease in subpolar North Atlantic extratropical cyclone (storm track) activity (Fig. 5i-j). Near opposite changes occur from 1950-1990 (Supplementary Figure 3). Similar trend patterns from reanalyses and observations also exist, including the subpolar North Atlantic sea level pressure, surface winds and latent and sensible heat fluxes (Supplementary Figures 4-6). However, dissimilarities in magnitude exist, suggesting these responses are only partially externally forced.

Using Monin-Obukhov similarity theory (Monin and Obukhov, 1954), latent and sensible heat fluxes can be further decomposed into wind, moisture and temperature components (Methods Section). Supplementary Figures 7-8 shows the importance of wind changes to latent and sensible heat fluxes, and in turn, the thermal component of the SDF. Thus, our results suggest that strengthening (weakening) of the AMOC from ~1950-1990 (1990-2020) is due to strengthening (weakening) of the surface winds in the subpolar North Atlantic (consistent with the altered sea level pressure gradient), which in turn leads to increases (decreases) in surface density flux through increases (decreases) in surface latent and sensible heat fluxes.

265 CMIP6 all forcing simulations show that multi-decadal variability of the subpolar North Atlantic net surface shortwave radiation and aerosol topical thickness lead the AMOC, as well as the atmospheric circulation (e.g., dPSL and SFWD) and SDF (Fig. 2-3). This suggests changes in anthropogenic aerosols are important drivers of North Atlantic atmospheric circulation and AMOC multi-decadal variability. Beginning near the middle of the 20th century and lasting for several decades, global anthropogenic and chemically reactive gas emissions grew quickly, particularly from North America and Europe (Hoesly et al., 270 2018). In the later parts of the 20th century, while emissions from Asia continued to grow, European and North American sulfate emissions declined as a result of emission control policies. Supplementary Figures 9-10 show a consistent evolution of North Atlantic SW, AOT and anthropogenic aerosol effective radiative forcing (ERF; Methods Section). This includes relatively rapid increases in AOT and corresponding decreases in SW and ERF beginning in ~1940 and lasting until ~1980, and opposite changes afterwards (i.e., about 10 years prior to the AMOC responses; Fig. 2a-b), particularly over Europe.

275 3.2 CMIP6 Anthropogenic Aerosol Simulations

Figure 6a shows the 1900-2020 CMIP6 anthropogenic aerosol (AA) ensemble mean normalized AMOC time series based on 8 models and 43 realizations (Supplementary Figure 11 shows the models and number of realizations used). The evolution of the



AMOC in CMIP6 AA simulations is similar to that in the corresponding all forcing simulations, in particular the strengthening from ~ 1950 to 1990, and weakening afterwards. 88% (100%) of the models yield a positive (negative) AMOC trend from 1950-1990 (1990-2020). The 1950-1990 (1990-2020) ensemble mean strengthening (weakening) represents a 8.8 ± 2.3 (-7.1 ± 1.6) percent change (Supplementary Figure 11). Figure 6 also shows that from ~ 1950 -2020, surface density and heat fluxes, as well as the sea level pressure gradient, storm track activity, and surface wind follow a similar evolution as in the CMIP6 all forcing simulations. CMIP6 AA experiments also exhibit similar lead-lag relationships as in the CMIP6 all forcing simulations (not shown).

We note that fewer CMIP6 AA (as compared to all forcing) models are available. Similar CMIP6 all forcing results as described above are generally obtained when the same 8 CMIP6 models in common between CMIP6 all forcing and CMIP6 AA are used. For example, the 1990-2020 AMOC weakening based on the original 24 all forcing models yields a percent change of -11.4 ± 1.8 . Using the 8 model subset yields similar results, at -12.9 ± 2.4 (Supplementary Figure 12). The 8 model CMIP6 all forcing subset yields somewhat weaker 1950-1990 AMOC strengthening (6.1 ± 1.6 versus 4.7 ± 1.4 percent change; Supplementary Figure 12).

The close correspondence between the CMIP6 AA and all forcing ensemble mean AMOC time series since ~ 1950 again suggests anthropogenic aerosols are driving much of the response. This is further supported by looking at the CMIP6 greenhouse gas (GHG) and natural forcing ensemble mean AMOC time series. The CMIP6 GHG ensemble mean annual mean AMOC shows long-term weakening, whereas natural forcing yields negligible long-term change (Supplementary Figures 13-14). Over 1990-2020, the CMIP6 GHG AMOC weakening represents a -6.7 ± 0.8 percent change, which is comparable to the AMOC weakening under CMIP6 AA (-7.1 ± 1.6 ; Supplementary Figure 11). Thus, ~ 1950 -1990 AMOC strengthening in CMIP6 all forcing simulations is largely controlled by anthropogenic aerosols; from 1990-2020, both anthropogenic aerosols and GHGs contribute to AMOC weakening.

Figure 7 shows the 1990-2020 CMIP6 AA ensemble mean annual mean trends and the model agreement on the sign of the trend for the surface density flux and its thermal component, as well as the atmospheric variables (e.g., SFWD). Responses are again very similar to the corresponding CMIP6 all forcing simulations, further supporting the importance of anthropogenic aerosols. The CMIP6 AA ensemble mean shows a decrease in SDF that is largely driven by TSDF (Fig. 7a-d), weakening of the Europe-subpolar North Atlantic pressure gradient (Fig. 7e,f), a corresponding decrease in the subpolar North Atlantic surface wind (Fig. 7g-h), and a decrease in the subpolar North Atlantic storm track activity (Fig. 7i-j). Also consistent with CMIP6 all forcing simulations are near opposite changes in these variables from 1950-1990 (Supplementary Figure 15; see also Supplementary Figures 4-5). And furthermore, Supplementary Figures 7-8 shows the importance of wind changes to latent and sensible heat fluxes, and in turn, the thermal component of the SDF in CMIP6 AA simulations. The AMOC strengthening in response to increasing anthropogenic aerosol forcing is consistent with prior studies (Delworth and Dixon, 2006; Cai et al., 2006, 2007; Cowan and Cai, 2013; Collier et al., 2013; Menary et al., 2013; Cheng et al., 2013). However, unlike Menary et al. (2013) who used the HadGEM2-ES model, we do not find strong evidence that increased salinification is the dominant driving factor.



4 Discussion

Models will continue to have uncertainties, including those relevant to the AMOC and North Atlantic climate. These include biases in the mean state, as well as their representation of the strength and depth of the AMOC (e.g., Supplementary Table 1) and ocean freshwater transport (Rahmstorf, 1996; Drijfhout et al., 2011; Danabasoglu et al., 2014; Kostov et al., 2014; Danabasoglu et al., 2016). For example, in many CMIP3/5 models, the AMOC imports freshwater into the Atlantic, in opposition to observations, likely resulting in an artificially stable AMOC (Liu et al., 2017). Models also lack realistic melting of the Greenland ice sheet and the corresponding freshening of the North Atlantic (Bakker et al., 2016).

The CMIP6 AMOC response may be too sensitive to anthropogenic aerosol forcing (e.g., Zhang et al., 2013) and CMIP6 models may also overestimate aerosol indirect effects (e.g., Toll et al., 2019). However, anthropogenic aerosol ERF estimates are consistent between CMIP6 and recent observational estimates, with 90% confidence intervals of -1.5 to -0.6 and -2.0 to -0.4 W m^{-2} , respectively (Bellouin et al., 2020; Smith et al., 2020). It is also notable that the aerosol ERF in CMIP5 models, with a 90% confidence interval of -1.8 to -0.2 W m^{-2} (Allen, 2015), is similar to that (but with a larger range) in CMIP6 models. The mean and standard deviation of the anthropogenic aerosol ERF in 12 CMIP6 models (Supplementary Table 2) are -0.98 and 0.24 W m^{-2} , respectively. The corresponding values in 18 CMIP5 models are -1.0 and 0.44 W m^{-2} , respectively (Allen, 2015). In contrast, Menary et al. (2020) argues the larger 1850-1985 AMOC weakening in CMIP6 models, relative to CMIP5, is due to stronger anthropogenic aerosol forcing in CMIP6. There, they show a robust relationship between AMOC strength and a proxy for aerosol forcing—the interhemispheric difference of net top-of-the-atmosphere shortwave radiation.

