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Causes for increased flood frequency in central Europe in the 19th century

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Abstract

Historians and historical climatologists have long pointed to an increased flood frequency in Central Europe in the mid and late 19th century. However, the causes have remained unclear. Here, we investigate the changes in flood frequency in Switzerland based on long time series of discharge and lake levels, of precipitation and weather types, and based on climate model simulations, focusing on the warm season. Annual series of peak discharge or maximum lake level, in agreement with previous studies, display increased frequency of floods in the mid 19th century and decreased frequency after the Second World War. Annual series of warm-season mean precipitation and high percentiles of 3-day precipitation totals (partly) reflect these changes. A daily weather type classification since 1763 is used to construct flood probability indices for the catchments of the Rhine in Basel and the outflow of Lake Lugano, Ponte Tresa. The indices indicate an increased frequency of flood-prone weather types in the mid 19th century and a decreased frequency in the post-war period, consistent with a climate reconstruction that shows increased (decreased) cyclonic flow over Western Europe in the former (latter) period. To assess the driving factors of the detected circulation changes, we analyse weather types and precipitation in a large ensemble of climate model simulations forced with observed sea-surface temperatures. In the simulations, we do not find an increase in flood-prone weather types in the Rhine catchment in the 19th century, but a decrease in the post-war period related to the sea-surface temperature anomalies.

1. Introduction

Floods are some of the costliest natural hazards in Europe (EEA, 2018). In typical pluvio-nival river regimes in Central Europe, floods are often triggered by one or several days of heavy precipitation, but some rivers also exhibit winter floods due to longer periods of large-scale precipitation or spring floods due to heavy precipitation, amplified by snow melt. Such factors might change in the future. For instance, heavy precipitation events will become more

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intense in the future according to global climate model simulations (Fischer and Knutti, 2016). An intensification of heavy precipitation events is also found in regional model simulations for Europe north of the Mediterranean (Rajczak and Schär, 2017). With increasing temperature, snow melt occurs earlier in the year, changing river regimes. Furthermore, also precipitation extremes might shift seasonally (Brönnimann et al., 2018; Marelle et al., 2018). While changes in seasonality have been found for European floods (Blöschl et al., 2017), no general increase in flood frequency has so far been detected (Madsen et al., 2014). However, past records suggest that there is considerable decadal variation in flood frequency (e.g., Sturm et al., 2001; Wanner et al., 2004; Glaser et al., 2010). It is reasonable to assume that such variations will continue into the future. In this paper we focus on decadal variability during the past 200 years.

An increased flood frequency in the 19th century was already perceived by contemporary scientists across central Europe and affected the political debates on deforestation as a potential cause (e.g., Brückner, 1990). The changing frequencies of flood events in Central Europe over the past centuries have been analysed in detail during the past 20 years (e.g., Mudelsee et al., 2004; Glaser et al., 2010). One result is that different river basins behave differently due to different hydrological regimes and different seasonality of floods. For instance, Glaser et al. (2010) found a prominent phase of increased flood frequency in central European rivers from 1780 to 1840, but mainly in winter and spring. This may not apply to Alpine rivers, which are more prone to floods in summer and autumn. Periods of increased flood frequency have also been analysed with respect to reconstructions of atmospheric circulation (e.g., Jacobeit et al., 2003; Mudelsee et al., 2004). Jacobeit et al. (2003) find that the large-scale zonal mode, which characterizes flood events in the 20th century, does not similarly characterize flood-rich periods during the Little Ice Age (their analysis, however, does not cover the 19th century). For summer floods, Mudelsee et al. (2004) find a weak but significant relation to meridional airflow. Quinn and Wilby (2013) were able to reconstruct large-scale flood risk in Britain from a series of daily weather types back to 1871 and found decadal scale change in circulation types.

For several catchments in the Alps and central Europe, studies have suggested an increased frequency of flood events in the mid 19th century (Pfister 1984, 1999, 2009; Stucki and Luterbacher, 2010; Schmocker-Fakel and Naef, 2010a,b; Wetter et al., 2011). However, the causes of this increased flood frequency remain unclear. Besides human interventions such as deforestation or undesigned effects from water flow regulations (Pfister and Brändli, 1999; Summermatter, 2005), this includes the role of cold or warm periods and changes in

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atmospheric circulation. Proxy-based studies, though focussing on longer time scales, find that in the Alps, cold periods were mostly more flood prone than warm periods (Stewart et al., 2011; Glur et al., 2013); the last of these cold and flood prone periods in the latter study is the 19th century. Glur et al. (2013) relate periods of increased flood frequency in the past 2500 years to periods of a weak and southward shifted Azores High. Even more remote factors could have played a role. Using climate model simulations, Bichet et al. (2014) investigated the roles of aerosols and of remote Pacific forcings on precipitation, albeit focusing on the seasonal mean. Finally, Stucki et al. (2012) performed case studies of the strongest 24 flood events of the last 160 years. They characterised five flood-conducing weather patterns, although each extreme event had its individual combination of contributing factors.

In our paper, we aim to combine analyses of daily weather, reconstructions, and climate model simulations to elucidate potential causes leading to an increased flood frequency in Switzerland. While previous studies have focused on monthly or seasonal reconstructions, or on individual cases, we study the daily weather back to the 18th century in a statistical manner, thus bridging the gap between event analyses and paleo-climatological studies.

