## POLITECNICO DI TORINO Repository ISTITUZIONALE

#### Changing climate both increases and decreases European river floods

Original

Changing climate both increases and decreases European river floods / Blöschl, Günter; Hall, Julia; Viglione, Alberto; Perdigão, Rui A P; Parajka, Juraj; Merz, Bruno; Lun, David; Arheimer, Berit; Aronica, Giuseppe T; Bilibashi, Ardian; Bohá, Milo; Bonacci, Ognjen; Borga, Marco; anjevac, Ivan; Castellarin, Attilio; Chirico, Giovanni B; Claps, Pierluigi; Frolova, Natalia; Ganora, Daniele; Gorbachova, Liudmyla; Gül, Ali; Hannaford, Jamie; Harrigan, Shaun; Kireeva, Maria; Kiss, Andrea; Kjeldsen, Thomas R; Kohnová, Silvia; Koskela, Jarkko J; Ledvinka, Ondrej; Macdonald, Neil; Mavrova-Guirguinova, Maria; Mediero, Luis; Merz, Ralf; Molnar, Peter; Montanari, Alberto; Murphy, Conor; Osuch, Marzena; Ovcharuk, Valervia; Radeyski, Ivan; Salinas, José L; Sauguet, Eric; Šraj, Mojca; Szolgay, Jan; Volpi, Elena; Wilson, Donna; Zaimi, Klodian; Zivkovi, Nenad. - In: NATURE. - ISSN 0028-0836. - (2019). [10.1038/s41586-019-1495-6]

Publisher: Springer Nature Publishing

Published DOI:10.1038/s41586-019-1495-6

Terms of use:

This article is made available under terms and conditions as specified in the corresponding bibliographic description in the repository

Publisher copyright

(Article begins on next page)

# Changing climate both increases and decreases **European river floods**

Günter Blöschl<sup>1</sup><sup>†</sup>, Julia Hall<sup>†1</sup>, Alberto Viglione<sup>1, 12</sup>, Rui A. P. Perdigão<sup>1</sup>, Juraj Parajka<sup>1</sup>, Bruno Merz<sup>2</sup>. David Lun<sup>1</sup>, Berit Arheimer<sup>3</sup>, Giuseppe T. Aronica<sup>4</sup>, Ardian Bilibashi<sup>5</sup>, Miloň Boháč<sup>6</sup>, Ognien Bonacci<sup>7</sup>, Marco Borga<sup>8</sup>, Ivan Čanjevac<sup>9</sup>, Attilio Castellarin<sup>10</sup>, Giovanni B. Chirico<sup>11</sup>, Pierluigi Claps<sup>12</sup>, Natalia Frolova<sup>13</sup>, Daniele Ganora<sup>12</sup>, Liudmyla Gorbachova<sup>14</sup>, Ali Gül<sup>15</sup>, Jamie Hannaford<sup>16</sup>, Shaun Harrigan<sup>17</sup>, Maria Kireeva<sup>13</sup>, Andrea Kiss<sup>1</sup>, Thomas R, Kieldsen<sup>18</sup>, Silvia Kohnová<sup>19</sup>, Jarkko J. Koskela<sup>20</sup>, Ondrej Ledvinka<sup>6</sup>, Neil Macdonald<sup>21</sup>, Maria Mavrova-Guirguinova<sup>22</sup>, Luis Mediero<sup>23</sup>, Ralf Merz<sup>24</sup>, Peter Molnar<sup>25</sup>, Alberto Montanari<sup>9</sup>, Conor Murphy<sup>26</sup>, Marzena Osuch<sup>27</sup>, Valeryia Ovcharuk<sup>28</sup>, Ivan Radevski<sup>29</sup>, José L. Salinas<sup>1</sup>, Eric Sauquet<sup>30</sup>, Mojca Šraj<sup>31</sup>, Jan Szolgay<sup>18</sup>, Elena Volpi<sup>32</sup>, Donna Wilson<sup>33</sup>, Klodian Zaimi<sup>34</sup>, and Nenad Živković<sup>35</sup>

<sup>2</sup>Helmholtz Centre Potsdam, GFZ German Research Centre for Geosciences, Potsdam, Germany

<sup>4</sup>Department of Engineering, University of Messina, Messina, Italy

<sup>6</sup>Czech Hydrometeorological Institute, Prague, Czechia

- <sup>8</sup>Department of Land, Environment, Agriculture and Forestry, University of Padova, Padua, Italy
- <sup>9</sup>University of Zagreb, Faculty of Science, Department of Geography, Zagreb, Croatia
- <sup>10</sup>Department of Civil, Chemical, Environmental and Materials Engineering (DICAM), Università di Bologna, Bologna, Italy
- <sup>11</sup>Department of Agricultural Sciences, University of Naples Federico II, Naples, Italy
- <sup>12</sup>Department of Environment, Land and Infrastructure Engineering (DIATI), Politecnico di Torino, Turin, Italy
- <sup>13</sup>Department of Land Hydrology, Lomonosov Moscow State University, Moscow, Russia
- <sup>14</sup>Department of Hydrological Research, Ukrainian Hydrometeorological Institute, Kiev, Ukraine
- <sup>15</sup>Department of Civil Engineering, Dokuz Eylul University, Izmir, Turkey
   <sup>16</sup>Centre for Ecology & Hydrology, Wallingford, Oxfordshire, UK
- <sup>17</sup>Forecast Department, European Centre for Medium-Range Weather Forecasts (ECMWF), UK
- <sup>18</sup>Department of Architecture and Civil Engineering, University of Bath, Bath, UK

<sup>19</sup>Slovak University of Technology in Bratislava, Faculty of Civil Engineering, Department of Land and Water Resources Management, Bratislava, Slovakia

<sup>20</sup>Finnish Environment Institute, Helsinki, Finland

<sup>21</sup>Department of Geography and Planning & Institute of Risk and Uncertainty, University of Liverpool, Liverpool, UK

- <sup>22</sup>University of Architecture, Civil Engineering and Geodesy, Sofia, Bulgaria
- <sup>23</sup>Department of Civil Engineering: Hydraulic, Energy and Environment, Universidad Politécnica de Madrid, Madrid, Spain
- <sup>24</sup>Department for Catchment Hydrology, Helmholtz Centre for Environmental Research UFZ, Halle, Germany
- <sup>25</sup>Institute of Environmental Engineering, ETH Zurich, Zurich, Switzerland

<sup>26</sup>Irish Climate Analysis and Research Units (ICARUS), Department of Geography, Maynooth University, Ireland

<sup>27</sup>Department of Hydrology and Hydrodynamics, Institute of Geophysics Polish Academy of Sciences, Warsaw, Poland

<sup>28</sup>Hydrometeorological Institute, Odessa State Environmental University, Odessa, Ukraine

<sup>29</sup>Institute of Geography, Faculty of Natural Sciences and Mathematics, Ss. Cyril and Methodius University, Skopje, Republic of Macedonia

<sup>30</sup>Irstea, UR RiverLy, Lyon-Villeurbanne, France

<sup>31</sup>University of Ljubljana, Faculty of Civil and Geodetic Engineering, Ljubljana, Slovenia

<sup>32</sup>Department of Engineering, University Roma Tre, Rome, Italy

<sup>33</sup>Norwegian Water Resources and Energy Directorate, Oslo, Norway

<sup>34</sup>Institute of Geo-Sciences, Energy, Water and Environment (IGEWE), Polytechnic University of Tirana, Tirana, Albania <sup>35</sup>University of Belgrade, Faculty of Geography, Belgrade, Serbia

† These authors contributed equally to this work.

<sup>&</sup>lt;sup>1</sup>Institute of Hydraulic Engineering and Water Resources Management, Technische Universität Wien, Vienna, Austria

<sup>&</sup>lt;sup>3</sup>Swedish Meteorological and Hydrological Institute, Norrköping, Sweden

<sup>&</sup>lt;sup>5</sup>CSE – Control Systems Engineer, Renewable Energy Systems & Technology, Tirana, Albania

<sup>&</sup>lt;sup>7</sup>Faculty of Civil Engineering, Architecture and Geodesy, Split University, Split, Croatia

<sup>\*</sup> e-mail: bloeschl@hydro.tuwien.ac.at

#### 1 Abstract

2

3 Climate change has led to concerns of increasing river floods resulting from the greater water holding capacity of a warmer atmosphere<sup>1</sup>. This concern is reinforced by evidence of 4 5 increasing economic losses in many parts of the world, including Europe<sup>2</sup>. Any changes in 6 river floods would have lasting implications for designing flood protection measures and for 7 flood risk zoning. Existing studies have been unable to identify a consistent continental-scale 8 climatic change signal in flood discharge observations in Europe<sup>3</sup>, because of limited spatial 9 coverage and choices in the grouping of hydrometric stations. Here we show that clear 10 regional patterns of both increases and decreases in observed river flood discharges in the last five decades in Europe are evident, which are likely manifestations of a changing climate. Our 11 results suggest that (i) increasing autumn and winter rainfall has led to increasing floods in 12 northwestern Europe, (ii) decreasing precipitation and increasing evaporation have led to 13 14 decreasing floods in medium and large catchments in southern Europe and (iii) decreasing 15 snowcover and snowmelt as a result of warmer temperatures have led to decreasing floods in 16 eastern Europe. Regional flood discharge trends in Europe range from an increase of +11.4% 17 per decade to a decrease of -23.1%. Notwithstanding the spatial and temporal heterogeneity of the observational record, the flood changes identified here are broadly consistent with 18 climate model projections for the next century<sup>4,5</sup>, suggesting that climate-driven changes are 19 already happening, which supports calls for future climate change consideration in flood risk 20 management.

