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On the role of the Atlantic Meridional Mode in Eastern European Temperature Variability

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Abstract

The eastern European (EE) region has experienced record-breaking heatwave events in 1 recent years, and such events are expected to increase in future with global warming. 2 Early warning systems are an important step towards mitigating their impacts. Here we 3 seek to further clarify the effect of Atlantic Meridional Mode (AMM) on the EE region 4 temperature variability. Using observations and climate model experiments, we show a 5 significant association between the AMM and temperature variability across the region. 6 The positive phase of AMM leads to a significant increase in EE temperature of 0.9°C, p-7 value < 0.1, for a one standard deviation AMM anomaly, and vice-versa. The mechanism 8 through which the AMM can modulate the EE temperature arises through a persistent 9 planetary-scale Rossby wave which causes an anomalous anticyclone circulation leading to 10 a positive temperature anomaly. This relationship, along with the mutually exclusive and 11 independent large-scale climatic modes such as the El Niño–Southern Oscillation (ENSO) 12

¹³ and North Atlantic Oscillation (NAO), have important implications for improving the

¹⁴ prediction of EE heatwaves.

Key words: Eastern Europe, Heatwave, Atlantic Meridional Mode, Climate model experiments.

15 **1. Introduction**

Since the beginning of the century, there has been a significant increase in the num-16 ber of summer heatwaves in Europe [Robine et al., 2008; Otto et al., 2012; Meehl and 17 Tebaldi, 2004; Zhang et al., 2020] – which have had major impacts on local communities 18 [Alexander, 2011]. Some of the notable impacts due to such high temperatures include 19 air-quality degradation, forest fires [Earl and Simmonds, 2018], substantial crop yield loss 20 [Barriopedro et al., 2011], human mortality [Hari et al., 2022], and degradation of bio-21 diversity [Welbergen et al., 2008]. The extreme heatwaves during the summers of 2003 22 and 2010, for example, were associated with premature deaths of nearly 70000 people in 23 Europe [Robine et al., 2008] and 50 000 people in Russia [Otto et al., 2012], respectively. 24 Extreme temperatures associated with heatwaves over Europe are projected to increase 25 in the future at a the faster rate than the global mean temperature [Russo et al., 2015]. 26 Therefore, the understanding of underlying physical triggers of such high impact events – 27 specifically over the Eastern European (EE) region – will significantly aid in adaptation 28 to extreme events. 29

A number of studies have identified physical mechanisms that trigger European heatwaves [García-Herrera et al., 2010; Lhotka et al., 2018; Miralles et al., 2014; Schumacher

et al., 2019]. These studies indicate that land-atmosphere feedback mechanisms are impor-32 tant aspects during these heatwaves. However, even though the major heatwaves – such 33 as 2003 at central European [Fischer et al., 2007] and 2010 event in the EE region [Mi-34 ralles et al., 2019 – were strengthened due to land-atmosphere coupling, these events were 35 initiated by anomalous large-scale atmospheric circulations [Liu et al., 2020]. Typically, a 36 persistent anticyclonic circulation – favouring clear skies, air subsidence, and surface solar 37 heating [Liu et al., 2020; Li et al., 2020], that simultaneously reduces the zonal flow and 38 advection of warm air away from the region [Lhotka et al., 2018] – are the main features 39 associated with heatwaves over Europe [Brunner et al., 2018]. During the summer, the 40 EE region has a tendency towards the occurrence of these kinds of anticyclonic circulation 41 events [Tyrlis and Hoskins, 2008], and it is reported that many of the recent heatwaves over 42 the region were associated with such blocking conditions [Dole et al., 2011]. Moreover, it 43 is found that these long-lasting blocking conditions are related to quasi-stationary Rossby 44 waves [Dole et al., 2011; Di Capua et al., 2021; Strigunova et al., 2022]. Studies argue 45 that such mechanisms which trigger these stationary Rossby waves leading to heatwave 46 are connected to some of the known large-scale features such as, El Niño–Southern Os-47 cillation (ENSO; Brönnimann [2007], Sun et al. [2016]), the North Atlantic ocean (NAO; 48 Hurrell [1995]; Krüger et al. [2020], Bierkens and Van Beek [2009], Cassou et al. [2005], 49 Della-Marta et al. [2007], Schubert et al. [2014]), Scandinavian pattern (Chen et al. [2019]) 50 and also East Atlantic/Western Russia teleconnection (EAWR; Zhao et al. [2020]). 51