In this study we track the flood-frequency signal from historian documents to observations and simulations. Using long data series on floods (discharge and lake level), precipitation, daily weather types, and climate model simulations, we investigate whether an increased frequency of flood events was due to a change in seasonal mean or extreme precipitation and whether this can be related to change in weather conditions. We also address the underlying hydro-meteorological and climatological causes in model simulations. The paper is organised as follows. Section 2 describes the data and methods used. Section 3 describes the results. A discussion is provided in Section 4. Conclusions are drawn in Section 5.

2. Data and Methods

2.1. Discharge data

For the analysis of the flood frequency, we used annual peak discharge measurements from Basel, Switzerland, since 1808 (Wetter et al., 2011) as well as annual peak lake level data for Lake Constance, Constance (since 1817, supplied by the German Landesanstalt für Umwelt, Messungen und Naturschutz Baden-Württemberg) and Lago Maggiore, Locarno (Locarno (Swiss Federal Office for the Environment FOEN) since 1868. The Lago Maggiore data were corroborated by instrumental measurements at Sesto Calende for past floods since 1829 (Di Bella, 2005) and by reconstructed lake levels for floods prior to that time both for Locarno

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and Sesto Calende (Stucki and Luterbacher, 2010). Further, we used a daily discharge time series for Basel and Ponte Tresa, Ticino, since 1901 from the FOEN. Figure 1 gives an overview of the catchments and locations used in this paper.

Some of the series have potential inhomogeneities. Major corrections in the catchments or lakes were carried out in 1877 (Jura Waters correction, affecting the Aare and thus the Rhine), between 1888 and 1912 (Ticino in the Magadino plain), and 1943 (regulation of the level of Lago Maggiore). Lake Constance was and still is unregulated, but Jöhnk et al. (2004) argue that the level decreased by 15 cm between 1940 and 1999 due to upstream reservoirs. Based on model simulations, Wetter et al. (2011) estimate that the Jura Waters correction led to a reduction of peak discharges in Basel by 500 to 630 m^3/s. A further possible inhomogeneity concerns the level of Lago Maggiore. The flood of 1868 reportedly has led to erosion at the outflow, lowering the peak lake levels after the event. We will address these issues in Sect. 3.

2.2. Precipitation data

Unfortunately, hardly any daily precipitation series covers the entire, approx. 200- year period considered here. The only long series in Switzerland is from Geneva (Füllemann et al., 2011), with daily precipitation data reaching back to 1796. Note that this series has not been homogenized prior to 1864, and that it might not be representative for the northern side of the Alps. Much more daily records exist from Switzerland from 1864 onward, the start of the Swiss network. We use data for Lugano (Ponte Tresa catchment), as well as from a number of other stations (Affoltern, Basel, Altstätten, Bellinzona, Lohn, Engelberg, see Fig. 1). Monthly precipitation was taken from the gridded HISTALP data set (Hiebl et al., 2009).

Earlier studies (e.g., Glaser et al., 2010; Stucki et al., 2012) indicate that in the region of interest, most floods occur in the warm season (hereafter May to October). The only notable exception is the Christmas flood of 1882. In this paper, we therefore show the results only for the warm season. From both daily precipitation series we calculate the maximum precipitation amount over 3 days per warm season, denoted Rx3day. From the gridded HISTALP data set we calculated warm season precipitation averages for two regions (Fig. 1): A region north [46.5-47.5°N, 6.5-10°E] and a region south [45.75-46.25°N, 8.5-9.25°E] of the Alpine divide.

2.3. Weather type reconstruction

In order to address flood-inducing weather patterns, we use the daily weather type reconstruction for Switzerland by Schwander et al. (2017), which reaches as far back as 1763.

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The weather types used in this paper are an extension of the CAP9 weather types of MeteoSwiss (Weusthoff, 2011) into the past, using station data and classifying each day according to its Mahalanobis distance from the centroids of the weather types in the calibration period. However, as two of the types were not well discernible from two other types, the respective types were merged such that only seven types remain (CAP7, see Schwander et al., 2017).

2.4. Climate model simulations and reconstructions

For the analysis of atmospheric circulation during the 19th and 20th century, we use the reconstruction EKF400 (Reconstruction by Ensemble Kalman Fitting over 400 years, Franke et al., 2017). This global, three-dimensional reconstruction is based on an off-line data assimilation approach of early instrumental, documentary and proxy data into an ensemble of climate model simulations. It provides an ensemble of 30 monthly reconstructions back to 1600. Here we use the ensemble mean and analyse geopotential height (GPH) and vertical velocity at 500 hPa, wind at 850 hPa as well as precipitation.

Finally, we compare the observations-based results with a large ensemble of climate model simulations. We use a 30-member ensemble of atmospheric simulations performed with ECHAM5.4 (T63) termed CCC400 (Chemical Climate Change over 400 years), which is the set of simulations that also underlies EKF400. The simulations cover the period 1600 to 2005 and are described in Bhend et al. (2012). Their most important boundary conditions are sea-surface temperature (SST) data by Mann et al. (2009). From these SSTs we also calculated indices of the Atlantic Multidecadal Oscillation (AMO) and the Pacific Decadal Oscillation (PDO) following the definitions by Trenberth and Shea (2006) and Mantua et al. (1997), respectively (see Brönnimann, 2015, for extensive comparisons of these indices and CCC400 results). Note that in these simulations, the long-term changes in land-surface properties were misspecified. We therefore performed an additional simulation with corrected land surface to assess the impacts (Rohrer et al., 2018). While no impacts were found in heavy precipitation and weather types, warm-season average precipitation showed a too strong drying trend, which we adjusted to match that of the corrected simulation. In any case, the discrepancy concerns the long-term change and not decadal-to-multidecadal variability.