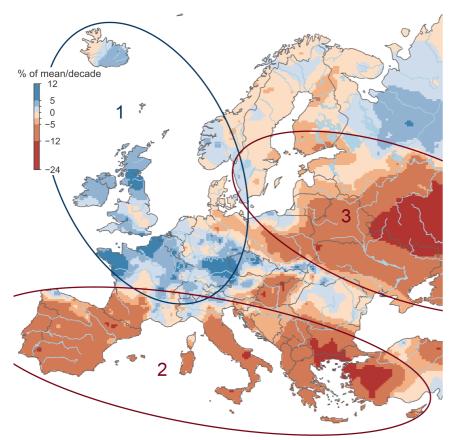
- River floods are among the most costly natural hazards. Global annual average losses are estimated at US \$104 billion<sup>6</sup>, and are expected to increase as a result of economic growth, urbanization and climatic change<sup>2,7</sup>. Physical arguments of increased heavy precipitation resulting from the enhanced water holding capacity in a warmer atmosphere and the occurrence of numerous large floods have exacerbated concerns of increasing flood magnitudes<sup>1</sup>. However, observations of individual extreme events do not necessarily imply that the long-term statistics of flood discharge are also increasing<sup>3</sup>.
- 29

30 In Europe, a climatic change signal in flood discharges over the past five decades has been demonstrated in relation to changes in timing of floods within the year<sup>8</sup>. For example, in 31 32 northeastern Europe, warmer air temperatures have led to earlier spring snowmelt floods. However, 33 changes in flood discharges are still contested, as no coherent large-scale observational evidence has to date been available at the continental scale, as a result of limited spatial coverage and choices 34 35 in the grouping of hydrometric stations<sup>3</sup>. A number of studies point towards increases in flood discharges in western Europe in the past five decades. The findings include upward trends in flood 36 37 discharges in 15% of the stations<sup>9</sup>, an increase in the occurrence of extreme flood discharges by 38 44%<sup>10</sup>, and significant increases in major-flood occurrence in medium sized catchments<sup>11</sup>. However, 39 these studies are not fully representative as the stations are mainly clustered around western Europe.

40

41 Here we analyze the most comprehensive data set of flood observations in Europe<sup>12</sup> to show that a 42 changing climate has increased river flood discharges in some regions of Europe, but decreased 43 floods in others. We base our analysis on river discharge observations from 3738 gauging stations 44 for the period 1960–2010. The catchment areas range between 5 and 100,000 km<sup>2</sup>. For each station, 45 we extracted a series consisting of the highest peak discharge recorded in each calendar year, the annual maximum peak flow. We estimated the trend in each series using the Theil-Sen slope 46 47 estimator, tested the statistical significance with the Mann-Kendall test, and estimated regional 48 trends by spatial interpolation. We also derived the long-term evolution of floods using a 10-year 49 moving average filter. Finally, we analyzed in a similar fashion the change signal of three plausible 50 drivers of floods: annual maximum 7-day precipitation; highest monthly soil moisture in each year; 51 and spring (January to April) mean air temperature as a proxy for snowmelt and snowfall-to-rain 52 transition. We examined the consistency of the changes in the drivers with those of the floods by 53 comparing the change patterns and by Spearman rank correlation coefficients. 54

55 Our data show a clear regional pattern in flood trends across Europe (Fig. 1). Regional trends, 56 relative to the mean flood discharges over 1960-2010, range from an increase of +11.4% to a 57 decrease of -23.1% per decade (Fig. 1). The uncertainties of the regional trends (Extended Data Fig. 58 2b) are small (typically between 1 and 2% per decade) relative to the spatial signal. Local trends 59 (Extended Data Fig. 2a) at the stations range from an increase of +17.8% to a decrease of -28.8% of 60 the long-term station mean per decade. The spatial patterns of trends are grouped into three main 61 regions. In northwestern Europe (Fig. 1, region 1), ~69% of stations show an increasing flood trend 62 (Extended Data Table 2a) with an average local increase of +2.3% per decade. In southern Europe (Fig. 1, region 2), ~74% of stations show a decreasing trend with a regional average trend of -5% 63 per decade. In eastern Europe (Fig. 1, region 3), ~78% of stations show a decreasing flood trend 64 65 with an average decrease of -6% per decade. In northern Scandinavia and northwestern Russia, 66 trends are less pronounced.



68

Fig. 1 | Observed regional trends of river flood discharges in Europe (1960–2010). Blue indicates increasing flood discharges, red decreasing flood discharges (percentage change per decade of the mean annual flood discharge). No. 1–3 indicate regions with distinct drivers: [1] northwestern Europe: increasing rainfall and soil moisture; [2] southern Europe: decreasing rainfall and increasing evaporation; [3] eastern Europe: decreasing and earlier snowmelt. The trends are based on n = 2370 hydrometric stations. For uncertainties see Extended Data Fig. 2b.

To interpret these changes we focused on seven hotspots of change, where flood trends are particularly clear and flood processes are broadly similar<sup>8</sup> (Extended Data Fig. 2). Because floods result from the interaction between precipitation, soil moisture and snowmelt, we analyzed the temporal evolution of these drivers, using air temperature as a surrogate for snowmelt, and compared them to that of floods (Extended Data Fig. 4 a–g). Depending on the region, some of these drivers can be more important than others in explaining flood changes<sup>8</sup>.

83

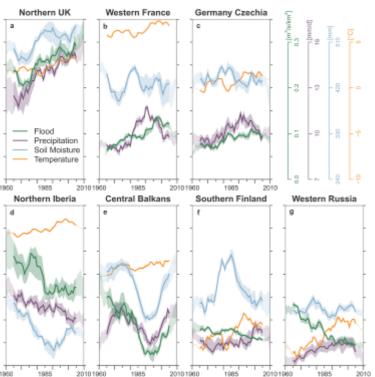
84 In northern UK, floods predominantly result from winter rains associated with high soil moisture<sup>14</sup> 85 (Extended Data Fig. 4a). The increase in the flood discharges therefore closely follows increases in winter rainfall and to some degree that of soil moisture (Fig. 2a). This is also shown by statistically 86 87 significant positive correlations between the temporal variability of flood discharges and these two 88 drivers (Spearman rank correlation coefficient r = 0.70 and 0.36, respectively, Table 1). In western France (Fig. 2b), southern Germany and western Czechia (Fig. 2c), increases in floods are also 89 90 associated with increases in rainfall, although the correlation with soil moisture is stronger than in 91 the UK, reflecting the important role of soil moisture in flood generation during spring and 92 summer<sup>15</sup> (Extended Data Fig. 4 a-c). In northern Iberia (Fig. 2d), decreasing floods are mainly 93 caused by decreasing winter rainfall, amplified by decreasing soil moisture linked to increasing 94 evapotranspiration<sup>16</sup>. Similarly, in the central Balkans (Fig. 2e), floods have decreased over most of 95 the study period as a result of decreasing precipitation and soil moisture, but the trend appears to 96 have reversed in the 1990s. In southern Finland (Fig. 2f) and western Russia (Fig. 2g), floods 97 usually occur in spring<sup>17</sup>, and snowmelt plays an important role. The data show that air temperature

98 has strongly increased (more than 0.5°C per decade) and spring and early summer flood discharges

have decreased (r = -0.34 and -0.55, respectively, Table 1), reflecting shallower snow packs, earlier

100 spring thaw (Extended Data Fig. 4f-g), and decreasing snowmelt.

101



102 103 Fig. 2 | Long-term temporal evolution of flood discharges and their drivers for seven hotspots 103 in Europe. (a) Northern UK, (b) Western France (c) Southern Germany and Western Czechia, (d) 105 Northern Iberia, (e) Central Balkans, (f) Southern Finland, (g) Western Russia. Observed floods 106 (green), maximum 7-day precipitation (purple), maximum monthly soil moisture (blue), and mean 107 spring air temperature (orange). Solid lines show the median and shaded bands indicate the spatial 108 variability within the hotspots (25<sup>th</sup> and 75<sup>th</sup> percentile). All data were subjected to a 10-year 109 moving average filter. Vertical axes are indicated in top right corner.

