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# Widespread drying of European peatlands in recent centuries

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Climate warming and human impacts are thought to be causing peatlands to dry, potentially converting them from sinks to sources of carbon. However, it is unclear whether the hydrological status of peatlands has moved beyond their natural envelope. Here we show that European peatlands have undergone substantial, widespread drying during the last ~300 years. We analyse testate amoeba-derived hydrological reconstructions from 31 peatlands across Britain, Ireland, Scandinavia and continental Europe to examine changes in peatland surface wetness during the last 2000 years. 60% of our study sites were drier during the period CE 1800-2000 than they have been for the last 600 years; 40% of sites were drier than they have been for 1000 years; and 24% of sites were drier than they have been for 2000 years. This marked recent transition in the hydrology of European peatlands is concurrent with compound pressures including climatic drying, warming and direct human impacts on peatlands, although these factors vary between regions and individual sites. Our results suggest that the wetness of many European peatlands may now be moving away from natural baselines. Our findings highlight the need for effective management and restoration of European peatlands.

Peatlands have acted as globally-important carbon (C) sinks since the Last Glacial Maximum<sup>1,2</sup> and contain ~20% of the soil C pool, despite only covering ~3% of the global landmass<sup>3,4</sup>. Peatlands accumulate C when the production of plant litter exceeds losses from microbial decomposition<sup>5</sup>. The maintenance of a shallow water table and near-saturated surface conditions are important for inhibiting C losses from microbial respiration in peatlands<sup>6</sup>. Several factors threaten the persistence of peatland ecosystem services: climate change, peat extraction, drainage, burning and land-use modification<sup>7</sup>. Field manipulations<sup>8</sup> and modelling studies<sup>9</sup> have indicated that the deepening of peatland water-tables leads to increasing peat oxidation, in turn causing the peat C stock that has built up over millennia to be decomposed and released to the atmosphere as carbon dioxide, with likely global-scale implications for climate change<sup>8,10</sup>. In Europe, peatlands store approximately five times more carbon than

forests<sup>11</sup> and about half of Europe's total soil organic C<sup>12</sup>. These huge C stores deserve an important place in Europe's climate mitigation measures and greenhouse gas emissions policies.

The current stability of peatland ecosystem services is poorly understood. In particular, it is unclear whether the current hydrological condition of peatlands has been substantially influenced by recent climate change and human impacts. Peatland hydrological processes are involved in multiple negative feedbacks at the site scale that may confer a degree of resistance and resilience against climate-induced drying<sup>13</sup>. This is set against clear shifts in palaeohydrological conditions in peat records, which are mostly interpreted as reflecting periods of past climate change<sup>14</sup>. Although monitoring of peatland water tables is now relatively commonplace, the longest instrumental records cover no more than a few decades, and are thus unable to provide any long-term context for the role of climate and human impacts in peatland drying. For example, one of the longest instrumental peatland water-table records in the world is from Männikjärve bog in Estonia. However, this record only began in CE 1951 and is therefore still too short to show long-term changes (Supplementary Section 1).

# Hydrological change in European peatlands

In the absence of long-term hydrological monitoring data, testate (or shell-forming) amoebae can be used to reconstruct past water-table depths (WTDs) from peat profiles using statistical transfer function models<sup>15</sup>. Several such studies in Europe have reported deepening water tables in recent centuries 14,16,17. We carried out a preliminary meta-analysis of 84 published testate-amoeba-based reconstructions (Methods) in order to assess general trends reported in the literature. The meta-analysis shows that shifts to drier conditions in European peatlands over the last 300 years have been reported in 69% of study sites; while shifts to wetter conditions have been reported in just 7% of sites; the remaining 24% of the records have either shown unclear trends or lack the chronological quality or sampling resolution needed to determine any shift (Supplementary Section 2). The most commonly reported ages of dry

shifts in the last ~200 years are CE 1850 (8%), 1900 (13%) and 1950 (13%) (Supplementary Section 2). However, these records are difficult to compare because of variations in chronological precision. temporal resolutions. transfer functions, modelling approaches. Here we present the first European-wide network of WTD reconstructions using high-quality, high-resolution testate amoeba data (Methods, Supplementary Section 3 and 4), and develop accurate chronological models for each site using Bayesian methods (Supplementary Section 5). We use the reconstructions to examine hydrological changes in European peatlands over the last two millennia and to determine the state of peatland hydrology in recent centuries in the context of longer-term baselines. Reconstructions from a range of peatland types (raised bogs, blanket peatland, poor fens and permafrost plateaus) were included in the analysis.