For the analysis in this paper, we use daily precipitation representative of the Aare catchment (47.5° N/7.4° E, see Brönnimann et al., 2018) and the CAP7 weather types from CCC400. The CAP7 weather types were evaluated by Rohrer et al. (2018): Although the model shows a

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zonal bias (too frequent westerly types), the decadal variability of weather type frequencies within the simulations may give some indications as to possible contribution forced by SST anomalies or other forcings.

2.5. Construction of a flood probability index

From the weather types described above, we construct a flood probability index (FPI) for each river catchment following the basic methodology of Quinn and Wilby (2013). The FPI weighs the frequency of weather types according to their flood-proneness. To determine the weights, we used daily discharge data during the period 1901-2009 for Basel and Ponte Tresa. Flood events were defined using a peak-over-threshold approach. The 98th percentile of warm season days was taken as a threshold, and a declustering was applied by combining events with a maximum distance of 3 days. Compositing the events around the day of maximum discharge showed enhanced discharge already 2-4 days prior to the event. Therefore, we also considered weather types on the three days prior to the event, consistent with results by Froidevaux (2014) on the role of antecedent precipitation for floods in Swiss rivers.

A seasonal or annual flood probability index FPI_y can be defined in the following way. For all event days (and similarly for preceding days, l indicates the lag and ranges from -3 to 0), we analysed the frequency of a given weather type t relative to all event days and divided this by the overall frequency of that weather type on all days. This ratio was termed w_{tl}:

$$w_{tl} = \frac{n_{tl} / n_l}{n_t} \quad (1)$$

To determine the FPI for a given year y (in our case, a warm season) we analysed the absolute weather type frequencies in that year (warm season), f_{ty}, and multiplied it with the corresponding weights w_{tl} for a given lag l. This results in one time series for each lag l. The four series were then combined to provide the index FPI_y using a weighted average with weights v_l:

$$FPI_y = \sum_l v_l \sum_t f_{ty} w_{tl} \quad (2)$$

We tested two sets of weights (v_l) for days -3 to 0: a ramp function (1/9, 2/9, 3/9 and 3/9), or equal weight (0.25, 0.25, 0.25, 0.25). Correlations of the resulting indices were very high (0.995 and 0.988 for Basel and Ponte Tresa, respectively) and only the former results are shown in the following.

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Figure 2 (top) shows the frequency of weather types during the warm season for the period 1901-2000. The types „northeast, indifferent“ and „west-southwest, cyclonic“, and „east, indifferent“ make up 60% of all days. The most rare weather type „high pressure“ accounts for 5% of all days. The middle and bottom panels show the fraction of flood events per weather type for Basel and Ponte Tresa (dividing the fractions in the bottom panels series by the frequencies in the top panel yields w_{tl}). Of all flood days in Basel, 60% are either „northeast indifferent“ or „north cyclonic“ types. Results are similar for the days before; 44% of these are of the „north cyclonic“ type, which is 3.4 times more frequent than over all days (top). With increasing lead time, „west-southwest cyclonic“ days become more prominent. For Ponte Tresa, type 7 („westerly over southern Europe, cyclonic“) is the most flood prone, while „west-souhwest cyclonic“ dominates on the preceding days. The enhancement of flood probability is largest for type 7 the day before the event (floods are 4.8 times more frequent).

Quinn and Wilby (2013) used annual frequencies of the weather types to define the FPI. Here we calculated a daily index FPI_d, which (unlike the annual index) takes the actual sequence of weather types into account, such as during the passage of a cyclone. Equation (2) can be used for the daily index, with the same weights v_l and w_{tl} as for FPI_y, but the frequency f_{tdl} is now either zero or one:

$$FPI_d = \sum_l v_l \sum_t f_{tdl} w_{tl} \quad (3)$$

The result is a daily index FPI_d whose warm season average is by definition equal to FPI_y, but which allows also studying other statistics. To test the daily index, we studied composites of FPI_d for Basel for all peak-over-threshold flood events and conversely composites of discharge for peak-over-threshold events of FPI_d (defined in the same way, i.e., as declustered 98th percentile). As expected, flood events are related to a clearly increased FPI_d (Fig. 3, top). The average reaches 1.73, which means a 73% increase in flood probability. This corresponds roughly to the 80th percentile of FPI_d. Compositing discharge for instances with a high FPI_d (Fig. 3, bottom) shows increased discharge near its 70th percentile. Thus, the index captures flood events well, although with a high rate of „false alarms” (i.e., not all FPI_d events lead to floods). This can be expected for such a coarse classification (only 7 types). Not every passage of a cyclone leads to a flood, and „optimal“ flood-inducing 4-day sequences of weather types are reached rather frequently. Based on these results, we chose the annual warm season 50th and 75th percentile of FPI_d for the following analyses, together with FPI_y (i.e, the mean of FPI_d).