European climate is, in general, influenced by several important climatic modes – viz.,
 ENSO and North Atlantic Oscillation (NAO; Hurrell [1995]; Krüger et al. [2020], Bierkens

and Van Beek [2009] Kautz et al. [2022]) and the atmospheric response of both of these cli-54 matic modes to European climate closely resembles Toniazzo and Scaife [2006]. However, 55 the influence of both these dominant climate modes (ENSO and NAO) on the variability 56 of European climate is more pronounced during the winter season [Hurrell, 1995], and per-57 haps their influence on the summer season is limited [Folland et al., 2009]. Nonetheless, a 58 recent study [Sun et al., 2016] showed that the influence of ENSO on the summer Euro-59 pean Climate – specifically over the EE region – has strengthened significantly post-1980. 60 The theoretical linear baroclinic model suggests that the increasingly strong teleconnec-61 tion between the summer ENSO and the EE region may be related to a change in the 62 tropical thermal forcing over the Pacific – which can excite an eastward propagation of the 63 Rossby wave reaching the EE region, causing the climatological changes [Sun et al., 2016]. 64 Thus, these studies show that the ENSO and NAO profoundly influence EE temperature 65 variability. Nonetheless, apart from these climatic modes, disjoint studies [Trenberth and 66 Fasullo, 2012; Cassou et al., 2005] suggest that the anomalous diabatic heating over the 67 tropical Atlantic Ocean caused a heatwave over the EE region by forcing a quasi-stationary 68 Rossby wave during the summers of 2010 - and in general heatwave and droughts over 69 the Eurasian region [Schubert et al., 2014]. Having mentioned this, the effect of Atlantic 70 Meridional Mode (AMM) – a dominant climatic mode over the tropical Atlantic Ocean 71 [Chiang and Vimont, 2004] – has not been explored in existing literature. In addition, 72 Simmonds Simmonds [2018] noted that the impact of the thermodynamics is fairly well 73 understood from the basic physics, whereas the part played by the atmospheric dynamics 74 is much more complex and ambiguous. Therefore, this study aims to understand the phys-75

ical mechanisms which cause summer EE heatwaves – specifically focusing on the AMM 76 using a combination of observational data and climate model perturbation experiments. 77 Here, using observations and climate model experiments, we aim to understand the in-78 fluence of a teleconnection pattern – which is associated with the AMM– on the heatwaves 79 over the EE region $(50^{\circ}\text{E}-70^{\circ}\text{E and } 45^{\circ}\text{N}-60^{\circ}\text{N};$ Figure 1) during boreal summer (June-80 August). The AMM, which results from the coupled ocean and atmospheric variability over 81 the Atlantic basin [75°E–15°W, 21°S–32°N], triggers a persistent planetary-scale Rossby 82 wave train in the upper-levels of the atmosphere in the northern hemisphere. This wave 83 train features anticyclonic circulation/blocking patterns leading to an increased tempera-84 ture over the EE region. Further, with the use of climate model perturbation experiments 85 and control simulations (detailed in the section below), we investigate the underlying mech-86 anism through which the AMM modulates the EE summer heatwaves. In addition, we 87 show that the influence of AMM on EE temperature is independent of the other promi-88 nent teleconnection patterns on inter-annual timescales, such as the El Niño-Southern 89 Oscillation (ENSO) and NAO, among other well-established drivers of mid-latitudinal cli-90 mate. Finally, we demonstrate that, along with other dominant climate modes, AMM can 91 significantly improve the predictability of EE summer temperature. 92

93 2. Data and Methods

The assessment of temperature characteristics during summer over EE from 1980– 2019 is performed using the fifth generation ECMWF atmospheric reanalysis (ERA5) data [Hersbach et al., 2020] as it is capable enough to capture observed temperature

variability and extremes over the region of interest [Velikou et al., 2022]. SST data is 97 obtained from the sea ice and sea surface temperature reconstruction (HadISST), produced 98 by the Met Office Hadley Centre [Rayner et al., 2003]. Monthly estimates of the AMM 99 index are obtained from the NOAA Earth System Research Library, available at https:// 100 www.esrl.noaa.gov/psd/data/timeseries/monthly/AMM/ for the period 1948-present. 101 The large-scale atmospheric variables such as geopotential height and winds at different 102 pressure levels are obtained from the National Centers for Environmental Prediction-103 National Center for Atmospheric Research (NCEP–NCAR) reanalysis [Kalnay et al., 1996]. 104 The AMM is the leading mode of coupled atmospheric and ocean variability in the 105 Atlantic Ocean basin [Chiang and Vimont, 2004]. It can be estimated by applying the 106 maximum covariance analysis (MCA) to the tropical Atlantic basin, assessing the co-107 variability of SSTs and 10m surface winds. It is worth mentioning that while estimating 108 the AMM index, the effect of the El Nino Southern Oscillation (ENSO) is removed [Chiang 109 and Vimont, 2004]. The positive feedback between surface winds, evaporation, and SST 110 the wind-evaporation-SST (WES) feedback – is the main cause of the meridional modes 111 [Xie et al., 2005; Chiang and Vimont, 2004]. AMM is an important driver of the climate 112 variability in several regions e.g., the Indian monsoon [Vittal et al., 2020a], western North 113 Pacific tropical cyclones [Zhang et al., 2017], and Atlantic tropical cyclones [Vimont and 114 Kossin, 2007; Patricola et al., 2014]. Nonetheless, knowledge of the influence of AMM on 115 European summer climatology is limited and as such disentangling their role along with 116 other prominent climate modes (NAO, ENSO) is the main focus of this study. 117