There is some evidence that the magnitude of the AMOC trends in CMIP6 models is related to a model's anthropogenic aerosol ERF—particularly over Europe—which again supports the importance of changes in European aerosols. The correlation (over model means and using the 12 models with aerosol ERF; Supplementary Table 2) between the global mean aerosol ERF and AMOC trend yields the expected negative (positive) correlation from 1950-1990 (1990-2020), implying models with a larger global mean aerosol ERF yield larger AMOC strengthening (weakening). However, these correlations are not significant at the 95% confidence level, at -0.29 for 1950-1990 and 0.11 for 1990-2020. Somewhat larger, but still non-significant, correlations between European aerosol ERF and AMOC trends exist at -0.38 for 1950-1990 and 0.26 for 1990-2020. Ideally, the transient aerosol ERF should be used for this calculation, but this quantity is only available for 3 models. Similar conclusions are also obtained if we divide the CMIP6 models into two groups, one with a larger (absolute value) global mean anthropogenic aerosol ERF (ERF_{HI} ; 7 model mean aerosol ERF of -1.17 W m^{-2}), and the other with a smaller global mean aerosol ERF (ERF_{LO} ; 5 model mean aerosol ERF of -0.72 W m^{-2}). From 1950-1990, ERF_{HI} (ERF_{LO}) models yield AMOC strengthening that represents a 7.4 ± 1.4 (4.7 ± 2.1) percent change. From 1990-2020, ERF_{HI} (ERF_{LO}) models yield AMOC weakening that represents a -14.6 ± 1.6 (-11.3 ± 2.6) percent change (Supplementary Table 2).

The CMIP6 all forcing ensemble mean reproduces the observed Northern Hemisphere (0 - 60°N ; 0 - 360°E) and the North Atlantic (0 - 60°N ; 0 - 75°W) surface temperature evolution, particularly from 1950-2020 (Figure 8a,b). However, discrepancies exist in the evolution of the subpolar North Atlantic surface temperature, most notably from ~ 1970 -1990 (Figure 8c). This may not be surprising, since this also overlaps with the 1950-1990 time period, when evolution of the CMIP6 AMOC differs



from inferred (i.e., surface temperature based) AMOC observations (Methods Section). Consistently, similar discrepancies exist between inferred AMOC trends in CMIP6 and observations (Figure 8d). The CMIP6 multi-model mean shows significant 1950-1990 strengthening ($0.03 \text{ Sv year}^{-1}$) whereas observations show significant weakening ($-0.03 \text{ Sv year}^{-1}$). The sign of the inferred AMOC trend after 1990 is in better agreement between CMIP6 ($-0.07 \text{ Sv year}^{-1}$) and observations ($-0.02 \text{ Sv year}^{-1}$), where both show weakening. However, the observed 1990-2020 AMOC trends are weaker than the CMIP6 multi-model mean and not-significant (at the 95% confidence interval), due in part to a brief strengthening in the early to mid-1990s.

Although these CMIP6 inferred AMOC trends are comparable to the actual CMIP6 AMOC trends, there are also notable differences. The CMIP6 all forcing ensemble mean 1950-1990 inferred AMOC trend is weaker than the actual CMIP6 AMOC trend (25% weaker, 0.03 versus $0.04 \text{ Sv year}^{-1}$). And moreover, there is less model agreement for the CMIP6 1950-1990 inferred AMOC strengthening, as compared to the actual AMOC (62 versus 83%, respectively). CMIP6 1990-2020 inferred and actual AMOC trends are both significant and similar in magnitude (-0.07 versus $-0.08 \text{ Sv year}^{-1}$, respectively), as is the model agreement (92% for both).

Thus, CMIP6 and observations both suggest AMOC weakening after 1990. However, disagreement exists for 1950-1990, where inferred AMOC observations show significant weakening, but CMIP6 shows significant strengthening. Moreover, disagreement exists between the CMIP6 1950-1990 actual and inferred AMOC trend, with the inferred AMOC yielding weaker and less robust strengthening. These discrepancies warrant further clarification, but they suggest that the 1950-1990 inferred AMOC in observations may yield excessive weakening (relative to the actual AMOC). A recent study suggests that the North Atlantic cooling is not only related to a weaker AMOC, but also northward heat transport. So, inferred AMOC estimates from sea surface temperature are prone to error, and they are not solely a measure of the AMOC (Keil et al., 2020). We do note, however, that multiple proxy observations, support AMOC weakening during 1950-1990 (Chen and Tung, 2018). In addition to these AMOC differences, the CMIP6 multi-model mean also underestimates the magnitude of observed increase in North Atlantic upper ocean heat content (Fig. 8e).

The inferred AMOC weakening from 1950-1990 (and even from 1930-1990) may have a significant contribution from internal (i.e., unforced) climate variability. Figure 9a shows CMIP6 AMOC trends for each individual model realization for four time periods, 1950-1990, 1990-2020, 1930-2020, as well as 1930-1990. Also included are the corresponding inferred AMOC trends based on surface temperature observations. Some individual model realizations are able to reproduce the inferred AMOC trends, including the 1950-1990 weakening, as well as weakening over the longer 1930-1990 time period. 8.6% (8 of 92) and 13% (12 of 92) of the model realizations yield 1950-1990 and 1930-1990 AMOC weakening that falls within the observational uncertainty (which includes 5 and 12 different models, respectively). For the inferred AMOC strengthening from 1990-2020, 41.3% (38 of 92) of the model realizations are within the observational uncertainty (which includes 13 models).

There are 5 realizations from two different CMIP6 models (CanESM5 and IPSL-CM6A-LR) that yield AMOC trends that fall within the observational uncertainty for all four time periods. Figure 9b shows that the corresponding ensemble mean AMOC for these 5 realizations better resembles the inferred AMOC evolution since 1900, including strengthening during the first few decades, followed by a prolonged weakening, a relatively brief strengthening, and then subsequent weakening. Furthermore, these 5 realizations also better simulate the increase in North Atlantic upper ocean heat content (Fig. 9c). Differences



remain, however, including a \sim decade delay in the initial AMOC weakening (inferred weakening begins in the 1930s but these models show weakening commences in the 1940s), as well as an earlier (and brief) strengthening during the late-20th century (inferred strengthening begins in the 1990s but these models show weakening commences in the 1980s). We note that both of these models underestimate the climatological AMOC strength relative to RAPID observations (17.5 ± 1 -standard deviation
385 of 1.4 Sv versus 11.6 Sv for IPSL-CM6A-LR and 13.1 Sv for CanESM5; Supplementary Table 1). Although no significant AMOC differences were found between the ERF_{HI} and ERF_{LOW} subsets, it is interesting to note that IPSL-CM6A-LR and CanESM5 have 2 of the lowest 5 CMIP6 anthropogenic aerosol ERFs (Supplementary Table 2). It is also possible that the reason why these two models stand out is because they have a relatively large number of realizations (11 and 10, respectively; Supplementary Figure 1), which simply increases the chances of a simulated AMOC evolution comparable to that observed.