110 111

112 Table 1 | Spearman's rank correlation coefficient (r) between hotspot medians of the annual 113 series of flood discharge and their drivers. Confidence bounds of r are given in Extended Data

114 Table 2b.

	Northern	Western	Germany	Northern	Central	Southern	Western
	UK	France	Czechia	Iberia	Balkans	Finland	Russia
Precipitation	0.70 **	0.41 *	0.40 *	0.54 **	0.22	0.08	-0.13
Soil Moisture	0.36 *	0.57 **	0.56 **	0.37 *	0.68 **	0.20	0.30
Spring temperature	0.09 †	0.50 ** †	0.04	0.02	-0.29	-0.34	-0.55 **

115 [(\*\*) p-value < 0.001, (\*) p-value < 0.01, <sup>†</sup> Little snow influence on floods. Bold print indicates largest correlation 116 coefficients in each hotspot.]

117

118 In northwestern Europe (Fig. 1, region 1), increases in extreme precipitation (Fig. 2a-c; Extended

119 Data Fig. 5b) are related to the poleward shift of the subpolar jet and associated storm tracks

120 observed since the 1970s associated with more prevalent positive phases of the North Atlantic

121 Oscillation (NAO) and polar warming<sup>18</sup>. The relationship of NAO variability with polar warming is

122 still debated. Floods in the northern UK hotspot are closely aligned with increasing precipitation

resulting in a mean flood discharge trend of +6.6% (Extended Data Table 2c).

125 In southern Europe (Fig. 1, region 2), the northward shift of the subtropical jet and associated storm tracks<sup>19</sup> as a result of the expansion of the Hadley cell<sup>20</sup> has led to decreasing precipitation, which, 126 together with increasing evapotranspiration<sup>16</sup> related to warmer temperatures, has substantially 127 reduced soil moisture by around 5% per decade (Extended Data Figs. 5b.6b.7b). The combined 128 129 effect has resulted in decreasing flood discharges in the catchments analyzed here. Small 130 catchments of a few square kilometers are not contained in the data set (the median catchment size 131 of region 2 is about 400 km<sup>2</sup>), as they are usually not monitored or the flood series are too short for trend analyses. In small catchments, local short-duration convective storms with high intensities are 132 133 more relevant for flood generation than long-duration synoptic storms, which produce floods in medium and large catchments contained in the data<sup>21</sup>. Local convective storms are expected to 134 increase in a warmer climate<sup>22</sup>, which means that floods in small catchments may have actually 135 increased. Additionally, soil compaction, abandoned terraces and land-cover changes may increase 136 flood discharges in small catchments<sup>23</sup>. The difference in catchment size may explain the apparent 137 inconsistency between the occurrence of numerous floods in small catchments in recent years in 138 139 southern Europe<sup>21</sup> and the decreasing trend in Fig. 1.

140

In all but southern Europe, increases in extreme precipitation (Fig. 2a–c,f,g; Extended Data Fig. 5b) are related to increased atmospheric blocking associated with decreasing pressure differences between Greenland and the Baltic, which has decreased the speed of zonal (west-east) flow and increased the chance of standing planetary waves<sup>24</sup>. However, it is only in northwestern Europe (Fig. 1, region 1), where the increase in extreme precipitation is reflected in increased flood discharges, as winter storms in that region cause winter floods<sup>8</sup>. Further in the east, snowmelt is more relevant for flood generation.

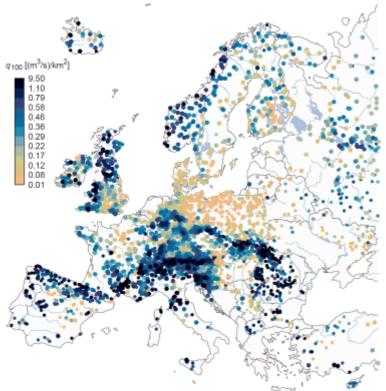
- 149 In eastern Europe, spring air temperature has increased by as much as 1°C per decade (Extended Data Fig. 6b). This has resulted in much less extensive spring snow cover<sup>25</sup>, a shift of snowfall to 150 151 rainfall when air temperatures are around zero, shallower snow packs, earlier snowmelt<sup>8</sup>, likely 152 increased infiltration resulting from shallower freezing depths and therefore smaller floods, even 153 though extreme precipitation in summer has increased<sup>26</sup>. The mean flood trend in the western 154 Russian hotspot is -18.2% (Extended Data Table 2c). Given the colder background temperature 155 (Extended Data Fig. 6a) and larger snowpack in northwestern Russia, the increasing temperatures 156 are not yet changing snowmelt patterns, and hence not decreasing floods (Fig. 1).
- 157

While past studies have focused on a few catchments or were clustered around western Europe<sup>9–11,27</sup>, this study provides a continental perspective, which allows for an analysis of climate processes that manifest themselves at larger scales. Isolated local or national scale studies, however, are broadly consistent with our findings.

162

163 Our results have implications for flood risk management in medium and large sized catchments. The trends shown in Fig. 1 are estimates of changes in the mean annual flood. Since mean annual 164 floods and more extreme floods are usually closely correlated<sup>28</sup>, similar trends could also be 165 expected for the 100-year flood, which is often the key design criterion in flood risk management. 166 167 In northwest Europe (Fig. 1, region 1), flood discharges per unit catchment area (specific flood 168 discharges) are generally high (Fig. 3). For example, on the west coast of the British-Irish Isles and 169 Norway, the specific 100-year flood discharge during the period 1960-2010 was  $\sim 0.9 \text{ (m}^3/\text{s})/\text{km}^2$ (Fig. 3), with floods increasing by ~5% per decade. However, in eastern Europe (Fig 1, region 3), 170 171 specific flood discharges are rather small (Fig. 3), and are likely to become smaller in a changing 172 climate. For example, in the Baltic countries, southern Poland and the Ukraine, the 100-year flood 173 of ~0.1 (m<sup>3</sup>/s)/km<sup>2</sup> would decrease to ~0.075 (m<sup>3</sup>/s)/km<sup>2</sup> if the observed decrease of ~5% per decade 174 persists over the next 50 years. In southern Europe, even if flood discharges decrease in medium 175 and large catchments, discharges are still generally high (Fig. 3), as a result of the proximity to the

- 176 Mediterranean Sea and associated heavy precipitation events<sup>29</sup>. Floods in small catchments may
- actually increase as a result of enhanced convective storms<sup>30</sup> and land-use change<sup>23</sup>.
- 178
- 179



180

Fig. 3 | Specific 100-year floods ((m<sup>3</sup>/s)/km<sup>2</sup>) in Europe, where larger points indicate 90% confidence intervals smaller than 60% of the estimate.

184 Increasing flood discharges imply that, the 100-year flood discharge five decades ago, now has a 185 smaller return period than 100 years, i.e. that discharge is likely to be exceeded on average more often than once in 100 years. In northwestern Europe, what was the 100-year flood discharge in 186 187 1960 has now typically become a 50- to 80-year flood discharge (Extended Data Fig. 8), which will make flood defense structures less safe. In eastern Europe, the 100-year flood discharge has now 188 189 become a 125- to 250-year flood discharge, which will make structures less economical. While 190 Extended Data Fig. 8, and Fig. 3, do provide a continental overview, they do not replace 191 national-scale and local studies where more detailed information may be available.

193 It should be noted that the flood trends observed here do not necessarily extrapolate into the future as they may be related to climate variability rather than persistent changes in time<sup>11</sup>. Also, the trends 194 195 depend on the observation period<sup>3</sup>, so may differ if the observation period is extended. However, 196 the regions with a distinct climatic change signal in observed flood discharges identified here are 197 broadly coherent with the projected flood changes in Europe. Most projections for the end of the 198 21<sup>st</sup> century suggest increasing floods in (north)western Europe due to increasing precipitation, and 199 decreasing floods in eastern and northern Europe due to increasing temperatures<sup>4,5</sup>. This means that 200 changes in flood discharge magnitudes are already underway, which adds credence to those 201 projections and supports the need to account for climate induced changes in flood risk management.