There is considerable variability in the water-table records between sites owing to regional climatic variability, differences in site response and chronological uncertainties. 78% of sites in Britain, Ireland, Scandinavia and the Baltics have undergone significant drying in the last 400 years (Fig. 1); while the other 22% of sites in these regions exhibited no significant change. 46% of sites in continental Europe have undergone significant drying in the last 400 years, 31% exhibited no significant change, while the remaining 23% have become significantly wetter – the only three sites in the entire dataset to do so. For each site we binned the reconstructed WTDs into 200-year intervals and calculated the average WTD for each bin. The use of 200-year bins strikes an appropriate balance between sufficient data points within each bin to allow statistical confidence, and enough bins to allow the identification of temporal trends. Considering all sites together, we found that 60% were drier in the period CE 1800-2000 (200-year average bins) than they have been for the last 600 years (CE 1400-2000); 40% of sites were drier than they have been for 1000 years (CE 1000-2000); and 24% were drier than they had been during the entire 2000-year record (since CE 1). We recognise that some of the individual peatlands in our dataset have exhibited high-magnitude dry- (and

indeed wet-) shifts earlier in the record, but it is only during the last 300 years that a consistent and coherent drying trend has emerged across multiple sites.

Local regression (loess) models highlight general trends in the compiled data (Fig. 2). Compiled records from all three regions show shallow water tables during the Little Ice Age (LIA) followed by rapid drying to present day. Deep water tables are evident during the Medieval Warm Period (MWP) in Britain, Ireland and Scandinavia, although there is no clear response to the MWP in Continental Europe. British and Irish sites show shallow water tables towards the end of the Dark Age Cold Period (DACP), but this is not apparent in other regions. In Scandinavia, this lack of signal may reflect low data density at this time and large chronological errors. Changepoint analysis identifies significant transitions to drier conditions during the past 300 years in the compiled data: CE 1914 in Britain and Ireland; CE 1777 and 1990 in Scandinavia and the Baltics; and CE 1756 in Continental Europe. When all sites are combined a change-point at CE 1751 is identified.

#### Potential climatic drivers

The shifts are closely linked with recent climate change as evidenced through comparison with reanalysis of instrumental climate data (Fig. 3; Supplementary Section 6). In Britain and Ireland, increased dryness in peatlands corresponds with a major decrease in summer (June-July-August: JJA) precipitation (up to 25 mm quarter<sup>-1</sup>) and an overall increase in summer temperature (up to 1°C), when we compare the second halves of the 19<sup>th</sup> and 20<sup>th</sup> centuries. In Scandinavia and the Baltics, most peatlands that have undergone deepening water tables over the same time period have also experienced a major increase in mean annual temperature of up to 2.5°C (Fig. 3B; Supplementary Section 6). In Continental Europe, the sites that have become drier are in areas that have warmed by up to 1°C (JJA). The five sites in Continental Europe that have become wetter between the second halves of the 19<sup>th</sup> and 20<sup>th</sup> centuries are located in regions that have experienced an increase in rainfall over this interval (Fig. 3A). Fig. 3C shows that most study sites have undergone significant drying from

the 17<sup>th</sup> to the 20<sup>th</sup> centuries, except three in continental Europe. Gridded climate proxy data suggest that precipitation has decreased across Europe over the last ~400 years (Supplementary Section 6), which is consistent with this trend. The variation in response of our study sites to precipitation and temperature may reflect the finding that summer water deficit is controlled by summer precipitation in mid-latitude oceanic peatlands whereas summer temperature plays a greater role in higher latitude, continental settings<sup>18</sup>.

# Human impacts on peatland ecosystems

We tested for other possible influences on peatland hydrology in addition to climate (Fig. 4). We classify 42% of our sites as having been significantly damaged by human activities; 29% have minor damage; and 29% are relatively undamaged. The human activities that have contributed to site degradation include peat cutting, drainage, burning, grazing, afforestation and scientific activities (e.g. installation of infrastructure and equipment). All these factors may have contributed to site-scale drying in recent centuries. It is clear that our sites in Britain and Ireland have seen more extensive degradation than elsewhere, particularly through cutting, drainage, burning and grazing. Two sites in Scandinavia have suffered severe damage from afforestation. Only two of our 31 sites (6%) have had no damage to the best of our knowledge (Lappmyran, Sweden and Jelenia Wyspa, Poland).