390 5 Conclusions

CMIP6 models yield consistent multi-decadal AMOC variability, including strengthening from \sim 1950-1990, followed by weakening from 1990-2020. These AMOC variations are related to robust changes in the North Atlantic atmospheric circulation, involving sea level pressure, storm track activity, surface winds and latent and sensible heat fluxes. Anthropogenic aerosol forcing alone reproduces the bulk of these responses. Moreover, reanalyses and observations yield similar patterns of the North
395 Atlantic atmospheric circulation response, suggesting part of this signal is externally forced. However, other aspects of the CMIP6 AMOC response are at odds with observations. This includes the inferred \sim 1950-1990 weakening of the AMOC based on surface temperature observations (e.g., Rahmstorf et al., 2015), when the CMIP6 multi-model mean yields strengthening. Moreover, the CMIP6 multi-model mean underestimates the observed increase in North Atlantic ocean heat content since \sim 1955. Some of these discrepancies could be due to model shortcomings, such as excessive anthropogenic aerosol forcing
400 (Menary et al., 2020). A handful of CMIP6 realizations (5 of 92) yield AMOC evolution since 1900 similar to the indirect observations, implying the inferred AMOC weakening from 1950-1990 (and even from 1930-1990) may have a significant contribution from internal (i.e., unforced) climate variability.

Consistent with the recent decreases in anthropogenic aerosol emissions, nearly all of the future emission scenarios (Shared Socio-economic Pathways, SSPs) (O'Neill et al., 2014) yield large reductions in future anthropogenic aerosol emissions, with
405 global sulfate emissions projected to decrease by up to 80% by 2050. Thus, anthropogenic aerosol emissions, including those around the North Atlantic, will likely continue to rapidly decline over the next few decades. Our results suggest that the continued decrease in anthropogenic aerosol emissions that accompany efforts to reduce air pollution will reinforce GHG-induced AMOC weakening over the next few decades—with the caveat that internal AMOC variability will also be important.

Code and data availability. The data and code that support the findings of this study are available from the corresponding author upon
410 reasonable request. CMIP6 data can be downloaded from the Earth System Grid Federation at <https://esgf-node.llnl.gov/search/cmip6/>, or by using the *accmip6* package available at <https://github.com/TaufiqHassan/accmip6>. MERRA2 data can be accessed at <https://gmao.gsfc>.



415 nasa.gov/reanalysis/MERRA-2/. NCEP R1 data can be accessed at <https://www.esrl.noaa.gov/psd/data/gridded/data.ncep.reanalysis.html>.
ERA5 data can be accessed at <https://www.ecmwf.int/en/forecasts/datasets/reanalysis-datasets/era5>. OAFflux data can be accessed at <http://oaf Flux.who.edu/>. Surface temperature observations can be accessed at <https://www.esrl.noaa.gov/psd/data/gridded/data.gistemp.html> for
GISS; <https://www.esrl.noaa.gov/psd/data/gridded/data.crutem4.html#detail> for CRU; and <https://www.esrl.noaa.gov/psd/data/gridded/data.noaaglobaltemp.html> for NOAA. RAPID AMOC data can be accessed at https://www.rapid.ac.uk/rapidmoc/rapid_data/datadl.php. NOAA
NCEI ocean heat content data can be downloaded from https://www.nodc.noaa.gov/OC5/3M_HEAT_CONTENT.

420 *Author contributions.* R.J.A. conceived the project, designed the study, performed analyses and wrote the paper. T. H. performed data analysis and wrote the paper. W. L. and C. R. advised on methods. All authors discussed results and contributed to the writing of the manuscript.

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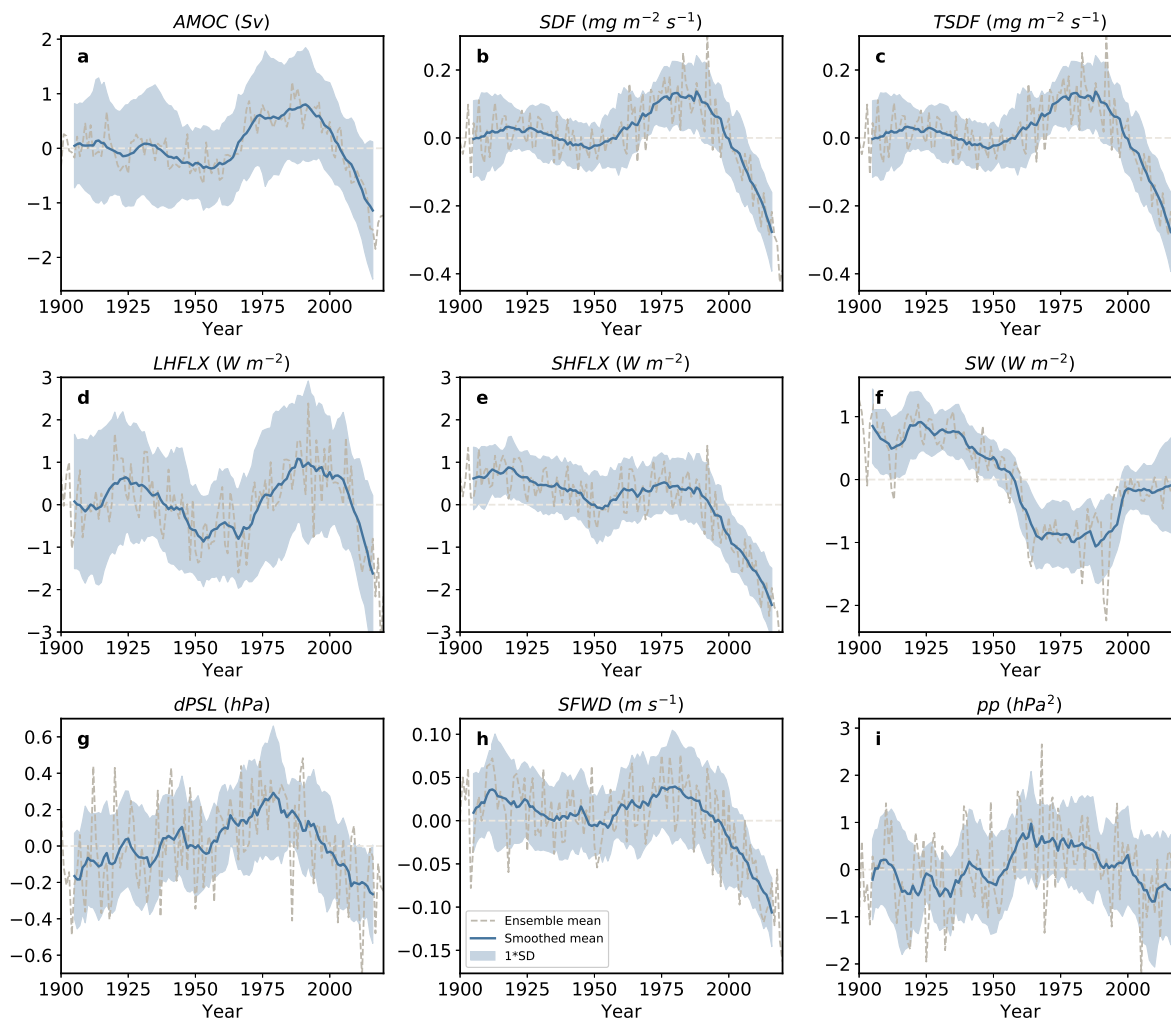


Figure 1. 1900-2020 ensemble mean annual mean all forcing Coupled Model Intercomparison Project phase 6 normalized time series. (a) Atlantic Meridional Overturning Circulation (AMOC) and subpolar North Atlantic (b) surface density flux (SDF); (c) thermal SDF (TSDF); (d) latent heat flux (LHFLX); (e) sensible heat flux (SHFLX); (f) net downward surface shortwave radiation (SW); (g) sea level pressure gradient (dPSL); (h) surface wind (SFWD); and (i) storm track activity (pp). The ensemble mean time series (gray dashed) is smoothed using a 10-year running mean (solid blue line). Shading shows the corresponding inter-model standard deviation. Each model is normalized by subtracting its long-term (1900-2020) climatology. The AMOC is defined as the maximum stream function below 500 m in the Atlantic. AMOC units are Sverdrups (Sv), where 1 Sv is equal to $10^6 \text{ m}^3 \text{ s}^{-1}$. SDF and TSDF units are $\frac{\text{mg}}{\text{m}^2 \text{ s}}$. SHFLX, LHFLX and SW units are W m^{-2} . dPSL units are hPa, pp units are hPa^2 , and SFWD units are m s^{-1} . The subpolar North Atlantic region is defined as $45\text{--}60^\circ\text{N}$ and $0\text{--}50^\circ\text{W}$. dPSL is the Europe-subpolar North Atlantic PSL gradient defined as $30\text{--}45^\circ\text{N}$ and $0\text{--}30^\circ\text{E}$ minus $45\text{--}60^\circ\text{N}$ and $0\text{--}50^\circ\text{W}$.