202 203

#### 204 **References:**

IPCC. Managing the Risks of Extreme Events and Disasters to Advance Climate Change
 Adaptation. A Special Report of Working Groups I and II of the Intergovernmental Panel on

- 207 *Climate Change.* (Cambridge University Press, Cambridge, UK and New York, NY, USA,
  208 2012).
- 209 2. EASAC. European Academies' Science Advisory Council Statement; Extreme weather events
   in Europe Preparing for climate change adaptation: an update on EASAC's 2013 study. at
   <a href="https://easac.eu/publications/details/extreme-weather-events-in-europe/">https://easac.eu/publications/details/extreme-weather-events-in-europe/</a>>
- 3. Hall, J. *et al.* Understanding flood regime changes in Europe: a state of the art assessment. *Hydrol. Earth Syst. Sc.* 18, 2735–2772 (2014).
- 4. Kundzewicz, Z. *et al.* Differences in flood hazard projections in Europe-their causes and consequences for decision making. *Hydrol. Sci. J.* 62, 1–14 (2017).
- 5. Thober, S. *et al.* Multi-model ensemble projections of European river floods and high flows at
  1.5, 2, and 3 degrees global warming. *Environ. Res. Lett.* 13, 014003 (2018).
- 218 6. UNISDR. Making Development Sustainable: The Future of Disaster Risk Management. Global
  219 Assessment Report on Disaster Risk Reduction. (Geneva, Switzerland: United Nations
  220 International Strategy for Disaster Reduction (UNISDR), 2015).
- 7. Winsemius, H. C. *et al.* Global drivers of future river flood risk. *Nat. Clim. Chang.* 6, 381–385 (2016).
- 8. Blöschl, G. *et al.* Changing climate shifts timing of European floods. *Science* 357, 588–590 (2017).
- 9. Mangini, W. *et al.* Detection of trends in magnitude and frequency of flood peaks across
  Europe. *Hydrol. Sci. J.* 63, 493–512 (2018).
- 10. Berghuijs, W., Aalbers, E., Larsen, J., Trancoso, R. & Woods, R. Recent changes in extreme
  floods across multiple continents. *Environ. Res. Lett.* 12, (2017).
- 11. Hodgkins, G. A. *et al.* Climate-driven variability in the occurrence of major floods across North
  America and Europe. *J. Hydrol.* 552, 704–717 (2017).
- 12. Hall, J. *et al.* A European Flood Database: facilitating comprehensive flood research beyond administrative boundaries. *Proc. Int. Assoc. Hydrol. Sci.* 370, 89–95 (2015).
- 13. Sivapalan, M., Blöschl, G., Merz, R. & Gutknecht, D. Linking flood frequency to long-term
  water balance: Incorporating effects of seasonality. *Water Resour. Res.* 41, W06012 (2005).
- 14. Bayliss, A. C. & Jones, R. C. Peaks-over-threshold flood database: Summary statistics and seasonality. IH Report No. 121. (Institute of Hydrology, Wallingford, UK, 1993).
- 15. Schröter, K., Kunz, M., Elmer, F., Mühr, B. & Merz, B. What made the June 2013 flood in
  Germany an exceptional event? A hydro-meteorological evaluation. *Hydrol. Earth Syst. Sc.* 19, 309–327 (2015).
- 16. Mediero, L., Santillán, D., Garrote, L. & Granados, A. Detection and attribution of trends in magnitude, frequency and timing of floods in Spain. J. Hydrol. 517, 1072–1088 (2014).
- 17. Hall, J. & Blöschl, G. Spatial patterns and characteristics of flood seasonality in Europe. *Hydrol. Earth Syst. Sc.* 22, 3883–3901 (2018).
- 18. IPCC. 2013: Climate Change 2013: The Physical Science Basis. Contribution of Working
  Group I to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change.
  (Cambridge University Press, Cambridge, UK and New York, USA, 2013).
- 247 19. Archer, C. L. & Caldeira, K. Historical trends in the jet streams. *Geophys. Res. Lett.* 35, (2008).
- 248 20. Kang, S. M. & Lu, J. Expansion of the Hadley cell under global warming: Winter versus summer. J. Clim. 25, 8387–8393 (2012).
- 250 21. Amponsah, W. *et al.* Integrated high-resolution dataset of high-intensity European and
  251 Mediterranean flash floods. *Earth Syst. Sci. Data* 10, 1783–1794 (2018).
- 252 22. Ban, N., Schmidli, J. & Schär, C. Heavy precipitation in a changing climate: Does short-term
  253 summer precipitation increase faster? *Geophys. Res. Lett.* 42, 1165–1172 (2015).
- 254 23. Rogger, M. *et al.* Land-use change impacts on floods at the catchment scale Challenges and opportunities for future research. *Water Resour. Res.* 53, 5209–5219 (2017).
- 256 24. Perdigão, R. A. P., Pires, C. A. L. & Hall, J. Synergistic Dynamic Theory of Complex
   257 Coevolutionary Systems: Disentangling Nonlinear Spatiotemporal Controls on Precipitation.
   258 arXiv:1611.03403 [math.DS] (2016).

- 259 25. Estilow, T. W., Young, A. H. & Robinson, D. A. A long-term Northern Hemisphere snow cover
  260 extent data record for climate studies and monitoring. *Earth Syst. Sci. Data* 7, 137–142 (2015).
- 261 26. Frolova, N. L. *et al.* Hydrological hazards in Russia: origin, classification, changes and risk
  262 assessment. *Nat. Hazards* 88, 103–131 (2017).
- 263 27. Mediero, L. *et al.* Identification of coherent flood regions across Europe by using the longest
  264 streamflow records. *J. Hydrol.* 528, 341–360 (2015).
- 265 28. Salinas, J. L., Castellarin, A., Kohnova, S. & Kjeldsen, T. Regional parent flood frequency
  266 distributions in Europe-Part 2: Climate and scale controls. *Hydrol. Earth Syst. Sc.* 18, 4391–
  267 4401 (2014).
- 268 29. Xoplaki, E., Gonzalez-Rouco, J. F., Luterbacher, J. & Wanner, H. Wet season Mediterranean
  precipitation variability: influence of large-scale dynamics and trends. *Clim. Dynam.* 23, 63–78
  (2004).
- 271 30. Brooks, H. E. Severe thunderstorms and climate change. *Atmos. Res.* **123**, 129–138 (2013).
- 272

#### 273 Methods

#### 274 Data sets

275 The hydrological data used in this study were obtained from a newly created European Flood 276 Database<sup>12</sup>, with subsequent updates, containing data from 3738 hydrometric gauging stations from 277 68 European data sources for the period 1960 to 2010 (Extended Data Table 1). Choice of the study 278 period was guided by a tradeoff between data availability in terms of record length and spatial coverage. The database consists of the highest discharge (daily mean or instantaneous discharge) in 279 280 each calendar year for each station. For consistency, we chose to analyze the annual maximum 281 flood rather than multiple floods within a year in all stations, as in many areas only annual maxima 282 were available. The stations are located within the domain bounded by 22.25 W - 60.25 E and 283 34.25 N – 71.25 N (Extended Data Fig. 1), and catchment areas range between 5 and 100,000 km<sup>2</sup>.

284

285 The data set was screened for data errors, and catchments that were known, or were identified, to 286 have experienced strong human modifications such as reservoirs that could affect changes in flood 287 discharges were excluded. The screening involved data pre-selection by co-authors and additional 288 visual examination of the flood records in question, analysis of flood seasonality (jumps in timing 289 and large differences to surrounding stations), and examination of the catchment area in google 290 maps. While local human effects on the floods of individual stations cannot be excluded, the focus 291 of this study was on regionally consistent patterns of change where such effects will not be relevant. 292 In a few catchments, the available flood data had been corrected for the effects of reservoirs to 293 represent near natural flood discharge. In a few cases, local reservoirs may influence the data, but 294 this does not affect the regional pattern. The station density is rather uneven (Extended Data Fig. 295 1b). In southern Europe it is lower as some stations were removed because of reservoir effects. In 296 Italy, reduced record lengths are related to organizational changes of the hydrographic services<sup>12</sup>. In 297 eastern Europe the density of available stations is generally lower than in other countries and, again, 298 some stations were removed because of reservoir effects. 299

300 For estimating the flood discharge trends (Fig. 1 and 2, Extended Data Fig. 2 and 8), only stations 301 that satisfied the following three criteria were considered: at least 40 years of data were available 302 during 1960–2010, the record started in 1968 or earlier, and ended in 2002 or later. In the countries 303 with the highest station densities (Austria, Germany, Switzerland), only stations with at least 49 304 years of data were included in order to obtain a more even spatial distribution across Europe. In 305 Cyprus, Italy and Turkey, stations with at least 30 years of data were included, and in Spain 40 306 years of data without restrictions to the start and end of the record. This selection resulted in a set of 307 2370 stations with a median catchment size of 381 km<sup>2</sup>. Sensitivity analyses indicated that the 308 large-scale spatial pattern of increasing and decreasing flood trends across Europe is not influenced 309 by the choice of record length although the trend of individual stations tends to be sensitive to 310 record length, when increasing the required record length by 5 years, the percentage of significantly 311 positive and negative trends (Extended Data Table 2a) changes only slightly from respectively 11.52% and 16.50% to 11.04% and 16.95%. In this study we evaluated linear trends of the flood 312 313 discharges. Alternative models of change (e.g. step changes) could also be tested but are beyond the 314 scope of this study.