All global land areas have experienced an increase in atmospheric N deposition over the timeframe of our reconstructions<sup>20</sup>. Atmospheric N deposition has been shown to cause shifts in peatland plant communities, and increases in plant productivity through fertilisation<sup>21</sup> (Berendse et al., 2001). Conversely, ecosystem respiration also increases with N deposition through removal of nutritional constraints on microbial activity and the production of more labile plant litter<sup>22,23</sup>. However, we are aware of no field or modelling evidence for changes in peatland WTD as a direct result of N deposition.

Climate-driven drying of European peatlands is likely to have been exacerbated by direct human impacts during recent centuries. The hydrological shifts occurred at a time of rapidly expanding human populations across Europe<sup>24</sup>, expanding cropland, and increasing land-use intensity<sup>25</sup>. It is impossible to separate the effects of climate and direct human impacts in our records, as they are superimposed upon one another. Global and regional climate model projections for Europe generally agree on continued warming and reduced growing season moisture availability into the 21st century<sup>26</sup>. This may lead to continued water-table drawdown, which has been linked to catastrophic loss of peat C stocks through enhanced aerobic decomposition<sup>9</sup>. Our study sites include several of the least damaged peatlands in Europe; however, it is clear that almost all peatlands in Europe have been affected by human activities to some extent. The compound pressures of climate change and human impacts may push European peatlands beyond their capacity for resistance by overriding negative feedbacks amongst ecohydrological processes<sup>13</sup>. Furthermore, a hydrological tipping point may exist in peatlands where irreversible changes in plant communities and a shift from C sink to source is triggered in response to drying<sup>27,28</sup>. Indeed, many European peatlands have already undergone shifts in vegetation composition over the last 300 years, including changes in Sphagnum communities<sup>29</sup>, and increases in grass, sedge<sup>30</sup> and shrub (e.g. Calluna vulgaris)<sup>31</sup> cover.

Projects are underway to restore peatlands across Europe, in order to maintain and enhance their vital ecosystem services, primarily through damming or blocking of artificial drains and gullies<sup>32</sup>. These actions may be vital in mitigating against soil C stock loss due to both anthropogenic impacts and future climatic warming. Our data suggest that European peatlands are in a state of transition, which may cause them to become drier than their natural baselines. Management strategies and restoration efforts (e.g. drain blocking) need to take these findings into account.

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#### **Author contributions**

G.T.S. designed the study. G.T.S., P.J.M., D.J.M., R.J.P., T.P.R, M.J.A., M.L., T.E.T, A.G.S. and T.S. compiled site-based data and performed analyses. All other others provided data or carried out a minor component of data compilation or analysis. G.T.S., P.J.M. and D.J.M. carried out the composite data analysis and wrote the manuscript, with input from all authors.

# **Competing interests**

The authors declare no competing interests.

#### **Additional information**

**Supplementary information** is available for this paper at XX.

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# **Figure Captions**

Fig. 1. Standardised water-table depth data from each site classified into three broad geographic regions (Britain and Ireland; Scandinavia and Baltics; Continental Europe). Data from the last 2ka and CE 1600-present day are shown. Linear regression trend lines for the period CE 1600 to present day are illustrated: solid trend lines indicate statistically-significant models (*p*<0.05); dashed trend lines indicate non-significant models. The percentage of sites which have become significantly drier or wetter, and the percentage of those with non-significant linear models, are shown. Please see Methods for references to previously published data.

Fig. 2. Compiled standardised water-table data from all sites and the three broad geographic regions (Britain and Ireland; Scandinavia and Baltics; Continental Europe). Greyscale indicates the chronological precision of each data point (determined through Bayesian age modelling). A locally-estimated scatterplot smoothing (loess) model is shown as a yellow line. The red shading indicates 95% confidence limits on the loess function. The timings of the Dark Ages Cold Period (DACP), Medieval Warm Period (MWP) and Little Ice Age (LIA) are illustrated. Significant change point years are illustrated. Please see Methods for references to previously published data.

