# The role of preconditioning for extreme storm surges in the western Baltic Sea

Elin Andrée<sup>1,2</sup>, Jian Su<sup>1</sup>, Morten Andreas Dahl Larsen<sup>2</sup>, Martin Drews<sup>2</sup>, Martin Stendel<sup>1</sup>, and Kristine Skovgaard Madsen<sup>1</sup>

<sup>1</sup>Danish Meteorological Institute, Lyngbyvej 100, 2100 Copenhagen, Denmark

<sup>2</sup>Technical University of Denmark, Dept. of Technology, Management and Economics, Produktionstorvet, Building 424, 2800 Kgs. Lyngby, Denmark

Correspondence: Martin Drews (mard@dtu.dk)

**Abstract.** When natural hazards interact in compound events, they may reinforce each other. This is a concern today and in the light of climate change. In the case of coastal flooding, sea-level variability due to tides, seasonal to inter-annual salinity and temperature variations or larger–scale wind conditions modify the development and ramifications of extreme sea levels. Here, we explore how prior conditions may influence peak water levels for the devastating coastal flooding event in the western Baltic

- 5 Sea in 1872. By imposing a range of antecedent conditions in numerical ocean model simulations, we We quantify the change in peak water levels that arise due to alternative preconditioning of the sea level before the storm surge by imposing a range of antecedent circumstances as boundary conditions to numerical ocean model simulations. Our results show that different certain preconditioning could have generated even more catastrophic impacts. As an example, a simulated increase in the water level of 36 cm compared to the 1872 event was seen occurred in Køge just south of the Danish capital region Copenhagen (Denmark)
- 10 and surrounding areas a region that was already severely impacted. The increased water levels caused by the alternative water mass distributions propagate sea-level patterns propagate as long waves until encountering shallow and narrow straits, thereafter the effect vastly decreases. Adding artificial increases in wind speeds to each study point location reveals a near-linear relationship with peak water levels for all Western Baltic locations highlighting the need for good assessments of future wind extremes. Our research indicates that a more hybrid approach to analysing compound events, and readjusting our present
- 15 warning system to a more contextualised framework, might provide a firmer foundation for climate adaptation and disaster risk management. In particular, accentuating the importance of compounding preconditioning effects on the outcome of natural hazards may avoid under- or overestimation of the associated risks.

# 1 Introduction

Several authors have recently demonstrated the importance of considering the compoundness of extreme events and suggested
that such events may become more likely due to climate change (AghaKouchak et al., 2020; Santos et al., 2021; Vogel et al., 2021; Zscheischler et al., 2018). They include a range of natural hazards like floods and storms, whose impacts the impacts of which may be enhanced or lessened by antecedent conditions that either interact directly with the eventor affect, hence affecting the vulnerability of exposed areas (Bischiniotis et al., 2018; Bradstock et al., 2009; Johnson et al., 2016; McMillan et al., 2018;

Raymond et al., 2020). The time scales of such "preconditioning" can vary from days to months or even years. For example,

- 25 the exceptional 2018 European wildfire season that severely impacted Northern Europe was locally preceded by above-average temperatures and abnormally dry (e.g. vegetation) conditions in most places, some extending back several months and some all the way back to 2017 (Commission et al., 2019). It was also generally exacerbated by favourable unfavourable wind conditions and high temperatures during the summer. As compared to the average of 2008-2017, some countries like Norway, Sweden, Finland, Germany and the Czech Republic, therefore suffered a doubling or more of the number of recorded fires in 2018
- 30 (Commission et al., 2019). Similar examples involving different time scales include landslides that are predated by extensive soil erosion caused by e.g. rainfall or snowmelt (Hilker et al., 2009), as well as overland flooding induced by heavy rain that is exacerbated by falling on top of a very wet period, e.g. with saturated soils and filled water reservoirs (Hendry et al., 2019).