315

For each hydrometric gauging station, the contributing catchment boundary was derived from the CCM River and Catchment Database<sup>31</sup>. Daily gridded precipitation sum and mean air temperature data from the E-OBS data set (Version 17.0)<sup>32</sup> for the period 1960–2010 were used. The data consist of interpolated ground-based observations with a spatial resolution of 0.25°. Monthly gridded soil moisture data from the CPC Soil Moisture data set<sup>33</sup> for the period 1960–2010 were analyzed. The data are model-calculated monthly averaged soil moisture water-height equivalents with a spatial resolution of 0.5°.

#### 325 Analysis method

350

357

As a first step, we estimated the discharge trend by the Theil-Sen slope estimator<sup>34,35</sup>. The trend estimator  $\beta$  is the median slope calculated using the differences of discharge Q over all possible pairs of years (*i* and *j*, *i* < *j*) within the time series,

329 
$$\beta = \operatorname{median}\left(\frac{Q_j - Q_i}{j - i}\right)$$
 (1)

330 where  $\beta$  has units of m<sup>3</sup>/s per year, which was plotted as percentage of the mean flood discharge per 331 decade in Extended Data Fig. 2. The trends were tested for significance by the Mann-Kendall test<sup>36</sup> 332 (Extended Data Table 2a). Some false positives, i.e. detected trends where no trend is present, would be expected because of the large number of stations. The Mann-Kendall test requires the 333 334 flood discharges to be temporally independent. We therefore tested whether lag 1 autocorrelation exists in the residuals from the trends. 92% of the stations did not exhibit significant lag 1 335 336 autocorrelation at the 5% level, suggesting that the Mann-Kendall test is applicable. To identify regional spatial patterns within Europe,  $\beta$  was spatially interpolated using the *autoKrige* function 337 (automatic kriging) of the R automap package<sup>37</sup>. The derived trend patterns are plotted in Fig. 1 and 338 in the background of Extended Data Fig. 2a. The uncertainty of the estimated trends at the stations 339 was estimated by bootstrapping<sup>40</sup> and is shown as points in Extended Data Fig. 2b. The uncertainty 340 of the regional trends was estimated as the block kriging standard deviation (kriging error) using the 341 342 autoKrige function and is shown in the background of Extended Data Fig. 2b. The variogram 343 estimated by the function is

344 
$$\gamma(\mathbf{h}) = c_0 + c_1 \left( 1 - \frac{1}{2^{\nu-1} \Gamma(\nu)} \left( \frac{\mathbf{h}}{r} \right)^{\nu} K_{\nu} \left( \frac{\mathbf{h}}{r} \right) \right)$$

where *h* is lag,  $c_0 = 10.061$  (%/decade)<sup>2</sup>,  $c_1 = 57.708$  (%/decade)<sup>2</sup>, r=2394.4 km, v=0.2 and  $K_v$ is the modified Bessel function of the second kind. We used block kriging rather than ordinary kriging as we are interested in the uncertainty of the regional estimate rather than that of the local estimate. The uncertainty is evaluated at a 200 x 200 km block size which is the scale at which we suggest Fig. 1 and Extended Data Fig. 2a to be read.

In order to evaluate the robustness of the spatial trend patterns we repeated the interpolation, however, only using stations with significant trends (Extended Data Fig. 3a). The overall pattern is similar to that of the interpolation using all stations (Extended Data Fig. 2a). Additionally, we repeated the interpolation but only using randomly selected stations with distances from each other larger than 50 km to examine the effect of spatial correlations on the trends (Extended Data Fig. 3b). Again, the patterns are similar.

As a second step, we selected rectangular areas or hotspots of change based on similarity of discharge trends and average flood timing as a proxy for flood processes (Extended Data Fig. 2, Extended Data Table 2c). We standardized the flood series of individual stations to zero mean and unit variance to make flood changes within hotspots comparable,

362 
$$Q_{i,k}^{0} = \frac{Q_{i,k} - \mu_{Q_k}}{\sigma_{Q_k}}$$
(3)

363 where  $\mu_{Q_k}$  and  $\sigma_{Q_k}$  are the mean and the standard deviation of station k, respectively. To compare 364 results between the hotspots we denormalised the flood series of each hotspot h by the mean 365 specific flood discharge  $\mu_h$  ((m<sup>3</sup>/s)/km<sup>2</sup>) over all years, and the square root  $\sigma_h$  of the mean 366 temporal variance,

$$367 \qquad Q_{i,k}^* = \sigma_h Q_{i,k}^0 + \mu_h \tag{4}$$

and estimated the long-term evolution in flood discharge with a centered 10-year moving averaging
 window. We plotted the median of these series within each hotspot (solid lines) and 25<sup>th</sup> and 75<sup>th</sup>
 percentiles of all stations in that hotspot (shaded bands) in Fig. 2. Additionally, the original local
 flood discharges were tested for significance of a general trend in each hotspot by the Regional

(2)

Mann-Kendall test<sup>38</sup> (Extended Data Table 2c). Names of hotspots are only indicative and do not
 correspond to any exactly defined geographic area.

374 375 To investigate rain-induced effects on flood changes, we identified for each grid point of the E-OBS 376 dataset the 7-day period with maximum precipitation in each calendar year (with at least 30 years of 377 annual data available). Increases of spring temperatures around or below the freezing point are 378 considered a proxy for snow accumulation, melt and the transition from snowfall to rainfall. To 379 understand the effect of these snowmelt processes on flood discharge, we calculated mean air 380 temperature from January to April. When soil moisture is high, even small rainstorms may produce 381 floods. To understand the effect of high soil moisture on floods, we identified for each grid point of 382 the CPC Soil Moisture dataset the highest monthly soil moisture in each calendar year. We repeated 383 the trend analyses for annual maximum precipitation, spring temperature, and annual maximum 384 monthly soil moisture (Extended Data Fig. 5–7) on a 0.5° grid.

385

386 In the hotspot analyses, the time series for these three climate variables were extracted based on 387 their location within the catchment boundaries (or within a buffer distance for small areas), from 388 which Spearman's rank correlation coefficients (r) with the spatial medians of the original flood 389 discharge series were calculated (Table 1). Confidence bounds at the 90% confidence level of r390 were estimated by stochastic block bootstrapping (boot package of R, random block size 391 geometrically distributed with mean of 5 years) and are given in Extended Data Table 2b. The long-392 term evolution of the three climate variables were calculated and plotted in a similar fashion as 393 those of the floods in Fig. 2.

394

411

We also analysed changes in the timing of the climate indices and floods as proxies for changing flood processes using previously established methods<sup>8</sup> (Extended Data Fig. 4). The timing is used to interpret the process drivers of flood discharge changes. For Extended Data Fig. 4a, b, d the snow melt index is not shown, as it is of little relevance for flooding<sup>8</sup>.

400 To evaluate the relevance of the observed flood changes for flood management, the 100-year flood 401  $(Q_{100})$  was estimated for each station using a Generalised extreme value (GEV) distribution

402 
$$Q_T = \xi + \frac{\eta}{\kappa} \cdot \left[ 1 - \left( -\ln\left(1 - \frac{1}{T}\right) \right)^{\kappa} \right]$$

where  $Q_T$  is the T-year flood discharge. The parameters  $\xi$ ,  $\eta$  and  $\kappa$  were estimated from the flood 403 discharge series by Bayesian inference through an MCMC algorithm<sup>39</sup>. Non-informative uniform 404 prior distributions were used for  $\xi$  and  $\log(\eta)$ , while a normal distribution consistent with the 405 geophysical prior<sup>41</sup> were used for  $\kappa$ . 4000 parameter samples were drawn from the posterior 406 distributions from which 4000 100-year floods were calculated for each station by Eq. (5). The 407 408 median and the relative width of the 90% credible intervals are shown in Fig. 3. For comparability 409 of the 100-year flood in catchments of different sizes, flood discharges per unit catchment area 410 (specific flood discharges;  $q_{100}=O_{100}/A$ , where A is catchment area) are shown.

- 412 If flood discharges change over time, the return period T may also change, e.g., the 100-year flood 413 may become the 10-year flood if the flood discharges increase. Change in return period was 414 therefore estimated by allowing the parameter  $\varepsilon$  in Eq. (5) to change with time t as
- 415  $\xi = a + b \cdot t$

(6)

(5)

416 where the posterior distributions of *a*, *b*,  $\eta$  and  $\kappa$  were estimated from the flood discharge series by 417 Bayesian inference through the same MCMC algorithm<sup>39</sup>, using non-informative uniform prior 418 distributions for *a* and *b*. More complex models than (6) were excluded because, for most of the 419 stations, they did not outperform (6) based on the WAIC information criterion<sup>42</sup>. 4000 parameter 420 samples were drawn from the posterior distributions from which 4000 100-year floods in 1960 were 421 calculated for each station by Eqs. (5) and (6) with *t* = 1960. The changed return period in 2010 of

- these 4000 flood peaks were computed by inverting Eq. (5) and by Eq. (6) with t = 2010. Finally, the median of the 4000 return periods was used as the 2010 return period of the 100-year flood discharge in 1960. Those stations where the 5<sup>th</sup> and the 95<sup>th</sup> percentiles of the uncertainty distribution agreed in the sign of change, were plotted as large points in Extended Data Fig. 8 while those where this was not the case were plotted as smaller points to indicate the uncertainty involved in the estimation.
- 428

To identify large-scale spatial patterns, the logarithms of the 2010 return periods of the 100-year flood discharge in 1960 were spatially interpolated using the *autoKrige* function<sup>37</sup> (Extended Data Fig. 8). For estimating the stationary 100-year specific flood discharge  $q_{100}$  (Eq. (5), Fig. 3), less stringent selection criteria (at least 30 years of data) than in all the other analyses were used as it can be estimated more robustly than trends and changes in the return period, which resulted in 3738 stations (Extended Data Fig. 1a).