Fig. 3. Comparison of peatland and climatic datasets. Changes in summer (June-July-August) precipitation totals (A) and temperatures (B) interpolated from 2° latitude x 2° longitude grids across Europe between the second half of the 19th and 20th centuries: (CE 1950-1999)

average) minus (CE 1850-1899 average). Data taken from NOAA-CIRES Twentieth Century Reanalysis (V2c)<sup>19</sup>. The points in (A) and (B) represent (CE 1950-1999 average) minus (CE 1850-1899 average) standardised water-table depths. Panel C shows (CE 1950-1999 average) minus (CE 1600-1699 average) standardised water-table depths. Literature-based sites reporting a drying or wetting trend in the last ~200 years are also shown (Supplementary Section 2). Please see Methods for references to previously published data.

Fig. 4. Matrix indicating the type and level (major, moderate, minor, none known) of human impacts on each study site. A damage index was calculated as the total sum of all impacts. The type of peatland is indicated in superscript font. Please see Methods for references to previously published data.

# **Methods**

# 1. Justification of approach

Peat profiles that span the most recent centuries are commonly within the aerobic zone (previously referred to as the "acrotelm" in the diplotelmic peat model); therefore, semi-quantitative reconstructions based on the degree of peat humification were excluded from the meta-analysis as peat within the aerobic zone is subject to further decomposition. Reconstructions using plant macrofossil approaches were also discounted as no European transfer function currently exists for peatland plants. Therefore, only testate amoeba data are considered here as 1) hydrology has consistently been shown to be the primary environmental control of community composition over other factors in ombrotrophic peatlands<sup>33, 34</sup>; 2) levels of pollution associated with atmospheric deposition do not bias reconstructions<sup>35</sup>; and 3) direct comparison of records is possible between transfer-function based water table reconstructions.

#### 2. Literature-based analysis

To support our primary analysis of high-quality data we conducted a comprehensive literature-based review of peat-based palaeohydrological reconstructions covering the last 300 years from northwest Europe (Supplementary Section 2).

# 2.1 Chronological quality

Records were rated on chronological certainty and proxy resolution. Radiocarbon age-depth models substantiated with known age stratigraphic markers (Hekla 1947 tephra, bomb-pulse), or inferred age stratigraphic markers (Spheroidal Carbonaceous Particles (SCPs), *Pinus* rise) bolstered with further radiometric dating (<sup>210</sup>Pb, <sup>241</sup>Am), were rated the most chronologically secure (rating = 1); records with radiocarbon-based age-depth models with a single inferred age marker (SCPs or *Pinus* rise), or short records (200 years or less) with SCP-based chronology where rated as chronologically good (rating = 2); those based on linear interpolation of radiocarbon dates were assigned low chronological confidence (rating = 3).

# 2.2 Human impacts

The main human impacts recorded in the literature for each site (e.g. peat cutting, drainage, burning, afforestation) were noted.

# 2.3 Analysis

The timing of any reported change to drier or wetter conditions in the last 300 years from each paper was reported.

#### 3. Quantitative analysis

#### 3.1 Water-table reconstruction

Testate amoeba data from European peatlands were compiled and quality checked before having their taxonomies harmonised to the taxonomic system of Amesbury et al. (2016)<sup>36</sup> for transfer function application. Only datasets with high quality absolute chronologies for the last ~200 years were selected for further analysis. Water-table reconstructions were carried out using the pan-European transfer function of Amesbury et al. (2016)<sup>36</sup> with a weighted averaging tolerance-downweighted model with inverse deshrinking. Water-table depth reconstructions were converted to standard units (z-scores) following Swindles et al. (2015)<sup>37</sup>. Reconstructions were carried out on the full dataset and also a dataset after the weak silicic idiosomic tests (*Corythion-Trinema* type, *Euglypha ciliata* type and *Euglypha rotunda* type<sup>38</sup>) were removed. In reality, there is virtually no difference between the two reconstructions showing that the features observed in the uppermost peat profiles are not related to poor preservation of weak siliceous tests (Supplementary Section 3 and 4). The reconstructions ran on the data without the weak silicic idiosomic tests were used for subsequent analysis.

# 3.2 Age modelling

Age models were constructed for each site using chronological data including <sup>14</sup>C, <sup>210</sup>Pb, and other age-equivalent stratigraphic markers such as SCPs. Bayesian age models were generated for each site to achieve good accuracy and quantification of age errors (Supplementary Section 5) using R version 3.4.1<sup>39</sup>, and the rbacon package (version 2.3.4)<sup>40</sup>. Bacon uses *a priori* information of peat accumulation rate, over multiple short sections of the core to produce flexible, robust chronologies. We modelled all cores to determine the age probability for each depth. Hereafter, all references to ages or years refer to the maximum probability age at a given depth, as determined from the age model, unless otherwise specified. We also also the age models to generate age error ranges for each depth.