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3. Results

3.1. Flood frequency

To begin with, we analysed the flood series in order to test whether the reported increased flood frequency in the mid-19th century is also found in our series (Fig. 4). The first thing we note is that floods do not occur synchronously across the considered catchments. The same is true for annual peak discharge series in general, as evidenced by low Spearman correlations. For instance, the series for the Rhine in Basel is uncorrelated with the series of Lago Maggiore and only moderately (coefficient of 0.36) with the series of Lake Constance, even though the latter comprises a large sub-catchment.

Was flood frequency higher in the mid-19th century? In fact, each series exhibits prominent peaks in the 19th century, e.g., the Rhine in Basel in 1817, 1852, 1876, 1881, and 1882 (see Stucki et al., 2012), Lake Constance in 1817 (see Rössler and Brönnimann, 2018) and Lago Maggiore in 1868. However, we also note a period of low flood frequency in Basel from the 1920s to 1970s, in agreement with a low frequency of peak-over-threshold events in Basel and Ponte Tresa. For further analyses we defined the 30 yr periods with highest and lowest flood frequencies, respectively, as follows: From the annual series we defined floods as exceedances of the 95th percentile of the 1901-2000 period (dashed line). Note that even accounting for a shift of 630 m^3/s due to the Jura Waters correction would not change the selected events of the Rhine in Basel, neither would a correction for a linear 15 cm trend of Lake Constance after 1940 due to an increasing number of water reservoirs upstream (cf. Jöhnk et al., 2004). However, the inhomogeneity caused by the 1868 event might be substantial. We therefore considered pre-1968 data only qualitatively.

Counting annual floods in all series as well as counting the daily peak-over-threshold events for Basel and Ponte Tresa both yields the same 30-yr period with lowest flood frequency: 1943-1972. The period with highest flood frequency is only defined by counting annual floods. Not including pre-1868 Lago Maggiore data, the period 1847-1876 is the most flood-rich. This is further supported by the historical data for Lago Maggiore, which suggest additional strong flood events in that period. However, earlier 30-yr periods might be equally or even more flood-rich, according to reconstructed flood events.

In the following we assess differences in a variable in each period relative to a corresponding climatology (a sample consisting of 30 yrs before and 30 yrs after the period to further reduce the effect of centennial-scale changes) as well as between the two periods with a Wilcoxon test.

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264 *3.2. Precipitation*

265 In a second step, we analysed warm-season mean precipitation and Rx3day for the regions
266 north or south of the Alps (Figs. 5 and 6). In both regions, warm season precipitation is
267 correlated significantly (Spearman correlation of 0.45 and 0.50, respectively) with annual
268 maximum discharge, clearly indicating that the floods under study are caused by excess
269 precipitation. In both regions, precipitation was slightly above the 20th century mean (dashed)
270 during most of the 19th century and below average during the flood-poor period. The
271 difference between the flood-rich and the flood-poor periods is significant ($p = 0.027$) for the
272 Ponte Tresa catchment. For the Basel catchment, both periods deviate significantly negatively
273 from the corresponding neighbouring decades ($p = 0.049$ and 0.030 for the flood-rich and
274 flood-poor period, respectively), which is unexpected for the flood-rich period. Their
275 difference is not significant.

276 Rx3day for Geneva and Lugano are shown exemplarily to assess the role of extreme
277 precipitation. For Geneva, we find two pronounced extremes (1827, 1888), both of which
278 were discussed in newspapers (e.g., Biliothèque universelle, **35,** 53) and thus are considered
279 real. For both stations, the decreased intensity of Rx3d in the flood-poor period relative to
280 neighbouring decades is significant ($p = 0.026$ and 0.038 for the Rhine and Ponte Tresa
281 catchments, respectively). A similar decrease at the same time is also found for other series in
282 Switzerland (Fig. 7 shows 6 long series). Calculating for each series the annual exceedance
283 frequency of the 95th percentile (based on the 1901-2000 interval) of Rx3d and then averaging
284 aver all 8 series shown in Fig. 5 to 7, we obtain a time series of the ratio of stations exceeding
285 their 95th percentile in a given year. This series shows lower values in the 1943-1972 period
286 than in the following 30 year period and even lower than in the late 19th century.

287 In Section 3.1 we found clear changes in flood frequency. This section shows that at least the
288 flood-poor period was related to a reduction in the precipitation amount and intensity of Rx3d
289 events, while results for the flood-rich period are ambiguous.

290

291 *3.3. Weather and large-scale flow*

292 In a third step, we analyse the link of flood events to atmospheric circulation and its
293 multidecadal changes by means of the FPI_d statistics (see Sect. 2.5). The temporal
294 development for Basel (Fig. 5, bottom) and Ponte Tresa (Fig. 6, bottom) is similar for all
295 indicators (mean, median or 75th percentile), and the Spearman correlations of the Basel FPI_d

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series with the annual maximum discharge at Basel are statistically significant (p = 0.003 to 0.004). This shows that the *FPI* is a good predictor for flood variability.

For both catchments, the indices reveal clear multidecadal variability. Indices are generally positive from the 1810s to 1900s (with a secondary maximum in the 1920s and 1930s) and negative from the 1940s to around the 2000s. Both periods are longer than those selected in our study. The differences in the FPI_d between our flood-rich and flood-poor period is significant in both catchments for all three indices (max. p-value is 0.0022). The flood-rich period does not differ significantly from the neighbouring decades (which also show high values of the FPI) in any of the indices, whereas the flood-poor period shows lower values than the neighbouring decades (p = 0.089 and 0.008 for Basel and Ponte Tresa, respectively). From these analyses we can conclude that the change in precipitation amount and intensity found in the previous Section was related to the FPI. The flood-rich and flood-poor periods clearly differ with respect to occurrence of weather types, i.e. large-scale atmospheric flow.