Given the strong influence exerted by the ENSO on the surrounding areas, particularly

¹¹⁹ over the Atlantic Ocean , we therefore try to isolate the ENSO signal. The ENSO signal ¹²⁰ here is removed by calculating the residual time series [Kucharski et al., 2009]:

$$SST_R(t) = SST(t) - SST_{ENSO}(t) \tag{1}$$

121 where

$$SST_{ENSO}(t) = b NINO34(t)$$
⁽²⁾

where b is calculated using the linear regression between SST at a respective grid and Niño3.4 index.

The wave activity flux (WAF) is implemented to understand the energy propagation pathways originating from the AMM and their influence on EE heatwaves. It is considered as a diagnostic tool for highlighting the propagation, source and sink of a packet of stationary or migratory quasi-geostrophic wave [Takaya and Nakamura, 2001]. It is usually estimated using information at 250 hPa pressure level, following the expression equation [Takaya and Nakamura, 2001]:

$$W = \frac{p\cos\varphi}{2|\mathbf{U}|} \begin{pmatrix} \frac{U}{a^2\cos^2\varphi} \left[\left(\frac{\partial\psi'}{\partial\lambda}\right)^2 - \psi'\left(\frac{\partial^2\psi'}{\partial\lambda^2}\right) \right] + \frac{V}{a^2\cos\varphi} \left[\frac{\partial\psi'}{\partial\lambda} \frac{\partial\psi'}{\partial\varphi} - \psi'\frac{\partial^2\psi'}{\partial\lambda\partial\varphi} \right] \\ \frac{U}{a^2\cos\varphi} \left[\frac{\partial\psi'}{\partial\lambda} \frac{\partial\psi'}{\partial\varphi} - \psi'\frac{\partial^2\psi'}{\partial\lambda\partial\varphi} \right] + \frac{V}{a^2} \left[\left(\frac{\partial\psi'}{\partial\varphi}\right)^2 - \psi'\left(\frac{\partial^2\psi'}{\partial\varphi^2}\right) \right] \\ \frac{f_0^2}{N^2} \left\{ \frac{U}{a\cos\varphi} \left[\frac{\partial\psi'}{\partial\lambda} \frac{\partial\psi'}{\partial z} - \psi'\frac{\partial^2\psi'}{\partial\lambda\partial z} \right] + \frac{V}{a} \left[\frac{\partial\psi'}{\partial\varphi} \frac{\partial\psi'}{\partial z} - \psi'\frac{\partial^2\psi'}{\partial\varphi\partial z} \right] \right\} \end{pmatrix}$$
(3)

where W denotes the WAF, p is pressure, ψ is the streamfunction, $\mathbf{U} = (U, V)$ is horizontal wind vector, with U and V denoting the zonal and meridional wind components, respectively; λ and φ are longitude and latitude, respectively; f_0 is the Coriolis parameter; *N* is the Brunt-Vaisala frequency; *a* is Earth's radius and the prime represents the anomaly with respect to the climatological mean from 1951–2019.