#### 3.3 Trend lines

A linear least-squares regression was carried out for each record for the period CE 1600-present to determine whether there was a drying or wetting trend over this timeframe. An F-test was used to determine whether each model provided a better fit to the data than a model containing no independent variables. A standard t-test was used to evaluate the slope and intercept coefficients. The analysis was completed using R version 3.4.1<sup>39</sup>.

### 3.4 Data compilation analysis

All data were compiled within 4 groups: All sites; Britain and Ireland; Scandinavia and Baltics; and Continental Europe. A LOESS smoothing function<sup>41</sup> with an f-value (degree of smoothing) setting of 0.02 was calculated for the compiled regional datasets. Changepoint analysis<sup>42</sup> was performed on the compiled data to identify major changes in mean and variance over time (function cpt.meanvar) in the datasets using the package 'Package 'changepoint'<sup>42</sup> in R version 3.4.1<sup>39</sup>. The temporal span used in this analysis was 1000 cal. CE to present. The singular most likely changepoint in mean and variance was then identified using an "At Most One Change" (AMOC) method under default settings. In addition, multiple changepoints in mean and variance of the time series were then identified using "Pruned Exact Linear Time" (PELT)<sup>43</sup> method under default settings, with the number of changepoints limited to a maximum of 4.

# 3.5 Climate analysis

Temperature and precipitation data representing the period 1851-2010 were downloaded from KNMI Climate Explorer (<a href="https://climexp.knmi.nl/">https://climexp.knmi.nl/</a>). We used the NOAA-CIRES Twentieth Century Reanalysis (V2c) dataset<sup>19</sup> – a comprehensive global atmospheric circulation dataset based on the assimilation of four-dimensional weather maps and their uncertainty from the

mid-19<sup>th</sup> century to the 21<sup>st</sup> century. Data were downloaded at a monthly temporal resolution and at a spatial resolution of 2° latitude x 2° longitude for the spatial domain 40-70°N and 10°W-30°E. Maps showing change in summer temperature and precipitation across Europe were produced by first splitting data into two 50-year time periods from 1850-1899 and 1950-1999 respectively for the summer months of June, July and August. The difference between these periods was then calculated and kriging was used within ArcMap to interpolate between grid points to produce surface temperature and precipitation maps for Europe that represent the change in summer temperature and precipitation between the second half of the 19<sup>th</sup> and 20<sup>th</sup> centuries. Graphs showing temporal changes in temperature and precipitation across Europe were produced by first splitting data into four different spatial domains encompassing (1) Britain and Ireland, (2) Scandinavia, (3) Continental Europe, and (4) the three regions combined.

Changes for these four domains were then plotted as time series along with a smoothed line based on loess smoothing. Linear trends were calculated using linear regression. Using the years of the time series as the known x values and the climate data as the known y values, a linear regression equation was constructed and then used to predict y values (i.e. temperatures or precipitation) for the start and end years of the time series. The difference between the values for these years was then computed and expressed as a percentage of the temperature/precipitation value for the starting year.

Another set of time series for the same four regions was produced for the longer period of 1500-2000 based on temperature and precipitation reconstructions downloaded from KNMI Climate Explorer based on datasets from Luterbacher et al. (2004)<sup>44</sup> and Pauling et al. (2006)<sup>45</sup> respectively. Please also see Supplementary Section 6.

# 3.6 Human impacts

It is widely acknowledged that the majority of peatlands across Europe have been affected by human activity to at least some degree. Evidence of human activity for each site was recorded in several categories: cutting, drainage, burning, grazing, afforestation, and scientific activity (e.g. installation of scientific and monitoring equipment) within a matrix. The damage level for each individual category was noted as major (score 3), moderate (score 2), minor (score 1) and none known (score 0). A damage index for each site was calculated by summing the scores for each category (>4 = damaged site; 3-4 = minor damage; 0-2 = relatively undamaged).