To further assess these differences in the large-scale atmospheric patterns, we also analysed the two periods in global climate reconstructions (EKF400), each relative to its climatology as well as the difference between the two (Fig. 8). The anomalies for the flood-rich period show clear negative GPH anomalies over western Europe and strengthened flow from the north-west. The extension of the Azores onto the European continent weakened. This pattern becomes a lot stronger and clearer when contrasting the two periods (flood-rich minus food-poor). The anomalies for the flood-poor period show strengthened high-pressure influence over Central Europe, descent, and dryness with anomalous flow from the north east.

In all, the large-scale analysis confirms the results from the *FPI*: It shows clearly that the shift in weather types was an expression of multi-decadal variability of atmospheric circulation over the full North Atlantic-European sector, consisting of a more zonal and southward-shifted circulation.

3.4. Climate model simulations

We have seen that the decadal-to-multidecadal changes in flood frequency can be related to changes in weather types, which are part of large-scale flow anomalies. In the fourth step, we analysed whether this can in turn be attributed to forcings as depicted in atmospheric model simulations, i.e. in the CCC400 model. Concretely, we analysed warm-season mean precipitation and Rx3d for a grid point north of the Alps and calculated FPI_d and its statistics for each member. We then averaged the results across all 30 CCC400 members. As the signal-

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to-noise ratio is small and year-to-year fidelity might be misleading, Figure 9 shows the series in a smoothed form (31-yr moving average) for visualisation.

Indeed, we note that the agreement between modelled and observation-based FPI is not good in the 19th century; the broad 19th century peak in the observation-based FPI is missing in the model. In addition, the analysis reveals downward trends in mean precipitation (although the series is trend-corrected) as well as in Rx3d. Quantitatively, the trend in mean precipitation amounts to -1.88% per century, which is rather small (much smaller than in the observations). Due to this trend it is not surprising that significant differences in seasonal mean precipitation between the two periods appear. Irrespective of obvious deficiencies in the model, however, a significant difference also appears for FPI_y between the two specified periods ($p = 0.005$), showing that there is forced multidecadal variability in the model.

In the model, the flood-rich period is not significantly different from neighbouring decades in any of the measures, but the flood-poor period clearly appears as a potentially flood-poor period, both in seasonal mean precipitation ($p = 0.006$) and FPI_y. ($p = 0.038$). Only model boundary conditions can explain this, and the arguably dominant contribution is from SSTs. Among the well-known SST variability modes, it is in fact the PDO index that explains the FPI_y most successfully. However, the Spearman correlation (0.138) remains low and not significant in view of the low number of degrees of freedom, even after detrending.

We infer from these analyses that our climate model simulations partly reproduce the sequence of flood-rich and flood-poor periods. However, the amplitude of the signal is very small and only the flood-poor period appears as a significant feature, possibly forced by changing sea-surface temperature in the North Pacific.

4. Discussion

While tracking the flood-frequency signal, we have found a number of links and dependencies; these are discussed in the following. For instance, previous studies found an increased flood frequency in Switzerland in the 19th century (Pfister 1984, 1999, 2009; Stucki and Luterbacher, 2010; Schmocker-Fakel and Naef, 2010a,b; Wetter et al., 2011) as well as a decrease in the mid 20th century, sometimes referred to as the „disaster gap“ (Pfister, 2009; Wetter et al., 2011). The series used in this paper confirm the general tendency. Schmocker-Fackel and Naef (2010a,b) identify 1820-1940 as a flood-rich period, while we use much a shorter period. However, our *FPI* is consistent with a longer flood-rich period around 1820-

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1940, i.e., the difference between 1820-1940 and 1943-1972 is also highly significant ($p < 0.00001$).

Warm season mean precipitation shows changes that are concurrent with those of flood frequency, with significant correlations. Rx3day series from Geneva and Lugano together with series from a larger number of Swiss stations confirm a multidecadal period around the 1960s with reduced intensity of Rx3d.

Schmocker-Fackel and Näf (2010a) analysed the relation between floods and weather types for the period after 1945 and manual assignments based on weather reports before that year. Here we can make use of a new, daily 250-yr weather type reconstruction. As in Schmocker-Fackel and Näf (2010a), we find that events south of the Alps and those north of the Alps are related to slightly different weather type characteristics, although indices for both regions are highly correlated on all time scales. Our *FPI* shows clear multidecadal variability, with high values during most of the 19th century and a secondary peak in the 1920s and 1930s, and lower than average values in the post-war period. After around 1980, the FPI returned to average values.

In agreement with Schmocker-Fackel and Näf (2010a,b), we find no imprint on the classical NAO pattern and also no clear weakening of the Azores high during the flood-rich period. However, we find that the extension of the Azores onto the European continent weakened, and we find clear negative GPH anomalies over western Europe, strengthened north-westerly advection, and large-scale ascent. This indicates a more zonal, southward-shifted circulation over the North Atlantic-European sector during the flood-rich period. Opposite anomalies, i.e., positive GPH anomalies and descent, are found for the flood-poor period, which was in fact associated with heatwaves and strong droughts in Central Europe. Brugnara and Maugeri (2019), find a regime shift in total precipitation and wet-day frequency for a southern region of the Alps, and for a period after the 1940s which coincides with the flood-poor period.