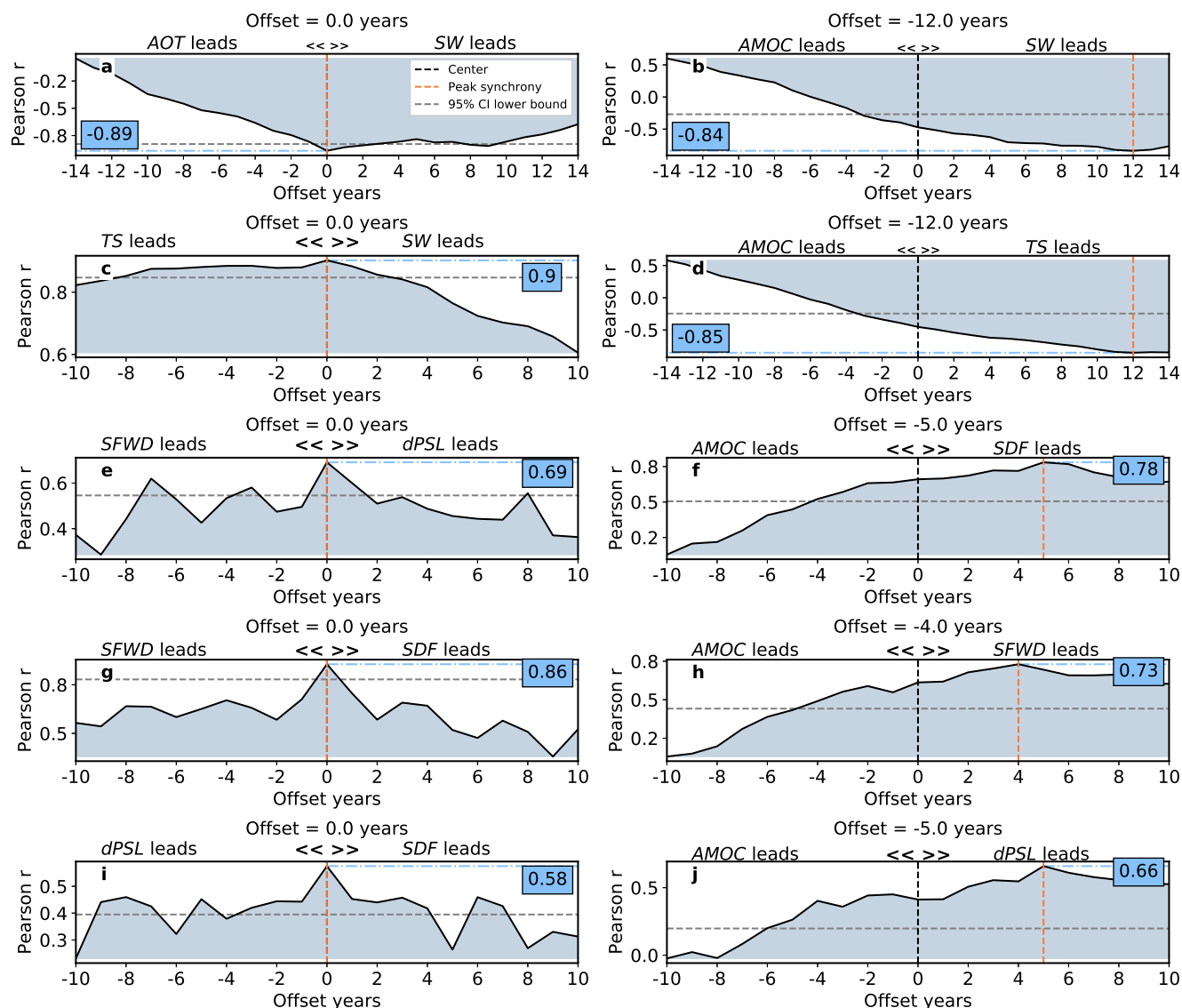


Figure 2. 1950-2020 lead-lag AMOC correlations based on the ensemble mean annual mean all forcing Coupled Model Intercomparison Project phase 6. (Left panels) The subpolar North Atlantic (a) aerosol optical thickness at 550 nm (AOT) versus net downward surface shortwave radiation (SW); (c) surface temperature (TS) versus SW; (e) surface wind (SFWD) versus sea level pressure gradient (dPSL); (g) SFWD versus surface density flux (SDF); and (i) dPSL versus SDF. (Right panels) The Atlantic Meridional Overturning Circulation (AMOC) versus the subpolar North Atlantic (b) SW; (d) TS; (f) SDF; (h) SFWD; and (j) dPSL. The maximum correlation is denoted by the horizontal dashed blue line and as text in the blue box, all of which are significant at the 95% confidence level (gray horizontal line indicates lower bound of the 95% confidence level.). The corresponding offset in years is denoted by the vertical dashed red line.