135 2.1. Climate model perturbation experiment

To ascertain the role of the tropical Atlantic Ocean SST variability and the EE region 136 heatwaves and the associated large-scale circulation, we perform a climate model pertur-137 bation experiment which is integrated over 25 years. Here, we use the atmospheric general 138 circulation model developed by the International Centre for Theoretical Physics (ICTP) 139 AGCM) [Molteni, 2003; Kucharski et al., 2013], following the two sets of complementary 140 simulations. The first set of the simulation considers prescribing the seasonal climatol-141 ogy of SST based on ECMWF reanalysis (CLIM; averaged from 1979 to 2008). Next, in 142 the second simulation, to evaluate the response of EE heatwaves, the observed composite 143 anomaly of SST during the positive phase of AMM over the AMM region for the sum-144 mer season (June–August) is superimposed on the monthly climatology, keeping the SST 145 identical to the CLIM simulation for other months. The subtraction of the CLIM simu-146 lation with the SST anomaly-forced simulation then provides the response of large-scale 147 atmospheric circulation to the AMM. 148

149 2.2. Control climate model experiment

In addition to the observational/reanalysis data that we use to understand the association between AMM and EE heatwaves, we also use a fully-coupled long-term Geophysical Fluid Dynamics Laboratory (GFDL) Forecast-Oriented Low Ocean Resolution (FLOR)

coupled climate model control experiments [Vecchi et al., 2014; Zhang et al., 2016; Hari 153 et al., 2022]. The radiative forcing and land use are specified at 1860 levels and thus 154 referred to as pre-industrial experiments. The atmosphere and land components of FLOR 155 have the horizontal resolution of $\simeq 0.5^{\circ}$ with 32 vertical levels. FLOR has an updated pa-156 rameterization for mesoscale eddies and a parameterization for submesoscale mixed layer 157 eddies [Wittenberg et al., 2018]. Moreover, this model has an enhanced capability in cap-158 turing the near-surface equatorial upwelling compared to their predecessors. A detailed 159 information regarding the GFDL FLOR model is reported in Vecchi et al., 160 2014]. We use these simulations to test if the established relation between AMM-EE 161 heatwave variability also occurs in the GFDL-FLOR long-term control simulations, which 162 would impart a dynamical framework – mainly to understand the causation of this rela-163 tionship [Zhang et al., 2016]. The control experiments are performed for a total of 2500 164 years, however, here we focus on 300 years – later part of the first 1000 years – to analyse 165 AMM and EE heatwaves. The AMM index in this experiment is estimated – as proposed 166 by [Chiang and Vimont, 2004] – through the MCA approach based on the corresponding 167 SSTs and surface wind fields. 168

For the estimation of the AMM index, we first remove the seasonal cycle from monthly fields, detrend both the SST and wind data and then apply a three-month running mean for both variables. Further, to remove the influence of ENSO on both SST and winds (refer Eq. 1 and 2), we remove the equatorial Pacific Cold Tongue (SST averaged over 180°W– 90°W, 6°S–6°N) from all the grid points for both the variables [Chiang and Vimont, 2004]. Once this pre-processing is done, we finally apply the MCA by formulating the covariance matrix between SST and surface winds. This matrix is decomposed through Singular
Value Decomposition (SVD). The leading statistical mode from this decomposition forms
an AMM index for the model [Chiang and Vimont, 2004].

178 2.3. Statistical PCMCI causal analysis

To complement the above analysis of the climate model experiments – linking AMM 179 to EE heatwaves – we further perform a robust statistical causal analysis based on Peter 180 and Clark momentary conditional independence (PCMCI) algorithm [Runge et al., 2019]. 181 The PCMCI is a two-step algorithm, wherein in the first step, the relevant conditions for 182 each considered variable (both, EE temperature and other climatic modes) are identified 183 by iterative independence testing. The second step, however, is to test the link between 184 the two variables is causal. Here, to correct the unreasonable p-values – due to multiple 185 significance testing Di Capua et al. [2020] – a false discovery rate approach [Benjamini and 186 Hochberg, 1995] is implemented. A detailed methodology underlying the PCMI method 187 is provided by Runge et al. [2019] and Di Capua et al. [2020]. Here along with AMM, 188 we also consider North Atlantic Oscillation (NAO, Wunsch [1999]), El Niño–Southern 189 Oscillation (ENSO, Schneidereit et al. [2012]) and Arctic Amplification (AA Cohen et al. 190 [2014]). The AA is measured as the change in surface air temperature over the Arctic 191 (70°N–90°N) relative to mid-latitudes (30°N–60°N; Ionita et al. [2020]). We selected these 192 climate modes because of their controls on the European climate variability – specifically 193 during the summer season [Sun et al., 2016; Cohen et al., 2014]. 194