#### 3.7 Data sources

All published data sources are provided below:

Site	Region	Country	Latitude	Longitude	Reference
Ardkill	Britain and Ireland	Ireland	53.3653	-6.9532	46
Ballyduff	Britain and Ireland	Ireland	53.0807	-7.9925	47
Butterburn	Britain and Ireland	England	55.0875	-2.5036	48
Cloonoolish	Britain and Ireland	Ireland	53.1865	-8.2569	46
Dead Island	Britain and Ireland	Ireland	54.8862	-6.5487	49
Derragh	Britain and Ireland	Ireland	53.7667	-7.4083	50
Keighley	Britain and Ireland	England	54.4253	-2.0369	51
Malham	Britain and Ireland	England	54.0964	-2.1750	52
Slieveanorra	Britain and Ireland	Ireland	55.0848	-6.1921	49
Bagno Kusowo	Continental Europe	Poland	53.8078	16.5872	53
Barschpfuhl	Continental Europe	Germany	53.0558	13.8494	54
Combe des Amburnex	Continental Europe	Switzerland	46.5397	6.2317	55
Gązwa	Continental Europe	Poland	53.8726	21.2201	56
Izery	Continental Europe	Poland	50.8519	15.3602	57
Jelenia Wyspa	Continental Europe	Poland	53.5918	17.9821	58
Linje	Continental Europe	Poland	53.1880	18.3098	59
Mauntschas	Continental Europe	Switzerland	46.4900	9.8544	60
Mechacz	Continental Europe	Poland	54.3314	22.4419	61
Praz-Rodet	Continental Europe	Switzerland	46.5667	6.1736	62
Słowińskie	Continental Europe	Poland	54.3619	16.4785	63
Stążki	Continental Europe	Poland	54.4244	18.0833	64
Tăul Muced	Continental Europe	Romania	47.5739	24.5450	65
Akerlänna Römosse	Scandinavia and Baltic	Sweden	60.0167	17.3667	66
Ältabergsmossen	Scandinavia and Baltic	Sweden	59.9667	18.6833	67

Gullbergbymossen	Scandinavia and Baltic	Sweden	59.6333	18.4333	67
Kontolanrahka	Scandinavia and Baltic	Finland	60.4783	22.4783	68
Lappmyran	Scandinavia and Baltic	Sweden	64.1647	19.5828	69
Lille Vildmose	Scandinavia and Baltic	Denmark	56.8391	10.1896	70
Männikjärve	Scandinavia and Baltic	Estonia	58.8667	26.2500	71
Stordalen 1	Scandinavia and Baltic	Sweden	68.3568	19.0484	72
Stordalen 2	Scandinavia and Baltic	Sweden	68.3564	19.0441	73

Water-table reconstruction data are provided in Supplementary Section 7.

# Data availability statement

The data that support the findings of this study are provided in Supplementary Section 7.