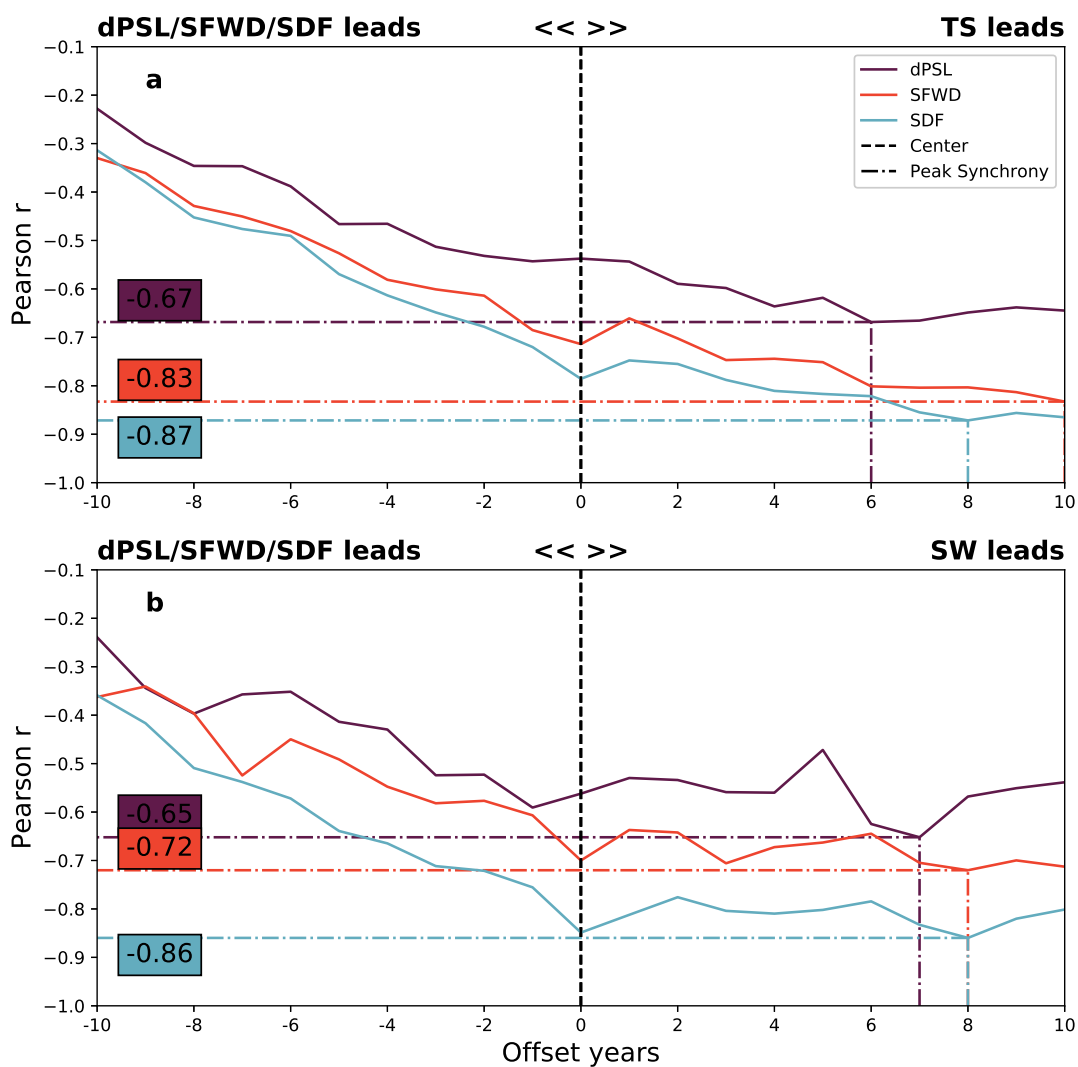


Figure 3. 1950-2020 lead-lag atmospheric circulation correlations based on the ensemble mean annual mean all forcing Coupled Model Intercomparison Project phase 6. The subpolar North Atlantic (a) surface temperature (TS) and (b) net downward surface shortwave radiation (SW) versus sea level pressure gradient (dPSL; purple); surface wind (SFWD; red); and surface density flux (SDF; cyan). The maximum correlations are denoted by the horizontal dashed lines and as text in the color-coded boxes, all of which are significant at the 95% confidence level. The corresponding offsets in years are denoted by the vertical dashed color-coded lines.

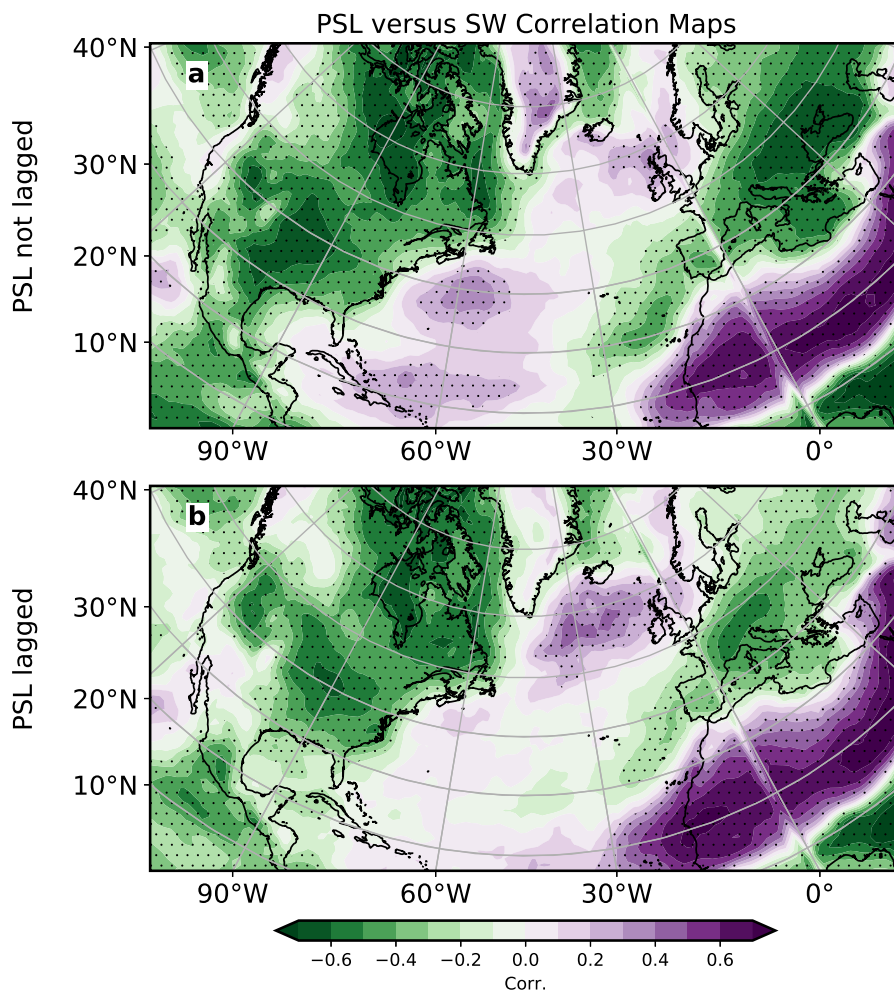


Figure 4. 1950-2020 correlation maps between sea level pressure and net downward surface shortwave radiation based on the ensemble mean annual mean all forcing Coupled Model Intercomparison Project phase 6. Correlation maps between sea level pressure (PSL) and net downward surface shortwave radiation (SW) (a) when both variables are temporally in sync (i.e., not lagged); and (b) when PSL is lagged by 7 years. Symbols denote correlation significance at the 95% confidence level.