¹⁹⁵ 3. Results and Discussion

196 3.1. Observational analysis

We start our analysis by exploring the 2010 Eastern European (EE) heatwave event -197 which is one of the hottest events ever recorded in the region [Rasmijn et al., 2018] – and 198 the large-scale air-sea interaction patterns, including SST and near-surface wind anoma-199 lies corresponding to this event. It is evident from Figure 1 that temperature anomalies 200 during the summer of 2010 over Europe – specifically over EE – were substantially warmer 201 than usual (> 2 $^{\circ}$ C higher compared to the respective climatology over the EE region). 202 It is reported that this particular event shattered heatwave records both in terms of the 203 intensity and the impacts [Barriopedro et al., 2011] and demonstrated the societal vulner-204 ability to such persistent extreme weather [Rasmijn et al., 2018]. Thus, understanding the 205 physical mechanism responsible for such persistent events forms an important step towards 206 climate adaptation, as much as it is in investigating the impacts of global warming on the 207 occurrence and severity of these extreme temperature events [Marotzke et al., 2017]. 208

We extend the analysis beyond the 2010 event and observe that there are several hot summers over the EE region in the historical record – based on spatially averaged temperature over the EE region during summer (June-August). However, the 2010 event was exceptional in terms of intensity (Figure 1b). We proceed to analyse the large-scale airsea interaction patterns during these warm summers (Figure 1c) and notice a predominant pattern of positive SST anomalies over the northern part of the tropical Atlantic region and negative anomalies in the southern part – with the influence of ENSO is removed (refer Eq. ²¹⁶ 1 and 2). This pattern resembles strongly the spatial pattern of the Atlantic Meridional ²¹⁷ Mode (AMM) [Chiang and Vimont, 2004] (rectangular box; 75°E–15°W, 21°S–32°N; in ²¹⁸ Fig. 1c) or the northern tropical Atlantic (NTA) mode [Chen et al., 2015]. The spatial ²¹⁹ patterns of these two modes, i.e., AMM and NTA, are exactly similar; their correlation is ²²⁰ 0.86. The wind patterns i.e., movement from the cooler region to the warmer ones over ²²¹ the tropical Atlantic – further corroborate the prominence of AMM [Chiang and Vimont, ²²² 2004] during the warmer summers over the EE region.

To uncover the association of AMM with the inter-annual variability of summer tem-223 perature across the EE region, we relate the observed summer temperature anomalies with 224 the AMM index over the period 1980-2019. A dipole behaviour is noticed over the Euro-225 pean region (Figure 1d) – with the majority of the Central and Northern European region 226 having a negative association and the Eastern region having a positive association of their 227 respective temperature anomalies with AMM index. Moreover, the strongest signal is 228 apparent over the EE region (Figure 1d), with temperature anomalies being significantly 229 warmer during the 2010 summer (Figure 1a). Similar results were obtained when we per-230 formed the analysis over a longer duration (1951 – 2019) using the NCEP-NCAR reanalysis 231 temperature dataset (not shown here). Overall, this indicates that a strong positive phase 232 of AMM may enforce the prominent warmer conditions over EE – also corroborated with 233 the composite analysis results from the winds and SSTs patterns over the AMM region 234 (Figure 1c). Significant differences in the EE temperature are observed between the years 235 with the strong positive and negative phases of AMM (Figure 1e; mean difference of 0.9°C) 236 with p-value < 0.1 based on a non-parametric bootstrap sampling technique [Wilks, 2011; 237

²³⁸ Hari et al., 2022]).

The above analysis shows a significant positive association of the EE summer temper-239 ature with the AMM index. Next, we investigate underlying large-scale processes through 240 which the AMM could be possibly linked to the EE summer temperature variability. We 241 start by examining the 500 hPa geopotential height patterns – as the AMM is reported 242 to cause changes in the tropospheric circulation [Zhang et al., 2017; Vittal et al., 2020a]. 243 Figure 2a shows the association of 500 hPa geopotential height with the summer AMM 244 index over the period 1951 - 2019. Apparent is the higher geopotential height with a 245 prominent anticyclonic circulation over the EE region. This synoptic situation reduces 246 the advection of warm air away from the region, and simultaneously reduces cloudiness, 247 which further intensifies the heatwave conditions [Rasmijn et al., 2018]. In addition, the 248 favourable conditions for a blocking high can lead to a persistent flow pattern Chatterjee 249 et al. [2021] in response to the positive phase of the AMM (Figure 2b). Disturbance of SST 250 anomalies over the tropical Atlantic region and their linkage to stationary Rossby wave 251 trains – which propagate eastward and poleward – have also been identified in previous 252 studies [Li et al., 2014, 2015, 2016; Ren et al., 2022]. 253