The flood-poor period might carry imprints of oceanic forcing. Sutton and Hodson (2005) related summer climate anomalies on both sides of the Atlantic in the wider 1931-1960 period to changes in the AMO. We do not find a significant correlation between our flood and precipitation indicators and the AMO, but a possible relation to the PDO index that needs to be further explored. The flood-poor period partly overlaps with a period of poleward displacement of the northern tropical belt, which is understood to be caused by sea-surface temperature anomalies and is reproduced in climate models (Brönnimann et al., 2015). Our EKF400 analysis is thus consistent with the results of the latter study.

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5. Conclusions

Flood frequency in Central Europe exhibits multidecadal changes, which has been demonstrated based on historical records. The causes for the increased flood frequency in Switzerland in the 19th century as well as for the decreased flood frequency around the mid-20th century are long-standing issues. In this study we have tracked these changes from flood records through precipitation records, weather type statistics and large-scale circulation reconstructions all the way to oceanic forcing as expressed in climate model simulations. Here we attribute the changes in flood frequency to changes in mean precipitation and in the intensity of Rx3d. In turn, these are related to a change in cyclonic weather types over Central Europe. These changes indicate a shift in large-scale atmospheric circulation, with a more zonal, southward shifted circulation during the flood-rich period relative to the flood poor period. Precipitation and circulation changes are also partly reproduced in climate model simulations forced by sea-surface temperature. However, only a very small part of the signal is recovered, which points to random atmospheric variability as an important cause.

The analyses show that decadal variability in flood frequency occurred in the past; and is likely to continue into the future. Better understanding its relation to weather regimes, large-scale circulation, and possibly sea-surface temperature may help to better assess seasonal forecasts and projections. Finally, the study also shows that the Quinn and Wilby (2013) methodology also works for flood risk in Switzerland.

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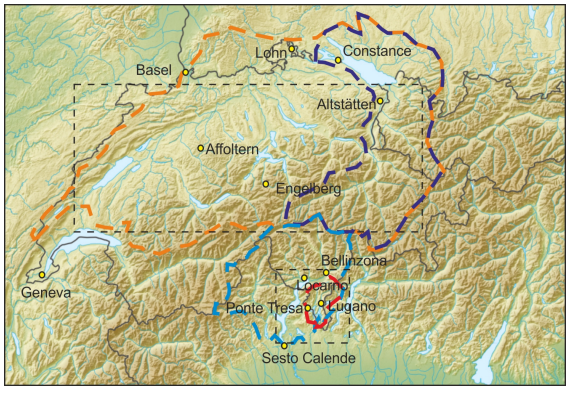
524 **Figures**



525

526 **Fig. 1.** Topographic map of the central Alps showing the catchments and locations mentioned in the
527 text, the catchments of the Rhine in Basel (orange), Lake Constance (dark blue), Lago Maggiore (light
528 blue) and Ponte Tresa (red). The rectangle boxes indicate the areas chosen for averaging precipitation
529 in the HISTALP data.

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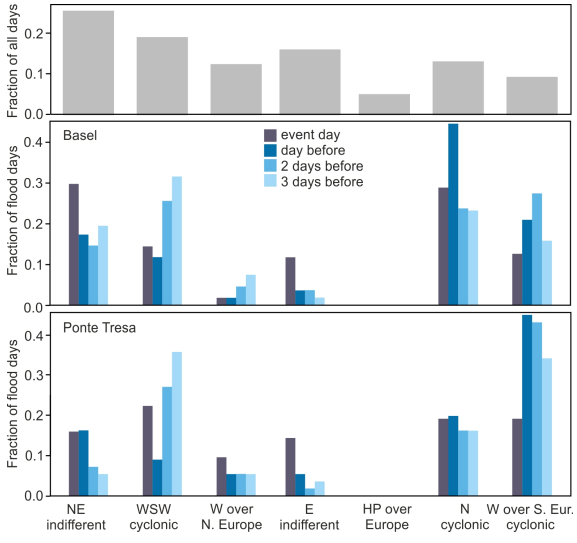

531

532 **Fig. 2.** Frequency of CAP7 weather types in the warm season (top). Fraction of flood days occurring
533 during a specific weather types for Basel (middle) and Ponte Tresa (bottom) as well as corresponding
534 series for days 1 to 3 prior to the discharge peak. The figure is based on data from 1901-2000

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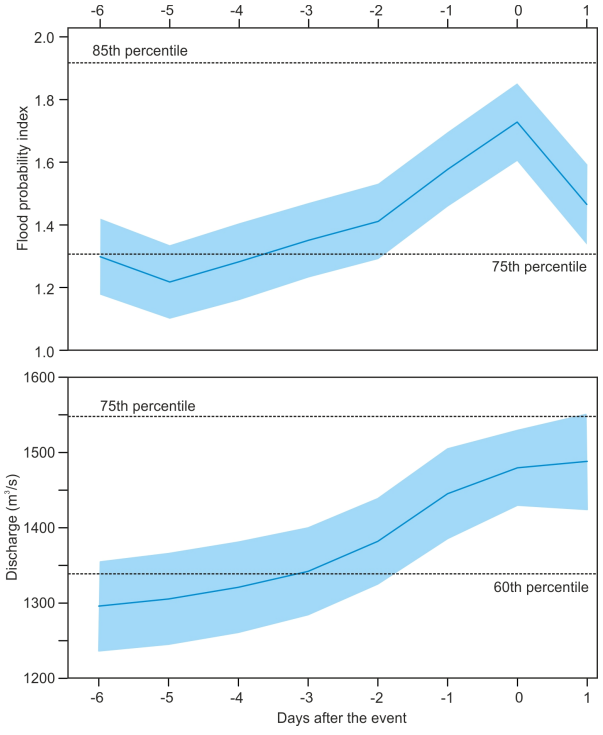