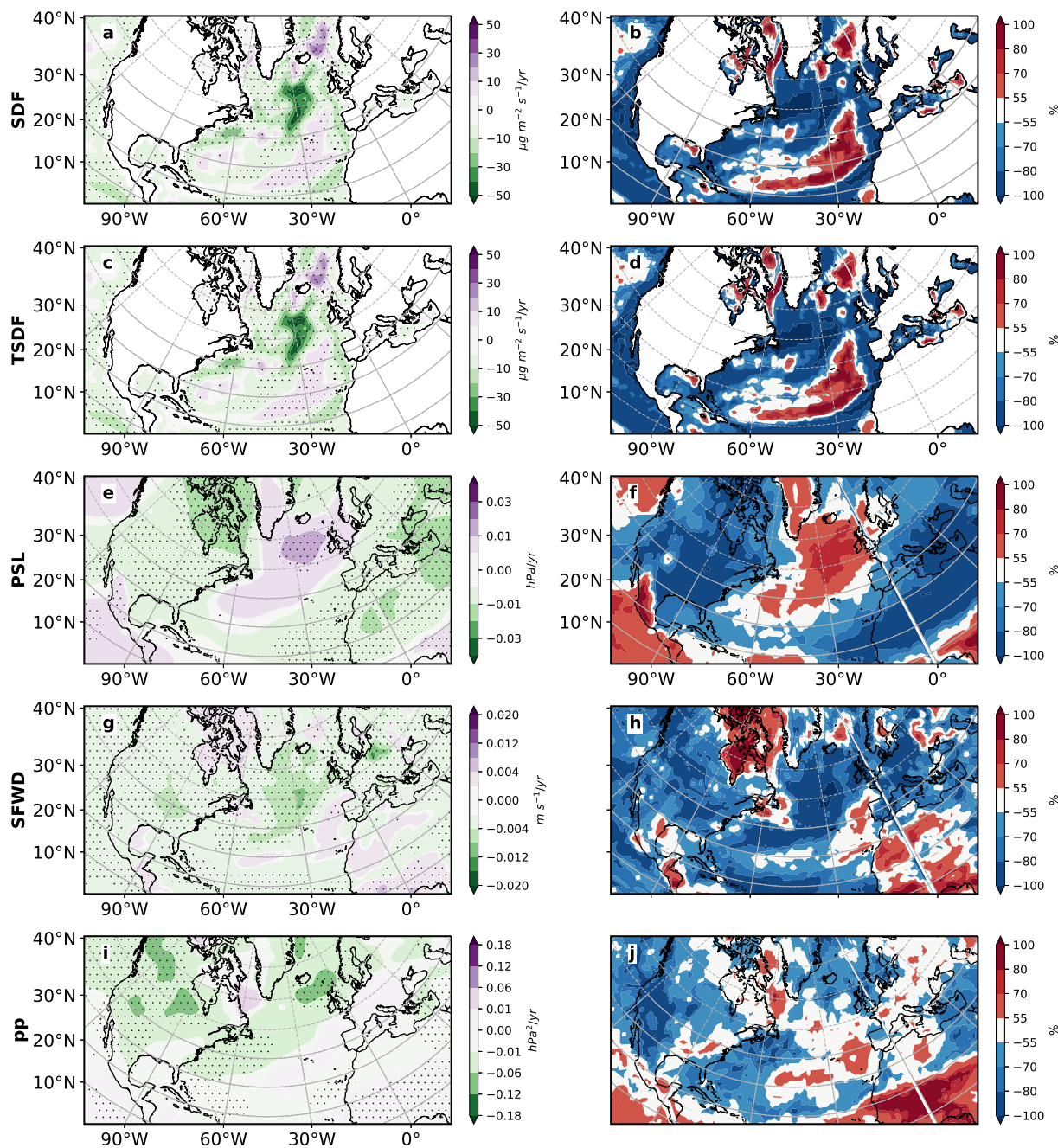


Figure 5. 1990-2020 annual mean all forcing Coupled Model Intercomparison Project phase 6 ensemble mean trends and model agreement on the sign of the trend. (a-b) surface density flux (SDF); (c-d) thermal SDF (TSDF); (e-f) sea level pressure (PSL); (g-h) surface winds (SFWD); and (i-j) storm track activity (pp). Left panels show the ensemble mean trend; right panels show model agreement on the sign of the trend for each model's ensemble mean. Symbols in left panels designate trend significance at the 95% confidence level based on a t -test. SDF and TSDF trend units are $\frac{\mu\text{g}}{\text{m}^2\text{-s}} \text{ year}^{-1}$. PSL, pp, and SFWD trend units are hPa year^{-1} , $\text{hPa}^2 \text{ year}^{-1}$, and $\text{m s}^{-1} \text{ year}^{-1}$, respectively. Trend realization agreement units are % . Red (blue) colors indicate model agreement on a positive (negative) trend.

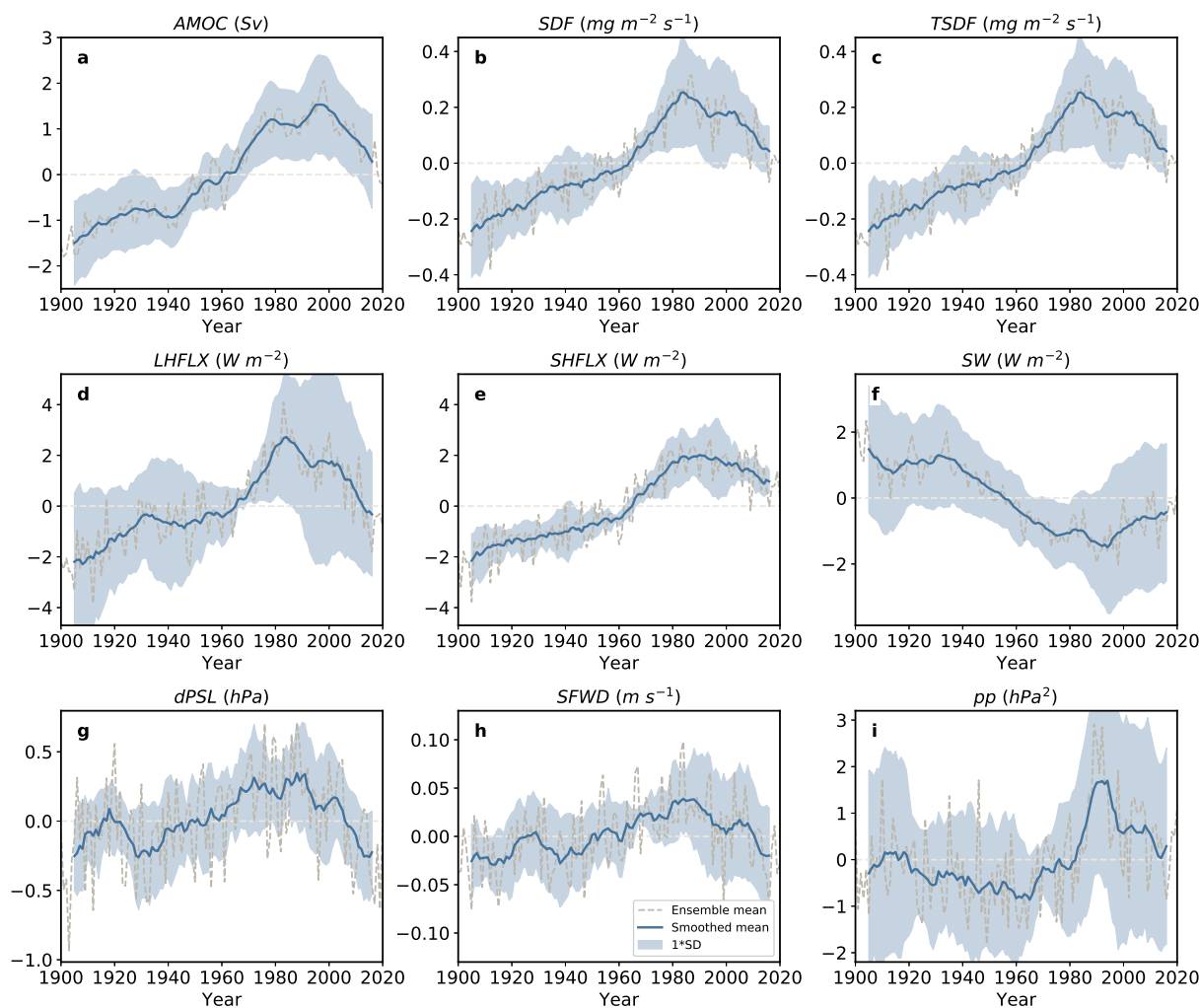


Figure 6. 1900-2020 ensemble mean annual mean anthropogenic aerosol forcing Coupled Model Intercomparison Project phase 6 normalized time series. (a) Atlantic Meridional Overturning Circulation (AMOC) and subpolar North Atlantic (b) surface density flux (SDF); (c) thermal SDF (TSDF); (d) latent heat flux (LHFLX); (e) sensible heat flux (SHFLX); (f) net downward surface shortwave radiation (SW); (g) sea level pressure gradient (dPSL); (h) surface wind (SFWD); and (i) storm track activity (pp). The ensemble mean time series (gray dashed) is smoothed using a 10-year running mean (solid blue line). Shading shows the corresponding inter-model standard deviation. Each model is normalized by its long-term (1900-2020) climatology. The AMOC is defined as the maximum stream function below 500 m in the Atlantic. AMOC units are Sverdrups (Sv), where 1 Sv is equal to $10^6 \text{ m}^3 \text{ s}^{-1}$. SDF and TSDF units are $\frac{\text{mg}}{\text{m}^2 \text{ s}}$. SHFLX, LHFLX and SW units are W m^{-2} . dPSL units are hPa, pp units are hPa^2 , and SFWD units are m s^{-1} . The subpolar North Atlantic region is defined as $45\text{--}60^\circ\text{N}$ and $0\text{--}50^\circ\text{W}$. dPSL is the Europe-subpolar North Atlantic PSL gradient defined as $30\text{--}45^\circ\text{N}$ and $0\text{--}30^\circ\text{E}$ minus $45\text{--}60^\circ\text{N}$ and $0\text{--}50^\circ\text{W}$.