The AMM usually shifts the inter-tropical convergence zone towards the anomalously warmer region over the tropical Atlantic basin, through a shift in deep convection [Chiang and Vimont, 2004]. This further increases rainfall over the warmer region of the tropical Atlantic Ocean[Foltz et al., 2012]. Accompanying with the convection process is an anomalous divergence of the atmospheric flow at the planetary scale [Jin and Hoskins, 1995]. When this divergence coincides with a favourable background vorticity gradient,

the Rossby waves are generated [Sardeshmukh and Hoskins, 1988; Luo et al., 2019; Rudeva 260 and Simmonds, 2021. We can see a Rossby wave train propagating eastward from the 261 Atlantic basin to the EE region during the positive phase of AMM (Figure 2c). Along with 262 the Rossby wave train pathway, we notice an association with the eddy streamfunctions 263 patterns (Figure 2c; represented with the shading) which greatly resembles the geopoten-264 tial height patterns as observed in Figure 2a. Further, we observe an alternate positive and 265 negative Rossby wave sources along the atmospheric wave train (Figure 3a). The largest 266 negative Rossby wave source is found over the tropical Atlantic around 10°–20°N (Fig-267 ure 3a) where strong upward motion located (Figure 3b) and large positive precipitation 268 (Figure 3c) are noticed. Thus with positive precipitation and upward motion (Figure 3b-c) 269 play a crucial role in the formation of the strong negative Rossby wave source over the 270 tropical Atlantic (Figure 3a) – which indicates the atmospheric wave originating from the 271 tropical Atlantic [Chen et al., 2020, 2021]. Overall, these observational analyses reveal 272 a possible mechanism through which the AMM can affect the inter-annual variability of 273 summer temperatures over the EE region. The positive phase of AMM during summer – 274 induced via the deep convection process – causes an eastward propagation of the Rossby 275 wave train which triggers a blocking high over the EE region leading to hotter conditions 276 with positive temperature anomalies over the region. 277

278 3.2. Climate model control and perturbation analysis

To further ascertain the above findings and moving from the correlation/regression analysis to causation, we next performed a controlled climate model perturbation exper-

iment with the ICTP AGCM model [Molteni, 2003; Kucharski et al., 2013; Vittal et al., 281 2020b]. Results of the perturbation experiment are in good accord with the AMM-EE 282 response noted above in the observational analysis (Figure 4a). As with the observations, 283 here also, we find an increased geopotential height with a prominent anticyclonic circula-284 tion over the EE region, which further causes an increased temperature over the EE region 285 (Figure 4b). Moreover, in this case, we observe high and low centres of geopotential height 286 mimicking a Rossby wave-like pattern – similar to the observations. Additionally, we see 287 the eastward Rossby wave train propagation from the Atlantic basin to the EE region 288 during the positive phase of AMM (Figure 4c and d). The eddy streamfunction patterns 289 also resemble the results of observational analysis quite well (Figure 4d), and thereby 290 supporting the possible role of AMM in the eastward propagation of the Rossby wave. 291

Here, using this long-term control experiment, we complement the observational and 292 perturbation analysis results – under control conditions of radiative forcings and landuse 293 configurations (Vecchi et al. [2014]). The reason for using this is to test if the established 294 relation between AMM-EE summer temperature variability is robust given the long-term 295 climate simulations under the fixed boundary conditions. This further assists in providing 296 a mechanistic framework to understand the causation of the AMM vs. EE temperature 297 relationship [Zhang et al., 2016; Hari et al., 2022]. The long-term control simulation 298 could able to represent the meridional pattern reasonably well (Figure 5a). Further, we 299 also find that the long-term control simulations are in good accord with the AMM-EE 300 response as observed before in both observational and climate perturbation experiment 301 results (Figure 5b). As with the observational analysis, here also, we find an increased 302

geopotential height with a prominent anticyclonic circulation over the EE region during 303 the positive phase of the AMM. This further causes an increased temperature anomaly 304 over the EE region (Figure 5c). Although we notice an overall similarity between observed 305 and modelled responses to AMM, we do notice some biases in the model, which among 306 other things could be due to imprints of anthropogenic warming conditions [Diffenbaugh 307 et al., 2015; Williams et al., 2020; Bonfils et al., 2020; Dai, 2013] in observational datasets, 308 inability to represent key ocean/atmosphere feedback [Peings and Magnusdottir, 2015], 309 differences in spatial resolutions and, more importantly, the different forcing conditions. 310