Management of the current and future risks of natural hazards often relies on a combination of learning and extrapolating from past extreme events, modelling and climate change projections (Dangendorf et al., 2021; Frederikse et al., 2020; Harjanne

- 35 et al., 2017; Travis and Bates, 2014). However, while the history of meteorological observations is long, modern-era instrumental measurements only date back to the founding of the first meteorological institutes in the later part of the 19th century. As a result, comprehensive observations of low-probability high-impact events are generally scarce and limited to recent decades (Calafat and Marcos, 2020; Hallin et al., 2021; Jacobsen et al., 2021). In contrast, longer records include only the observed maxima, e.g. maximum observed water levels, inundation depths, precipitation intensities or wind speeds. Correspondingly, the
- 40 extremes inferred from model simulations are mainly compared to observations in their ability to reconstruct said-maximum values and not their contexts (Marcos et al., 2015).

Storm surges and extreme sea levels are one of the main threats to people and property properties along coastlines (Brown et al., 2018; Buchanan et al., 2017; Hallegatte et al., 2013; Vousdoukas et al., 2020; Wahl et al., 2017). Generally, high water levels are associated with low-pressure weather systems, resulting in strong winds pushing piling seawater towards the shore and

- water levels exceeding the range of the astronomical tides. <u>Wave-driven setup from waves breaking in the shallow surf zone may comprise 20 to 30 % or more of the total surge during energetic wind conditions (Lavaud et al., 2020; Woodworth et al., 2019).</u> However, the wind effect is only one of several factors drivers influencing high water levels' development, maximum elevation, and duration. Other essential factors include sea-level variations due to tides (Arns et al., 2020), seasonal or inter-annual salinity and temperature variations, large-scale pressure fluctuations, dynamic water interactions with basin geometry and bathymetry
  (especially for marginal seas), and the initial distribution of seawater within a basin (Pugh, 1987). In combination, these factors
  - can lead to both heightened and lowered surge levels.

Coastal flood risk assessments are generally based on local extreme sea level statistics derived from time series of tide gauge measurements with lengths varying from a few decades to more than 100-100 years. Based thereof, extreme sea levels and their associated recurrence periods may be predicted using different variants of extreme value analysis (Coles et al., 2001;

55 Thorarinsdottir et al., 2017; Wahl et al., 2017). Similarly, future extreme sea level statistics may be obtained by analysing modelled sea levels within a future time slice, e.g. 2071-2100, and contemporary scenario assumptions (Masson-Delmotte et al., 2021; Oppenheimer et al., 2019). It has been proposed that hydrodynamic models may be needed to refine flood risk assessments at regional to local scales. For example, Vousdoukas et al. (2016) suggest that by accounting for water level

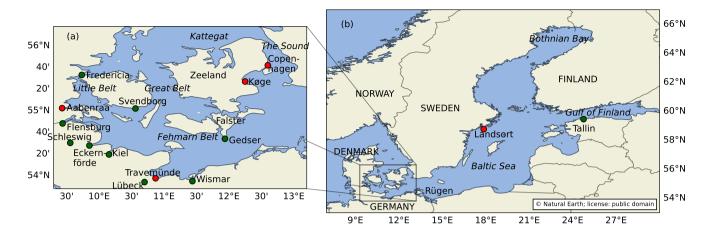


Figure 1. Map of the study area with a zooming in on the Danish Straits in the western Baltic Sea (panel (a)) and the entire Baltic Sea (panel (b)). Locations marked in the figure are mentioned in the text. Filled circles indicate locations of water level measurements. This study focuses on the tide gauge locations marked in red.

attenuation due to land surface roughness, the estimated flood exposure decreases (inundation extent and depth) and hence also