435

In this paper we have analyzed flood discharge trends. The flood data set is freely available and canbe used for a wide range of analyses.

438

445

# 439440 Data Availability

The flood discharge data from the data holders/sources listed in Extended Data Table 1 that were used in this paper can be downloaded from Zenodo. The precipitation and temperature data from the E-OBS dataset can be downloaded from www.ecad.eu/download/ensembles/ensembles.php. The CPC soil moisture data can be downloaded from www.esrl.noaa.gov/psd.

### 446 Code Availability

The code for the trend and extreme value analyses can be downloaded from GitHub.

## 449 **References Methods**

- 450 31. Vogt, J. et al. A pan-European River and Catchment Database. European Commission, Joint
  451 Research Centre (2007).
- 452 32. Haylock, M. *et al.* A European daily high-resolution gridded data set of surface temperature and
  453 precipitation for 1950-2006. *J. Geophys. Res.* 113, (2008).
- 454 33. Van den Dool, H., Huang, J. & Fan, Y. Performance and analysis of the constructed analogue
  455 method applied to US soil moisture over 1981-2001. J. Geophys. Res. 108, (2003).
- 456 34. Sen, P. K. Estimates of the Regression Coefficient Based on Kendall's Tau. J. Am. Stat. Assoc.
  457 63, 1379–1389 (1968).
- 458 35. Theil, H. A Rank-invariant Method of Linear and Polynomial Regression Analysis, Part 1.
  459 Proc. R. Neth. Acad. Sci. 53, 386–392 (1950).
- 36. Mann, H. B. Nonparametric tests against trend. *Econometrica: Journal of the Econometric Society*, 245-259 (1945).
- 462 37. Hiemstra, P. H., Pebesma, E. J., Twenhöfel, C. J. & Heuvelink, G. B. Real-time automatic
  463 interpolation of ambient gamma dose rates from the Dutch radioactivity monitoring network.
  464 *Comput. Geosci.* 35, 1711–1721 (2009).
- 465 38. Helsel, D. R. & Frans, L. M. Regional Kendall Test for Trend. *Environ. Sci. Technol.* 40, 4066–
  466 4073 (2006).
- 39. Renard, B., Lang, M. & Bois, P. Statistical analysis of extreme events in a non-stationary context via a Bayesian framework: case study with peak-over-threshold data. *Stoch. Env. Res. Risk A.* 21, 97–112 (2006).
- 470 40. Wilcox, R. A note on the Theil Sen regression estimator when the regressor is random and the
  471 error term is heteroscedastic. Biometrical Journal: Journal of Mathematical Methods in
  472 Biosciences, 40(3), 261-268 (1998).
- 473 41. Martins, E. S., & Stedinger, J. R. Generalized maximum-likelihood generalized extreme-value
  474 quantile estimators for hydrologic data. Water Resources Research, 36(3), 737-744. (2000).
  - 13

- 475 42. Watanabe, S. (2010). Asymptotic equivalence of Bayes cross validation and widely applicable 476 information criterion in singular learning theory. Journal of Machine Learning Research, 11, 477 3571-3594.
- 478

#### 480 **ACKNOWLEDGEMENTS**

481 Supported by the ERC Advanced Grant "FloodChange" project (no. 291152), the Horizon 2020 ETN "System Risk" project (no 676027), the DFG "SPATE" project (FOR 2416), the FWF 482 483 "SPATE" project (I 3174), and a Russian Foundation for Basic Research (RFBR) project (no. 17-484 05-41030 rgo a). The data analysis was performed in R using the supporting packages *automap*. 485 boot, lattice, maptools, ncdf4, plyr, raster, RColorBrewer, rgdal and rworldmap. The authors also 486 acknowledge the involvement in the data screening process of C. Álvaro Díaz, I. Borzì, E. 487 Diamantini, K. Jeneiová, M. Kupfersberger, S. Mallucci and S. Persiano during their stays at the Vienna University of Technology. We thank L. Gaál and D. Rosbjerg for contacting Finnish and 488 489 Danish data holders, respectively; B. Renard (France), W. Rigott (South Tyrol, Italy), G. Lindström 490 (Sweden) and P. Burlando (Switzerland) for assistance in preparing and/or providing data or 491 metadata from their respective regions. We acknowledge all flood data providers listed in Extended 492 Data Table 1.

493

#### 494 **Author contributions**

495 G.B. and J.H. designed the study and wrote the first draft of the paper. G.B. initiated the study.

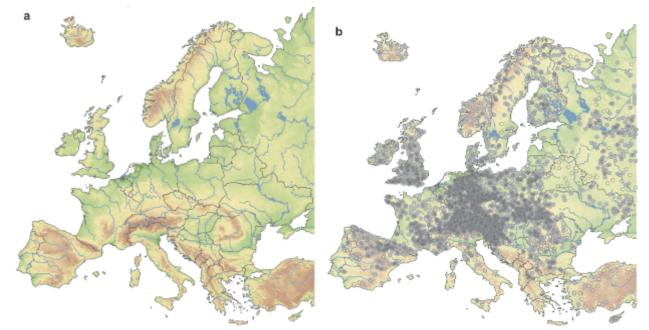
- 496 J.H. collated the database with the help of most of the co-authors, and conducted the analyses.
- 497 A.V. conducted the MCMC analysis. G.B., J.H., A.V., R.P., J.P. and B.M. interpreted the results in
- 498 the context of underlying geophysical mechanisms. J.P. compiled the catchment boundaries.
- 499 D.L. contributed to the statistical analysis. M.B., I.Č., A.K., S.K., O.L., M.M.-G., R.M., P.M., I.R.,
- 500 J.L.S., J.S. and N.Ž. interpreted the results in central Europe. G.T.A., A.B., O.B., M.B., A.C.,
- 501 G.B.C., P.C., D.G., A.M., L.M., M.Š., E.V. and K.Z. interpreted the results in southern Europe.
- 502 B.A., J.J.K. and D.W. interpreted the results in northern Europe. J.H., S.H., T.R.K., N.M., C.M. and
- 503 E.S. interpreted the results in western Europe. N.F., L.G., A.G., M.K., M.O. and V.O. interpreted
- 504 the results in eastern Europe. All authors contributed to framing and revising the paper. 505
- 506 **Competing interests** The authors declare no competing interests.
- 507 508 **Correspondence** should be addressed to G.B. (bloeschl@hydro.tuwien.ac.at)

- 509 **Extended Data display items**
- 510

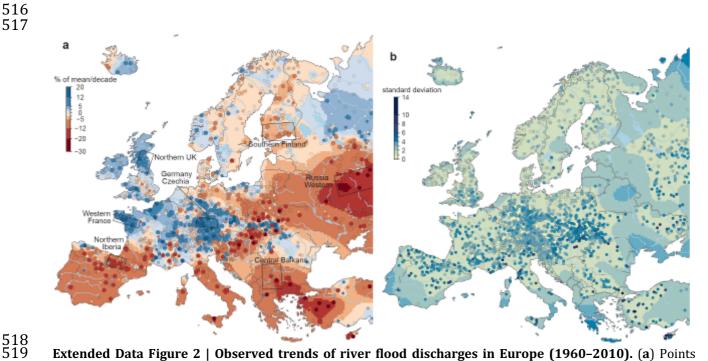
513

514

515



Extended Data Figure 1 | Map of European study area. (a) Elevation, main rivers and lakes and (b) location of the hydrometric stations analyzed. Open and full circles indicate stations with  $\geq$ 30 years (*n* = 3738) and  $\geq$ 40 years (n = 2835) of flood discharge data, respectively.



show local trends (n = 2370), where larger points indicate statistically significant trends ( $\alpha = 0.1$ ). Background

pattern represents regional trend. Blue indicates increasing flood discharges, red decreasing flood discharges. Rectangles indicate hotspot areas as in Fig. 2, Extended Data Fig. 3 and Extended Data Table 2c. (b) Uncertainties of the trends in terms of standard deviation. Points show local uncertainties. Background pattern represents

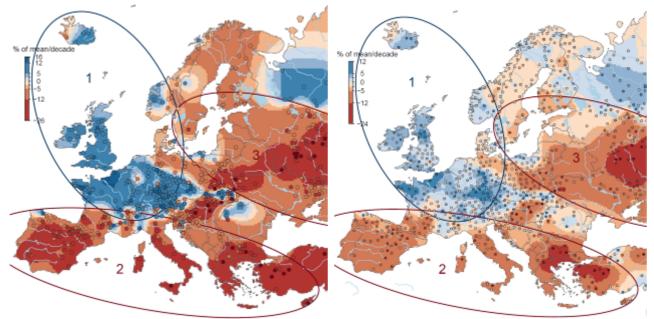
regional uncertainties at the scale of a block size of 200 x 200 km. Units of both panels are % of mean/decade.