311 3.3. Causal analysis

The aforementioned analysis establishes a relationship with a potential linkage between 312 the AMM and the summer EE temperature variability. Herein, we further extend our 313 research to understand the implications of this established linkage to the predictability of 314 EE temperature, considering other important large-scale climatic modes – such as ENSO, 315 NAO and AA along with AMM during the summer months. The ENSO is related to the 316 EE climate by forcing an eastward propagation of Rossby wave reaching the EE region [Sun 317 et al., 2016] – resembles the pattern partly during the positive phase of AMM. However, the 318 partial correlation analysis results suggest a persistent relationship between AMM and EE 319 temperature even while accounting for the effect of ENSO (Figure 6a). This relationship 320 (AMM vs. EE temperature) was robust even in the presence of other important climatic 321 modes such as NAO and AA (Figure 6a). To further strengthen the evidence of this 322 robustness, we carry out a detailed statistical causal analysis using the PCMCI causal 323

discovery framework [Runge et al., 2019]. Results of the PCMCI analysis confirm that the 324 AMM positively drives the EE summer temperature variability (Figure 6c) – in line with 325 the above results. As with some of the previous studies [Trenberth and Fasullo, 2012; 326 Sun et al., 2016, we also notice that the ENSO and NAO negatively influence the EE 327 temperature variability, and AA does not have a casual relationship with the inter-annual 328 variability of EE temperature (Figure 6c). Moreover, the important aspect here is that 329 AMM, ENSO and NAO are influencing the EE temperature variability (Figure 6b) in 330 a mutually exclusive and independent way - in line with the partial correlation analysis 331 (Figure 5a). 332

333 4. Conclusions

Heatwaves are predicted to increase both in their frequency and intensity in the future 334 along with an increase in the global mean temperature – over the northern Hemisphere 335 [Barriopedro et al., 2011], and Europe in particular [Rasmijn et al., 2018]. Nonetheless, 336 for proper mitigation and adaptation strategies, policy-makers would need a reliable pre-337 diction of these hydroclimatic extremes and for this, the information pertaining to the 338 causation of such events is important [Bellprat et al., 2019]. To this end, there have been 339 many studies exist to understand the physical mechanism responsible for such events over 340 the EE region. However, the role of tropical Atlantic ocean on the EE temperature vari-341 ability is not well addressed - specifically the influence of AMM, one of the dominant 342 climatic modes in the tropical Atlantic Ocean, on the EE temperature variability. To this 343 end, we have investigated the role of the AMM on the EE summer temperature variability 344

- the consistency and the robustness of which are confirmed both by the observations and
climate model perturbation experiments as well with robust (causal) statistical methods.
The mechanism with which it influences the EE region temperature variability is through
the eastward propagation of Rossby wave trains – which, in turn, cause an anomalous
anticyclonic circulation over the region and lead to higher anomalous temperature over
the EE region.

Previous studies do show that the EE summer temperature variability are influenced by 351 some of the important large-scale climatic modes – such as ENSO [Brönnimann, 2007; Sun 352 et al., 2016] and NAO [Hurrell, 1995; Krüger et al., 2020; Bierkens and Van Beek, 2009; Li 353 et al., 2020. In this study, we found that both these climatic modes, along with the AMM 354 do play an important role in explaining the temperature variability over EE (Figure 6b). 355 The relative importance analysis further reveals that the primary climatic mode – ENSO 356 - has the highest importance, followed by AMM and NAO. However, all these climatic 357 modes have a significant influence on the EE temperature variability and moreover, they 358 are mutually exclusive in explaining the variability – as seen in the causal analysis (Figure 359 6c). It is also observed that these climatic modes have a significant relation with EE 360 temperature variability only during the summer. However, the preceding winter months 361 of ENSO and NAO do show a significant association with the summer AMM (Figure 362 6c). A study by López-Parages and Terray [2022] specifically mentioned that ENSO – 363 one of its most robust remote impacts is that they affect the tropical Atlantic SST, i.e., 364 AMM, especially during the preceding months to summer. The telecommunication can 365 be explained through different mechanisms, such as (i) Rossby wave trains propagation 366

³⁶⁷ [Enfield and Mayer, 1997], (ii) changes in the zonal (Walker) and meridional (Hadley) ³⁶⁸ cells [Wang, 2004] and and (iii) a secondary Gill-type structure in the tropical Atlantic ³⁶⁹ [Doblas-Reyes et al., 2017]. Nonetheless, we believe a complete understanding of these ³⁷⁰ aspects is beyond the scope of the present study and can be considered a potential future ³⁷¹ research. In summary, our results add to previous efforts in associating the EE temperature ³⁷² variability to large-scale climate modes reliably and thereby provide a pathway to predict ³⁷³ such extreme events more accurately.