- 60 the estimated damages (Vafeidis et al., 2019). Likewise, several authors have recently addressed the potentially disproportional risks from compound coastal flooding, e.g., caused by a combination of storm surge and heavy rainfall (Bevacqua et al., 2019) or a surge combined with high river discharge (Couasnon et al., 2020), and the challenges for risk management concerning compound events in our study area (Modrakowski et al., 2022). Conversely, the role of preconditioning for the development of extreme sea levels has so far received less attention (Weisse and Weidemann, 2017). Here, we exemplify the
- As already mentioned, the physical context is normally not considered in classical risk analysis, e.g., in calculations of statistical recurrence frequencies from observed annual maxima or other collections of extremes. Here we propose that to avoid under- or overestimation due to the compounded risks, and more generally to improve confidence in the results of these kinds of studies for the benefit of adaptation planning, it is necessary to be able to "explain" the numbers and the associated uncertainty estimates. The motivation for this research is to address this research gap and investigate the potential influence of

70 preconditioning of the Baltic Sea for an extreme on an extreme wind-driven sea-level event in the western Baltic ...(Fig. 1). The Baltic Sea is a marginal sea of the Atlantic Ocean characterised by complex coastlines. Its connection to the North Atlantic, via the North Sea and the shallow and narrow Danish Straits, suppresses much of the sea-level variability coming from the North Atlantic. Instead, this flow restriction introduces other types of sea-level variability that may exacerbate extreme sea levels induced by storms. Atmospheric forcing can redistribute water between the different sub-basins in the Baltic, or change

75 the overall volume and thereby the filling level through water transport between the North and Baltic Seas, which may cause the sea level to vary on time scales of weeks (Samuelsson and Stigebrandt, 1996; Weisse and Weidemann, 2017). Volume changes are commonly inferred from the water level at Landsort (panel (b), Fig. 1) because of its location close to the nodal line of the Baltic Sea and is referred to as the Baltic's filling level (Feistel et al., 2008; Lisitzin, 1974; Matthäus and Franck, 1992; Weisse and Weidemann

. Likewise, oscillations related to the semi-enclosed nature of the Baltic Sea known as seiches (Leppäranta and Myrberg, 2009;

80 Pugh, 1987) are found to contribute to sea-level variability. However, these are not yet fully understood (Weisse et al., 2021). The characteristic time scales for these oscillations have been estimated to roughly be roughly equal to a day based on basinwide (Wubber and Krauss, 1979), and sub-basin wide (Jönsson et al., 2008) premises.

The importance of considering the contribution from filling level and seiches to Baltic sea-level anomalies has previously been highlighted by Weisse and Weidemann (2017), who analysed sea level data from a high-resolution tide-surge model driven

- by an atmospheric reanalysis. In their 64-year hindcast, high filling level (FL-H, defined as periods where the sea level near Landsort , Sweden, remain at least 15 cm above the local long-term mean for a minimum of twenty days (Mudersbach and Jensen, 2010)) occurred on average sixty days per year. During these conditions, relatively lower wind speeds were needed to generate high sea levels. Weisse and Weidemann (2017) also showed that seiche contributions to peak water levels exceeded 10 cm in one-third of cases at the station Wismar on the German Baltic Sea coast.
- In For this study, we use a "storyline approach", where we revisit the disastrous 1872 (western) Baltic Sea storm surge (Clemmensen et al., 2014; Colding, 1881; Rosenhagen and Bork, 2009), which stands as the worst storm surge on record experienced in the western Baltic Sea (Hallin et al., 2021). During this event, an unparalleled wind forcing from the northeasterly–easterly sector over a large expanse of the Baltic Sea (Rosenhagen and Bork, 2009) generated exceptional water levels, up to 3.5 m above average, affecting areas in Denmark, Germany and Sweden with catastrophic impacts (Colding, 1881; Hallin et al., 2010).
- 95 2021; Jacobsen et al., 2021). At least 271 persons drowned, and about 15000 lost their homes (Kiecksee et al., 1972; Petersen and Rohde, 1977). 427-More than 400 sailing ships (15 of them Danish) and 23 steam ships stranded or sank, mainly along the eastern shores of the Danish islands of Zealand and Falster (Bureau Veritas, 1872).