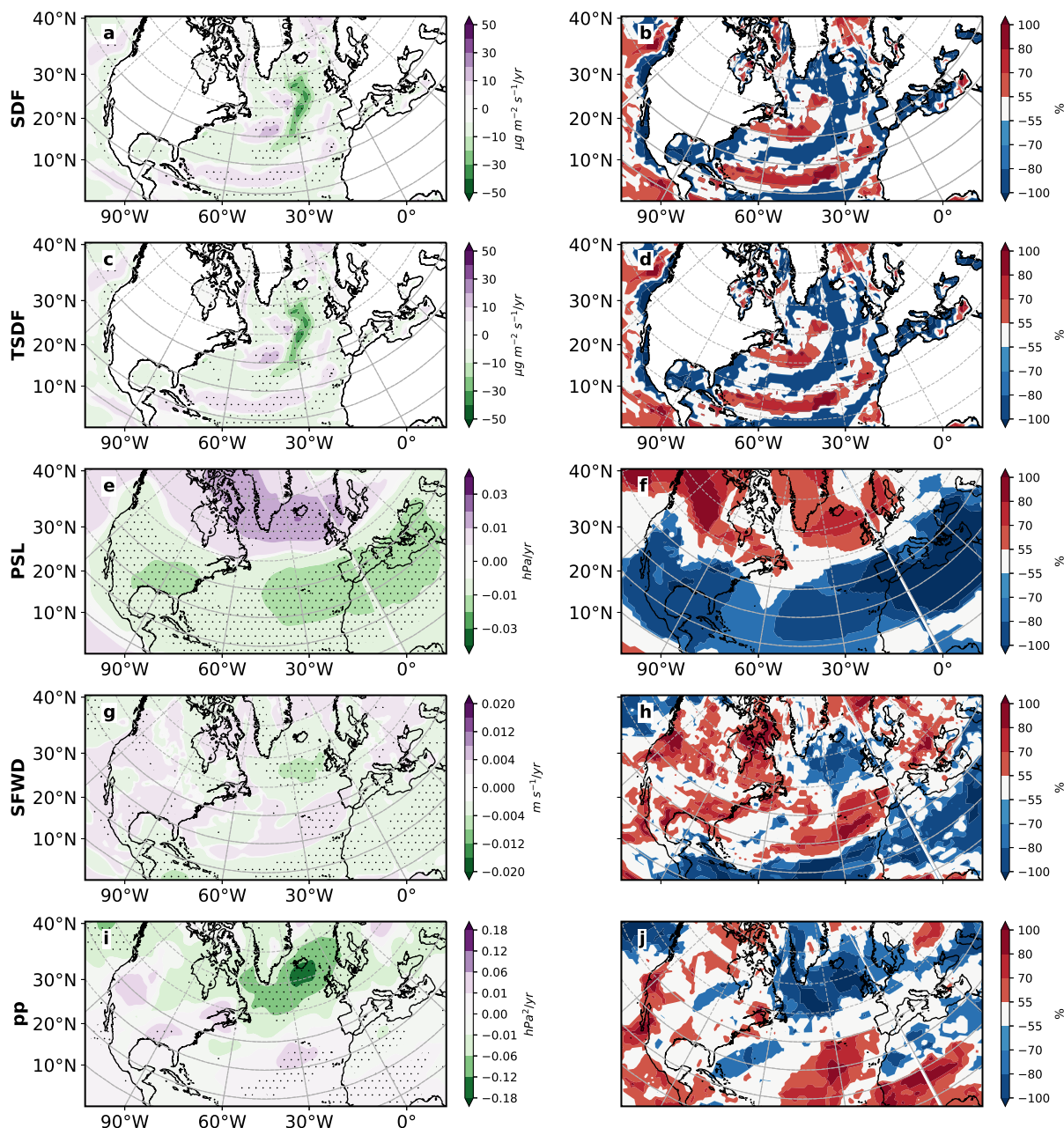


Figure 7. 1990-2020 annual mean anthropogenic aerosol forcing Coupled Model Intercomparison Project phase 6 ensemble mean trends and model agreement on the sign of the trend. (a-b) surface density flux (SDF); (c-d) thermal SDF (TSDF); (e-f) sea level pressure (PSL); (g-h) surface winds (SFWD); and (i-j) storm track activity (pp). Left panels show the ensemble mean trend; right panels show model agreement on the sign of the trend for each model's ensemble mean. Symbols in left panels designate trend significance at the 95% confidence level based on a *t*-test. SDF and TSDF trend units are $\frac{\mu\text{g}}{\text{m}^2\text{-s}} \text{ year}^{-1}$. PSL, pp, and SFWD trend units are hPa year^{-1} , $\text{hPa}^2 \text{ year}^{-1}$, and $\text{m s}^{-1} \text{ year}^{-1}$, respectively. Trend realization agreement units are %. Red (blue) colors indicate model agreement on a positive (negative) trend.