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385 Data Avilability

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loaded from: ERA5 (https://www.ecmwf.int/en/forecasts/datasets/reanalysis-datasets/ era5), NCEP-NCAR reanalysis data (https://psl.noaa.gov/data/gridded/data.ncep. reanalysis.html). The climate indicators used in the present study can be procured from: AMM (https://www.esrl.noaa.gov/psd/data/timeseries/monthly/AMM/), NAO (https://www.cpc.ncep.noaa.gov/data/teledoc/nao.shtml) and ENSO (https://origin. cpc.ncep.noaa.gov/products/analysis_monitoring/ensostuff/ONI_v5.php).

Data used here – temperature and large-scale atmoshpheric variabiles – can be down-

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Figure 1: Summer temperature variability (June–August) across the eastern European region and corresponding large-scale atmospheric and sea surface dynamics (a) Surface temperature anomaly over the European region during the summer of 2010 – which is one of the most severe heatwave summers in the eastern European region. (b) Inter-annual variability of summer temperature anomalies (anomalies with respect to the climatological mean) over the eastern European region ($50^{\circ}\text{E}-70^{\circ}\text{E}$ and $45^{\circ}\text{N}-60^{\circ}\text{N}$; shown in rectangular box in d). The positive (negative) anomalies are represented by blue (red) color. The positive one standard deviation value is indicated by the red dashed line. (c) Composites of the SST (°C) and surface wind anomalies corresponding to the major heatwave years over eastern European region (red dots in the panel b). The black rectangular box in panel (c) over the tropical Atlantic Ocean $(75^{\circ}E-15^{\circ}E \text{ and } 21^{\circ}S-32^{\circ}N)$ represents the core Atlantic Meridional Mode (AMM) region. The spatial pattern of both SST and wind in this region reveal the dominant positive phase of the AMM. (d) Regression of summer temperature over Europe onto leading AMM index during the period 1980–2019. The hatched areas represent the locations where the slopes are significant at the 5% level. (e) Box plot showing the differences in temperature in the eastern European temperature between the positive and negative phases of AMM.



Figure 2: Large-scale controls of AMM on the eastern European summer (June–August) heatwave variability from observations. (a) Large-scale atmospheric circulation pattern associated with the AMM in terms of the regression of 500 hPa geopotential height (shading) and winds (vectors) from NCEP reanalysis during 1951–2020. (b) The meridional wind response to the AMM during the summers from 1951–2020. (c) Same as (b) but for streamfunction and wave activity flux (WAF). We present the averaged WAF for those summers with increased (positive phase) AMM summers.



Figure 3: Correlation maps of (a) Summer Rossby wave source at 200 hPa level (b) summer 500 hPa omega and summer precipitation (c) with the summer AMM index from 1951–2019.



Figure 4: Representation of AMM forcing mechanisms on the eastern European temperature variability in a perturbation climate model experiment. (a) large-scale atmospheric circulation response to the AMM based on an ICTP climate model perturbation experiment (25 yr of simulation). (b) Temperature response over Europe to the AMM based on ICTP climate model perturbation experiment. (c) The meridional wind response to the AMM during the summers from the ICTP experiment. (d) Same as (c) but for streamfunction and wave activity flux (WAF). We present the averaged WAF for the perturbed experiment only whereas the streamfunction is the difference between the perturbed and CLIM experiments (See method for more details).



Figure 5: Representation of AMM forcing mechanisms on the EE temperature variability in a climate model control experiment. (a) The GFDL FLOR control model is able to represent the SST expansion mode of the AMM. (b) Temperature response over Europe to the AMM based on climate model control experiment. (c) Large-scale atmospheric circulation response to the AMM based on GFDL FLOR climate model control experiment (300 yr of simulation).



Figure 6: Relation of EE temperature with other important climate modes during summer. (a) Inter-annual variability of the leading AMM index and temperature over the EE region (represented with the bar plot) during summer, with variability being represented in terms of their standardized scores. Along with AMM, we also represent other important climatic modes, such as NAO, ENSO and AA - all these being represented with standardized values. We notice that the identified linkages between the AMM and EE temperature variability are robust even in the presence of these large-scale climate modes – represented with partial correlation analysis (provided in the inset of the figure wherein the p-value < 0.05 is represented with "*" symbol). (b) Relative importance analysis of the large-scale climatic modes on the EE temperature variability. (c1) Causal links between the EE temperature variability and the summer AMM with the presence of some other important drivers (during the summer months) using the PCMCI+ causal inference framework at 95% alpha level. (c2) We also considered the SST modes during the preceding winter season (represented with W, for example, the winter AMM is represented with WAMM and for the summer, it is with SAMM. Similar for other considered climatic modes) and their effect on the summer EE temperature variability along with the summer season. The correlation between SAMM and WENSO is 0.28 and SAMM and WNAO is -0.27 and these are significant at 5% level