518 519

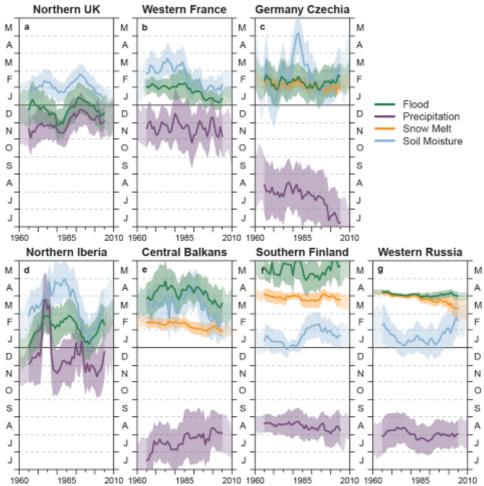
520

521 522 523

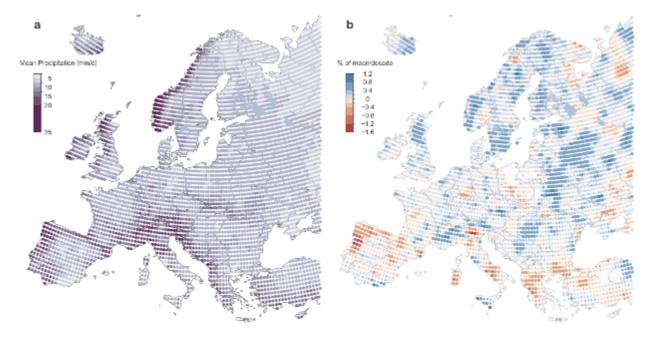
524



Extended Data Figure 3 | Flood trends as in Fig. 1 and Extended Data Figure 2, but using fewer stations.
(a) Only stations with significant trends are used (n = 664). (b) Only stations with distances from each other larger than 50 km are used (n = 745).

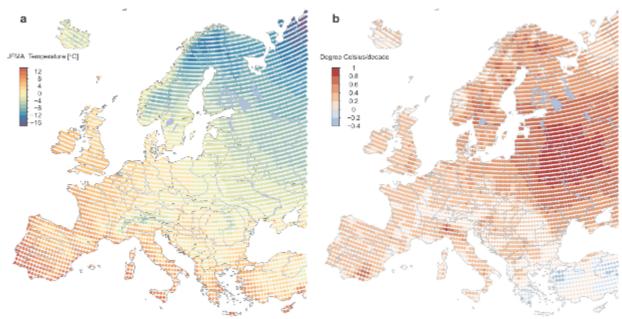


534 535 Extended Data Figure 4 | Long-term temporal evolution of timing of floods and their drivers for seven 536 hotspots in Europe. (a) Northern UK, (b) Western France, (c) Southern Germany and Western Czechia, (d) 537 Northern Iberia, (e) Central Balkans, (f) Southern Finland, (g) Western Russia. Timing of observed floods (green), 538 539 7-day maximum precipitation (purple), snowmelt index (orange), and maximum monthly soil moisture (blue). Lines show median timing and shaded bands indicate variability of timing within the year (±0.5 circular standard 540 deviations). All data were subjected to a circular 10-year moving average filter. Vertical axes show month of the 541 year (June to May).



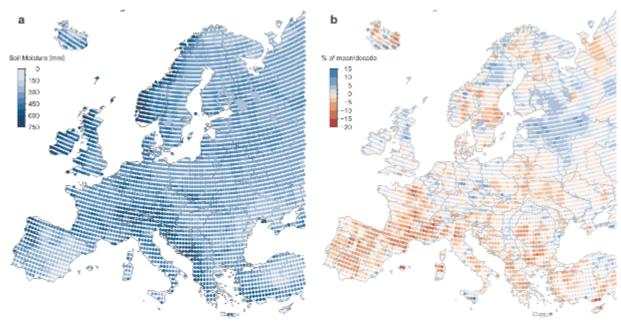
543 544 545 546 547 548 549 **Extended Data Figure 5 | 7-day maximum precipitation (1960–2010).** (a) Long-term mean (mm/d); (b) trends in precipitation (% of mean per decade), where larger points indicate statistically significant trends ( $\alpha$  = 0.1); blue indicates increasing precipitation, red decreasing precipitation.



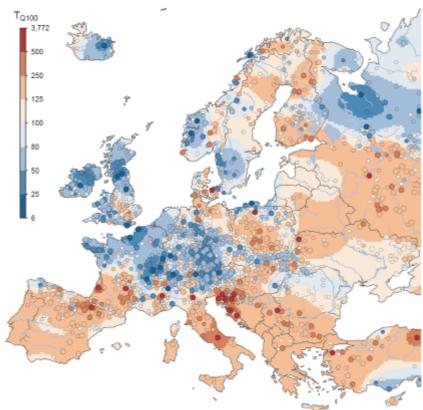


**Extended Data Figure 6 | Spring (January to April) mean air temperatures (1960–2010).** (a) Long-term mean (C); (b) trends in temperatures (C per decade), where larger points indicate statistically significant trends ( $\alpha = 0.1$ ); red indicates increasing temperature, blue decreasing temperature.





560 561 562 563 **Extended Data Figure 7 | Annual maximum monthly soil moisture (1960–2010).** (a) long-term mean (mm); (b) trends in maximum soil moisture (% of mean per decade), where larger points indicate statistically significant trends ( $\alpha = 0.1$ ); blue indicates increasing soil moisture, red decreasing soil moisture.



**Extended Data Figure 8** | **Estimated return period in 2010 of the discharge that was the 100-year flood in 1960.** Points show local return periods (n = 2370), where larger points indicate agreement of the 5<sup>th</sup> and the 95<sup>th</sup> percentiles of the uncertainty distribution in the sign of change. Background pattern represents regional return periods. Blue indicates lower return periods representing increasing flood discharges, red indicates higher return periods representing decreasing flood discharges. This figure provides a continental overview, and does not replace national-scale and local studies where more detailed information may be available.