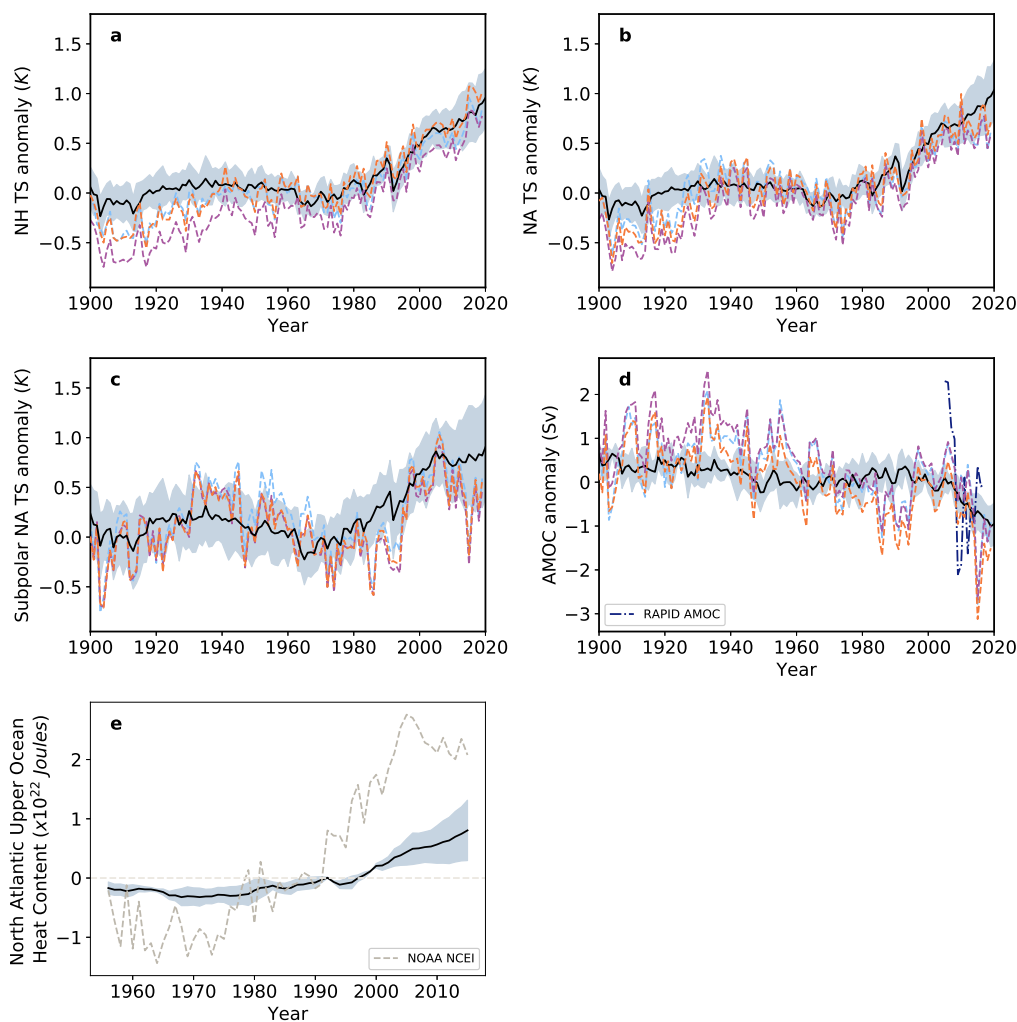


Figure 8. Ensemble mean annual mean all forcing Coupled Model Intercomparison Project phase 6 and observed surface temperature, inferred AMOC and ocean heat content time series. 1900–2020 (a) Northern Hemisphere ($0\text{--}60^\circ\text{N}$; $0\text{--}360^\circ\text{E}$); (b) North Atlantic ($0\text{--}60^\circ\text{N}$; $7.5\text{--}75^\circ\text{W}$); and (c) subpolar North Atlantic ($45\text{--}60^\circ\text{N}$; $0\text{--}50^\circ\text{W}$) surface temperature (TS); (d) inferred AMOC; and (e) 1955–2014 North Atlantic upper-ocean ($0\text{--}700\text{ m}$) ocean heat content (OHC). The inferred AMOC is calculated in a similar fashion as in Rahmstorf et al. (2015)—as the subpolar North Atlantic ($45\text{--}60^\circ\text{N}$ and $0\text{--}50^\circ\text{W}$) minus the Northern Hemisphere ($0\text{--}60^\circ\text{N}$ and $0\text{--}360^\circ$) TS anomaly time series, scaled by 2.3 Sv K^{-1} . Results are shown for the CMIP6 all forcing ensemble mean (solid black) and observations (ending in 2019), including NASA GISS (GISTEMPv4; dashed light blue), NOAA (NOAAGlobalTempv4.0.1; dashed orange) and CRU (CRUTEM4; dashed green) for TS. Observed OHC (gray dashed) comes from NOAA National Centers for Environmental Information (NOAA NCEI). Also included in panel (d) is the April 2004–July 2019 directly observed AMOC from the RAPID array (dash-dot dark blue). Light blue shading shows the CMIP6 inter-model standard deviation. AMOC units are Sv; OHC units are 10^{22} Joules. Inferred AMOC trends for 1950–1990 are -0.03 , -0.03 , -0.03 and 0.03 Sv year^{-1} for GISS, NOAA, CRU and CMIP6, respectively. The corresponding 1990–2020 inferred AMOC trends are -0.02 , -0.02 , -0.02 and $-0.07\text{ Sv year}^{-1}$. The CMIP6 all forcing actual AMOC trends are 0.04 and $-0.08\text{ Sv year}^{-1}$ for 1950–1990 and 1990–2020, respectively. Bold trends are significant at the 95% confidence level.

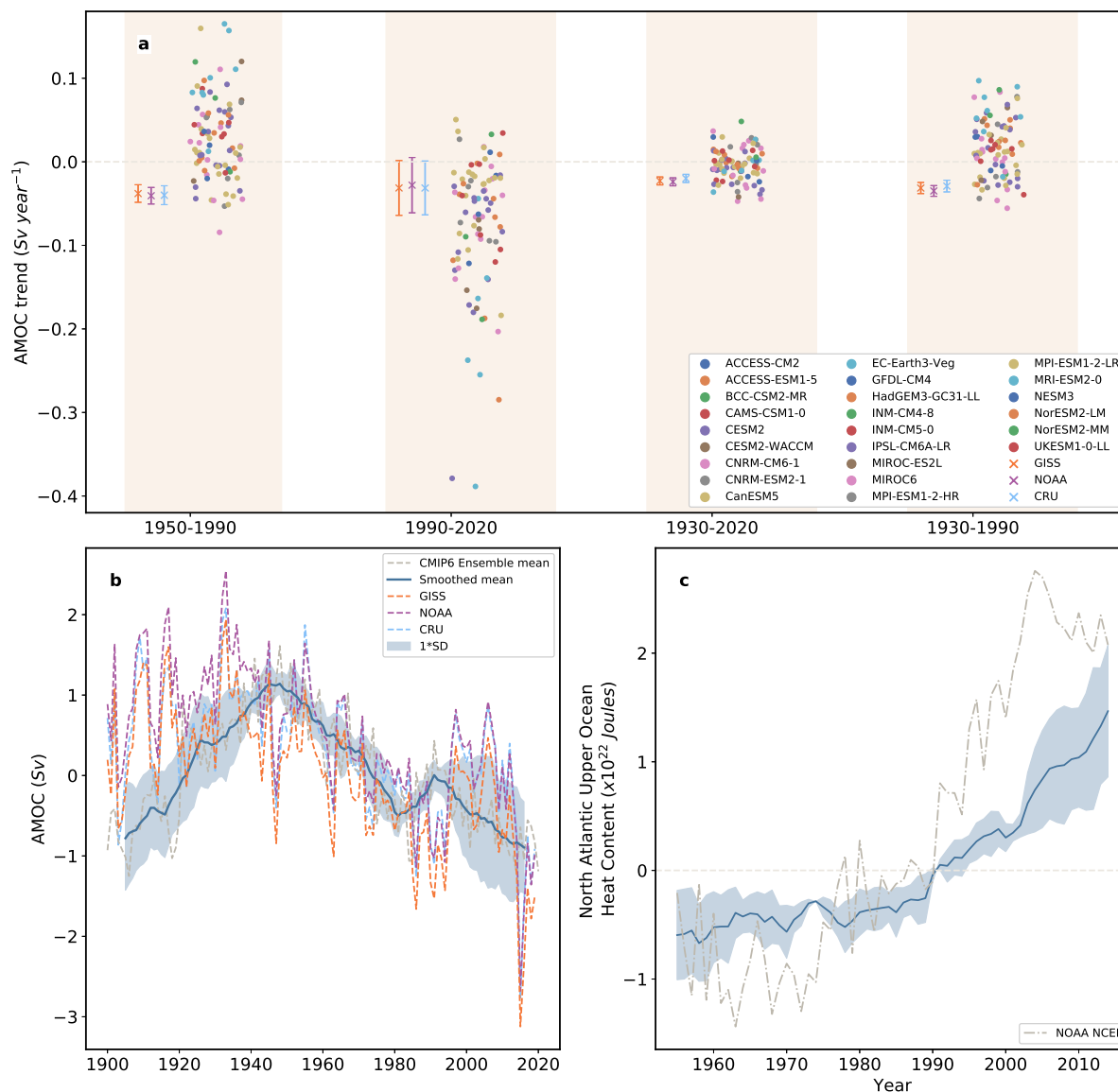


Figure 9. Coupled Model Intercomparison Project phase 6 all forcing annual mean AMOC and OHC for individual model realizations. (a) AMOC trends [Sv year⁻¹] are shown for four time periods, including 1950-1990, 1990-2020, 1930-2020, and 1930-1990. Each individual model realization is shown with a symbol. Also included (X's) are the corresponding inferred AMOC trends (ending in 2019) based on surface temperature observations. Error bars on inferred AMOC trends represent the 95% confidence interval of the trend. (b) Ensemble mean annual mean normalized AMOC [Sv] time series (gray dashed) and 10-year running mean (solid blue line) based on the two CMIP6 models (CanESM5 and IPSL-CM6A-LR; 5 realizations in total) that yield AMOC trends that fall within the observational uncertainty for all four time periods. Blue shading shows the corresponding inter-model standard deviation. Also included are the three inferred AMOC time series, based on surface temperature observations. (c) As in (b), but for the 1955-2014 North Atlantic upper-ocean (0-700 m) ocean heat content (OHC). Also included in (c) is the corresponding observed OHC (gray dashed) from NOAA National Centers for Environmental Information (NOAA NCEI).