Fig. 3. Composites of the daily flood probability index for peak-over threshold discharge events in Basel (top), and composites of discharge in Basel for peak-over threshold FPI events (bottom) for 6 days preceding to 1 day following event day (day 0). Shading indicates the 95% confidence interval of the mean value. Selected percentiles are indicated as dashed lines.

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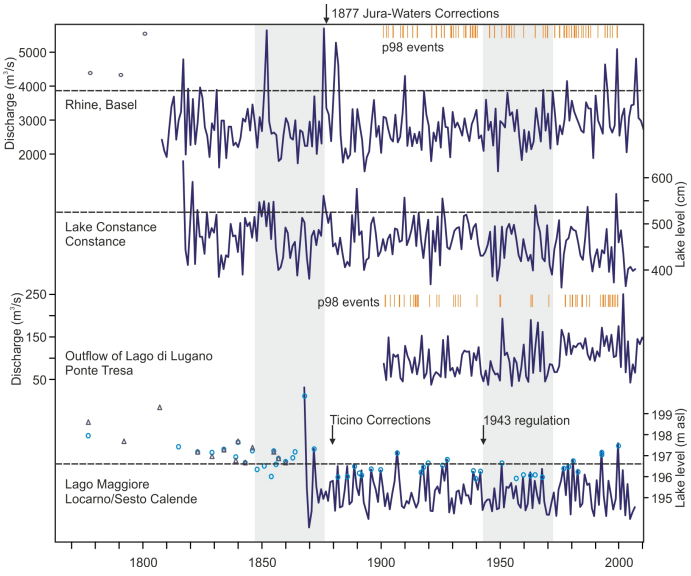

Fig. 4. Time series of annual maxima of discharge or lake level in four catchments. Symbols denote reconstructed floods based on historical sources (circles for Rhine, Basel, from Wetter et al. 2011, Triangles for Lago Maggiore, Locarno, from Stucki and Luterbacher, 2010, light blue circles for Lago Maggiore refer to floods at Sesto Calende according to Di Bella, 2005, from reconstruction prior to 1829 and measurements afterwards, adjusted to Locarno by adding the average difference between the two during floods after 1868, i.e., 0.49 m). Arrows indicate major river corrections. Orange bars indicate the peak-over threshold events in the 1901-2000 period that were used to calibrate the FPI. Grey shading denotes the flood-rich period in the 19th and flood-poor period in the 20th century. Dashed lines indicate the 95th percentile from 1901-2000.

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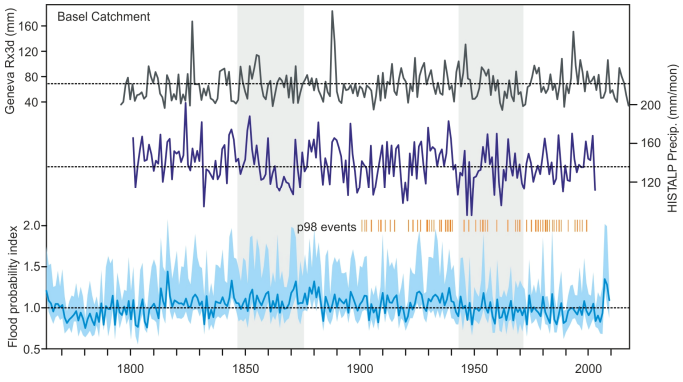

552

553 **Fig. 5.** Warm season Rx3d from the station Geneva (top), warm season mean precipitation in
554 HISTALP for the Rhine catchment (middle) and flood probability index for Basel (bottom, solid
555 indicates the warm season mean, shading indicates the median and 75th percentile, respectively).
556 Dashed lines indicate the 1901-2000 average. Also shown are the peak-over threshold events (p98) of
557 Basel discharge that were used for calibration.

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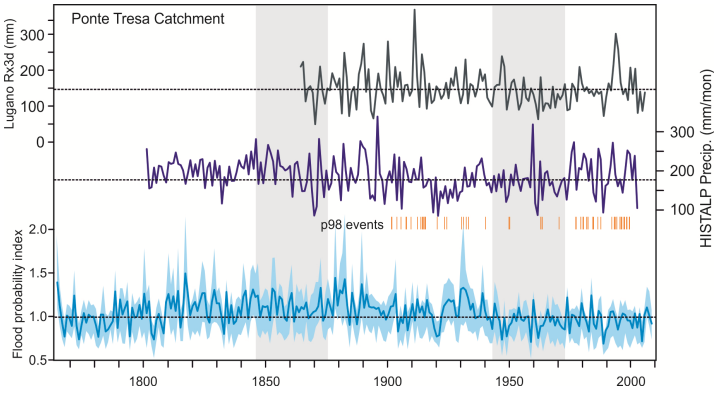

559

560 **Fig. 6.** Warm season Rx3d from the station Lugano (top), warm season mean precipitation in
561 HISTALP for the Ponte Tresa catchment (middle) and flood probability index for Ponte Tresa
562 (bottom, solid indicates the warm season mean, shading indicates the median and 75th percentile,
563 respectively). Dashed lines indicate the 1901-2000 average. Also shown are the peak-over threshold
564 events (p98) of Ponte Tresa discharge that were used for calibration.