#### 5 Extended Data Table 1 | Data Sources contained in the European Flood Research Database.

Country/Project	Data Holder/Source/Project information
Albania	National Hydro-Meteorological Service Albania, Institute of GeoSciences, Energy, Water and Environment (IGEWE)
Austria	Hydrographic Services of Austria (HZB)
Bosnia and Herzegovina	Hydrological Yearbooks of the former Republic of Yugoslavia
Bulgaria	Hydrological Yearbooks of the Rivers in Bulgaria, National Institute of Meteorology and Hydrology
Croatia	
	Meteorological and Hydrological Service of Croatia
Czechia	Czech Hydrometeorological Institute
Denmark	Danish Centre for Environment and Energy (DCE)
Estonia	Estonian Environment Agency
EWA	European Water Archive (EWA)
Finland	Finnish Environment Institute, Open information/Hydrology/Discharge, Source: SYKE
France	HYDRO database, French Ministry of Ecology, Sustainable Development and Energy
Germany	Federal Waterways and Shipping Administration (WSV)
Germany, Baden-Wuerttemberg	Ministry for the Environment, Climate and Energy of the Federal State of Baden-Wuerttemberg (LUBW)
Germany, Bavaria	Flood Information Centre, Bavarian Environment Agency, Munich (LfU)
Germany, Brandenburg	Ministry of Rural Development, Environment and Agriculture of the Federal State of Brandenburg (MLUL)
Germany, Hessia	Hessian Agency for Nature Conservation, Environment and Geology (HLNUG)
Germany, Lower Saxony	Lower Saxony Water Management, Coastal Defence and Nature Conservation Agency (NLWKN)
Germany, Mecklenburg-Western	
Pomerania	State Office of Environment, Nature Protection and Geology of Mecklenburg-Western Pomerania (LUNG)
Germany, North Rhine-	
Westphalia	State Agency for Nature, Environment and Consumer Protection (LANUV)
Germany, Rhineland-Palatinate	State Office for the Environment, Water Management and Commerce Inspectorate Rhineland-Palatinate (LUWG)
Germany, Saarland	The Saarland State Office for Environmental and Labour Protection (LUA)
Germany, Saxony	Saxon State Agency for Environment, Agriculture and Geology (LfULG)
Germany, Saxony-Anhalt	State Agency for Flood Defence and Water Management of Saxony-Anhalt (LHW)
Germany, Schleswig-Holstein	Schleswig-Holstein Agency for Coastal Defence, National Park and Marine Conservation (LKN.SH)
Germany, Thuringia	Thuringian Regional Office for the Environment and Geology (TLUG)
GRDC	The Global Runoff Data Centre, Koblenz, Germany
Greece	National Data Bank of Hydrological & Meteorological Information (NDBHMI)
Hungary	General Directorate of Water Management, Hungary
HYDRATE	EU-FP7 HYDRATE Project data base: Hydrometeorological Data Resources and Technology for Effective Flash Flood Forecasting
Iceland	Icelandic Meteorological Office, Hydrological Database, No. 2013-10-27/01
Ireland	Irish Environmental Protection Agency (EPA)
Ireland	Office of Public Works (OPW)
Italy	CUBIST database, former SIMN (Servizio Idrografico e Mareografico Nazionale)
Italy	National Research Council - Consiglio Nazionale delle Ricerche (CNR)
Italy	ENEL (Ente Nazionale per l'Energia ELettrica)
Italy	AdBPo (Autorità di Bacino del Fiume Po)
	IRPI (Istituto di Ricerca per la Protezione Idrogeologica)
Italy	
Italy	ISPRA (Istituto Superiore per la Protezione e la Ricerca Ambientale)
Italy, Emilia-Romagna Region	ARPA (Agenzia Regionale per la Protezione dell' Ambiente) Emilia–Romagna
Italy, Piedmont Region	ARPA Piemonte
Italy, Lazio Region	Uffico Idrografico e Mareografico di Roma - Regione Lazio
Italy, Sicily Region	Osservatorio delle Acque della Regione Siciliana
Italy, South Tyrol Region	Hydrographic Office, Autonomous Province of Bolzano
Italy, Trentino Region	Dipartimento Protezione Civile, Provincia Autonoma di Trento
Italy, Umbria Region	Ufficio Idrografico - Regione Umbria
Italy, Veneto Region	ARPA Veneto
Latvia	Latvian Environment, Geology and Meteorology Centre, State Ltd.
Lithuania	Lithuanian Hydrometeorological Service
Macedonia	Macedonian Hydrometeorological Service
Netherlands	Rijkswaterstaat - Dutch Ministry of Infrastructure and the Environment
Norway	Norwegian Water Resources and Energy Directorate - Norges vassdrags- og energidirektorat (NVE)
Poland	Institute of Meteorology and Water Management National Research Institute (IMGW-PIB)
Portugal	Portuguese Environmental Agency - Agência Portuguesa do Ambiente, National Information System for Water Resources of Portugal (SNIRH)
Romania	National Institute of Hydrology and Water Management - NIHWM The main hydrological characteristics, 1963-1970, 1971-75, 1975-1980, 1980-2000
Russia	Ministry of Natural Resources and Ecology of the Russian Federation, State Hydrological Institute
Russia	State Water Cadastre, 1985-2010, State Hydrological Institute, Lomonosov Moscow State University
Russia	Automated information system of state water bodies monitoring (AIS GMVO), Federal Agency for Water Resources
Serbia	Republic Hydrometeorological Service of Serbia (RHSS), Hydrological Yearbooks of Surface Water, Belgrade
Slovakia	Slovak Hydrometeorological Institute (SHMI)
Slovenia	Slovenian Environment Agency (ARSO)
Spain	Centre for Hydrographic Studies (Centro de Estudios Hidrográficos) of CEDEX, Spain
Sweden	Swedish Meteorological and Hydrological Institute (SMHI)
Switzerland	Federal Office for the Environment (FOEN) / (BAFU)
Turkey	General Directorate of Electrical Power Resources Survey and Development Administration (EIE), Turkey
Ukraine	
Ukraine	Hydrological Department, Ukrainian Hydrometeorological Institute (UHMI) Hydrometeorological Institute, Odessa State Environmental University (OSENU)
United Kingdom	UK National River Flow Archive (NRFA)

579 Extended Data Table 2a | Number of stations with positive and negative flood discharge trends. Regions according to Fig. 1.

	Positive Trend	Negative Trend	All
Significant α=0.1	273 (11.52%)	391 (16.50%)	664 (28.02%)
Significant	833 (35.15%)	837 (35.31%)	1706 (71.98%)*
All	1106 (46.67%)	1228 (51.81%)	2370*
Significant α=0.1 Not	182 (20.34%)	27 (3.01%)	209 (23.35%)
Significant	435 (48.60%)	240 (26.82%)	686 (76.65%)*
All	617 (68.94%)	267 (29.83%)	895*
Significant α=0.1 Not	13 (2.84%)	142 (31.00%)	155 (33.84%)
Significant	96 (20.96%)	169 (42.80%)	303 (66.16%)*
All	109 (23.80%)	338 (73.80%)	458*
Significant α=0.1 Not	5(1.77%)	115 (40.78%)	120 (42.55%)
Significant	54 (19.15%)	104 (36.88%)	162 (57.45%)*
All	59 (20.92%)	219 (77.66%)	282*
	$\begin{tabular}{ll} $$ $ $ $ $ $ $ $ $ $ $ $ $ $ $ $ $ $$	Significant a=0.1         273 (11.52%)           Not         833 (35.15%)           All         1106 (46.67%)           Significant a=0.1         182 (20.34%)           Not         3ignificant a=0.1           Significant a=0.1         435 (48.60%)           All         617 (68.94%)           Significant a=0.1         13 (2.84%)           Not         96 (20.96%)           All         109 (23.80%)           Significant a=0.1         5 (1.77%)           Not         51           Significant a=0.1         5 (1.77%)           Not         54 (19.15%)	Significant α=0.1         273 (11.52%)         391 (16.50%)           Not         333 (35.15%)         837 (35.31%)           All         1106 (46.67%)         1228 (51.81%)           Significant α=0.1         182 (20.34%)         27 (3.01%)           Not         391 (16.50%)         391 (16.50%)           Significant α=0.1         182 (20.34%)         1228 (51.81%)           Significant α=0.1         182 (20.34%)         27 (3.01%)           Not         240 (26.82%)         All           617 (68.94%)         267 (29.83%)         Significant           significant α=0.1         13 (2.84%)         142 (31.00%)           Not         96 (20.96%)         169 (42.80%)           All         109 (23.80%)         338 (73.80%)           Significant α=0.1         5 (1.77%)         115 (40.78%)           Not         Significant         54 (19.15%)         104 (36.88%)

Extended Data Table 2b | Estimates and 90% confidence bounds (in brackets) of Spearman's rank correlation coefficient (r) between hotspot medians of the annual series of flood discharge and their drivers.

	Northern UK	Western France	Germany Czechia	Northern Iberia	Central Balkans	Southern Finland	Western Russia
Precipitation	<b>0.70</b> **	0.41*	0.40*	<b>0.54</b> **	0.22	0.08	-0.13
	(0.57, 0.76)	(0.15, 0.64)	(0.24, 0.56)	(0.39, 0.68)	(-0.11, 0.49)	(-0.11, 0.28)	(-0.4, 0.18)
Soil Moisture	0.36*	<b>0.57</b> **	<b>0.56</b> **	0.37*	<b>0.68</b> **	0.20	0.30
	(-0.01, 0.66)	(0.39, 0.71)	(0.41, 0.68)	(0.12, 0.55)	(0.50, 0.76)	(0.01, 0.4)	(0.07, 0.49)
Spring temperature	0.09	0.5**	0.04	0.02	-0.29	<b>-0.34</b>	<b>-0.55</b> **
	(-0.15, 0.25)	(0.33, 0.63)	(-0.19, 0.23)	(-0.23, 0.32)	(-0.44, -0.12)	(-0.49, -0.15)	(-0.7, -0.3)

[\*stations with no trend included]

[(\*\*) p-value < 0.001, (\*) p-value < 0.01] 

Extended Data Table 2c | Flood discharge trends for selected hotspots (as % of station mean per decade). The significance level of the general hotspot trends is given according to the Regional Mann-Kendall test<sup>38</sup> with significance level  $\alpha$ .

Hotspot Name	No. of Stations	Minimum trend	Maximum trend	Mean hotspot trend	Signifi cance
Northern UK	15	2.9	12.5	6.6	α<0.01
Western France	16	5.9	17.6	9.7	α<0.01
Germany Czechia	47	1.6	17.8	8.0	α<0.01
Northern Iberia	34	-18.3	3.8	-8.3	α<0.01
Central Balkans	15	-17.6	-0.1	-8.4	α<0.01
Southern Finland	15	-10.0	-2.1	-5.2	α<0.01
Western Russia	21	-28.8	-8.3	-18.2	α<0.01