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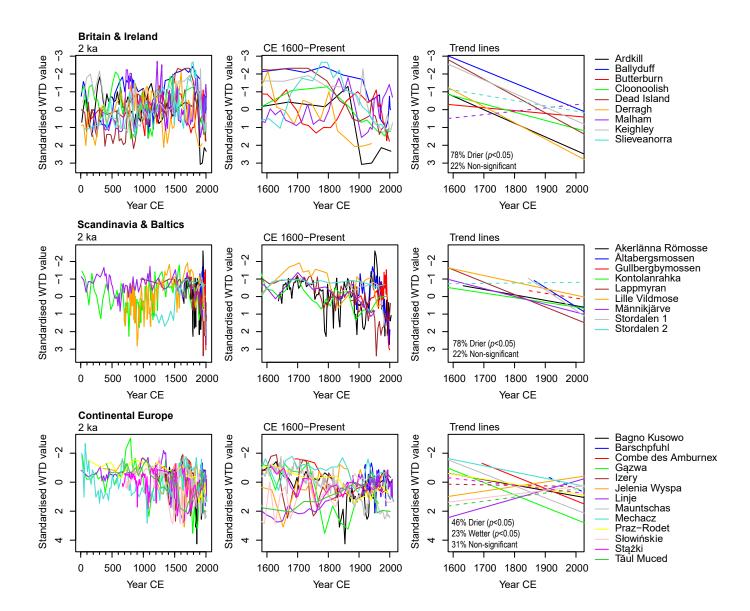
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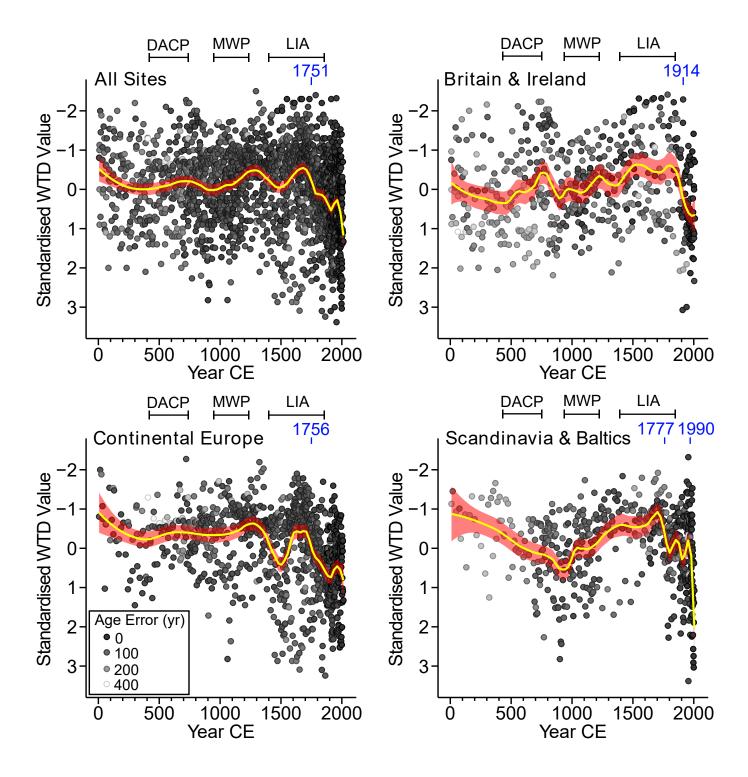
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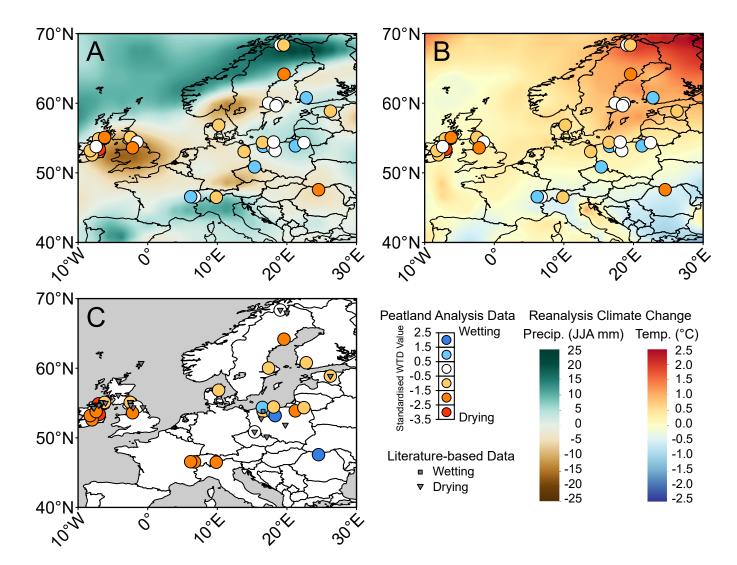
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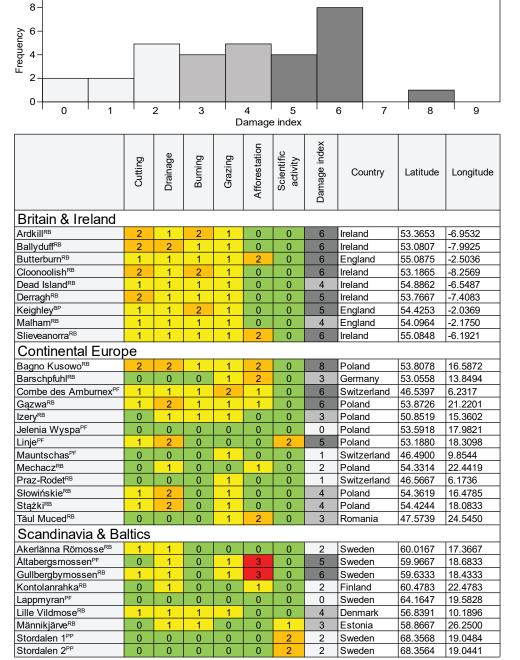
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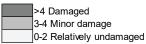








3	Major
2	Moderate
1	Minor
0	None known



RB = Raised bog (ombrotrophic) BP = Blanket peatland (ombrotrophic) PP = Permafrost plateau (ombrotrophic)

PF = Poor fen