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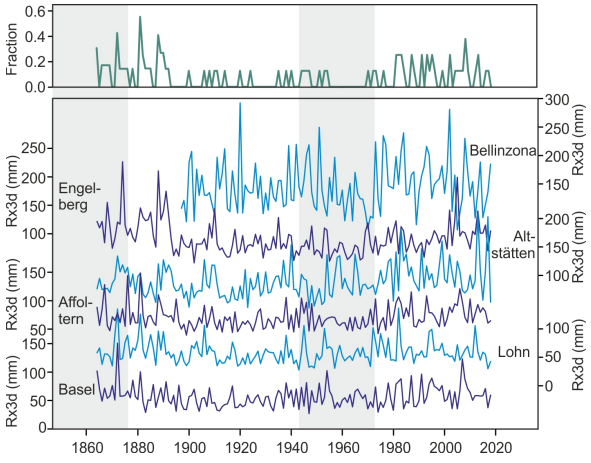

Fig. 7. Series of Rx3day for six further stations with long precipitation series (see Fig. 1 for locations). The top line shows the fraction of these six series plus those of Lugano and Geneva shown in Figs. 5 and 6, exceeding their 95th percentile (based on 1901-2000) in any given year.

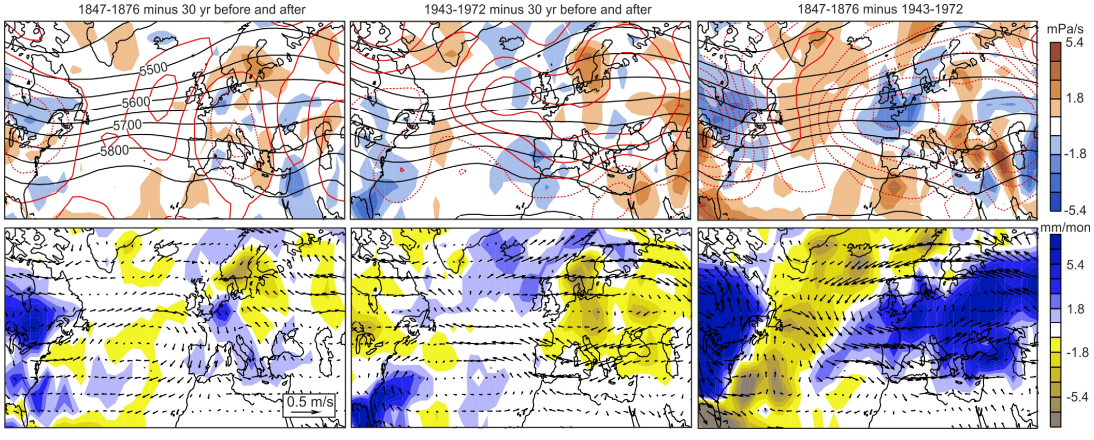

Fig. 8. Anomalies of (top) 500 hPa GPH (red contours, 2 gpm spacing symmetric around zero, negative contours are dashed, black lines indicate the reference period average) and vertical velocity (colours, lifting is blue) and (bottom) 850 hPa wind and precipitation. Shown are anomalies for the 1847-1876 period (left) and the 1943-1972 period (middle) with respect to the 30 yrs before and after as well as (right) the difference between the two periods.

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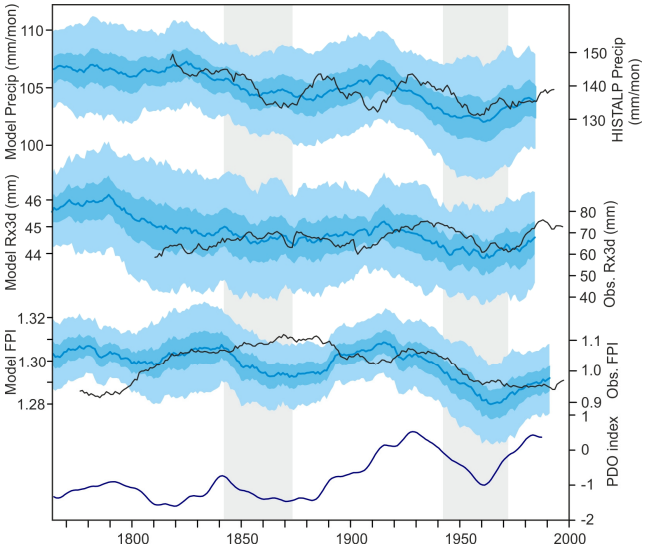

Fig. 9. CCC400 (left scales) warm season average precipitation (top, note that this series was detrended based on the corrected member), Rx3day in the warm season at the grid point north of the Alps (second from top) and flood probability index based on weather types in CCC400 (third from top). The lowest line shows the PDO index in the model simulations. The solid blue lines show the ensemble mean of the series smoothed with a 31-yr moving average. Light and dark shadings indicate the ensemble standard deviation and the 95% confidence interval of the ensemble mean, respectively. Black lines (right scales) show the corresponding observation-based series. Note the different scales.