Interestingly, the Baltic Sea filling level in the weeks before 13 November 1872 was fairly moderate. The main objective of this paper our research is to answer the question: What extreme water levels would have been obtained as a consequence of the

- 100 1872 storm if the antecedent conditions were different? We explore this research question using a set of numerical ocean model simulations that all arrive at states driven by the atmospheric conditions of the 1872 storm surge event. The differences between the simulations arise as we change the point of departure initial sea-level patterns (i.e. the antecedent prior conditions) of the simulations to assess the effect of different kinds of preconditioning on the resulting water levels. This sensitivity test allows us to isolate the effects of preconditioning on extreme sea levels resulting from a specific storm. The regional atmospheric
- 105 conditions during the 1872 storm have previously been reconstructed by Rosenhagen and Bork (2009) at the German national meteorological service Deutscher Wetterdienst (DWD). Their product yields higher maximum wind speeds that better agree with local observations than what is generated in lower resolution global reanalysis (Feuchter et al., 2013). Here, the regional reconstruction is used as forcing for our simulations.

From historical records and modelling reconstructions of the storm surge event of 1872, it is evident that the Baltic Sea filling

110 level in the weeks preceding 13 November 1872 was quite moderate. On this background – and given that the 1872 storm often serves as an absolute reference for, e.g. climate change adaptation around the Baltic Sea – it is relevant to ask whether the 1872 storm is really the worst possible event that could have happened in the western Baltic? Since the filling level of the Baltic Sea exhibits natural variability with exceedances of the 1872 event, it is reasonable to assume that the initial filling level (serving as boundary conditions for the storm) could have been higher than they were (and lower as well for that matter). Since local sea

- 115 levels are the result of interactions between complex dynamical processes, to answer the above mentioned question, we choose to replace the reconstructed filling level from 1872 with other, physically consistent boundary conditions, rather than artificially raising them by a factor. While both methods generate what are essentially synthetic events, which may be associated with a negligible probability, the former better supports our "storyline approach" as it builds on real, historic events.
- One of these events is the storm surge on 31 December 1904. For this storm, the pressure gradient in the western Baltic was about 1/3 larger than for the 1872 event. With easterly winds (rather than from the northeast as in 1872), water levels ran up to the "top five" at several locations in Denmark, but remained well below the 1872 values (Jacobsen et al., 2021). Another event, which we here use as preconditioning, is a "silent storm surge" (i.e., a storm surge without storm) of 4 January 2017 with high water levels, also among the "top five" at several locations (Jacobsen et al., 2021). This was due to a high water level in the days before the event. By definition, the observed combinations of wind and water levels during these previous events
- 125 represent realistic conditions, and while none of them are exact "scalings" of the 1872 event, we argue that our modifications are physically plausible as they are well within the local range of natural variability. This extends to the question of the physical realism of the meteorological forcing scenarios, with the exception of the transition within the model simulations (when we change from the preconditioning forcing data to those of the reconstructed 1872 event) a transition that the model handles robustly.
- 130 In the following, we specifically compare the model simulations of 1872 with three alternative scenarios with more favourable unfavourable preconditioning to quantify a range of implications of an "1872-like" storm. The substitute antecedent conditions are based on realistic simulations of contemporary sea-level events. In addition, we carry out a second set of simulations where we amplify the wind speeds used as input to the ocean model. The purpose of these simulations was to assess the combined effect of storm and preconditioning enhancement on peak water levels. In Sect. 2, we outline the atmospheric conditions of the
- 135 1872 storm surge, the experimental design, data sources, and the ocean model setup. Section 3 presents our results, and Sect.4 the discussion and conclusions.

# 2 Methods and data

The following section describes the atmospheric conditions during the original experiment, i.e., for the unperturbed simulation of the 1872 storm surge as reconstructed by our model system. We denote this experiment O. Section 2.2 describes our three variant preconditioning scenarios (which we denote FL1, FL2 and S) and the physical conditions behind these cases.

# 2.1 Case study: The 1872 event

On 13 November 1872, catastrophic flooding took place along the southwestern Baltic Sea coasts (panel (a), Fig 1). Water levels exceeded previous records fargreatly surpassed previous records, and no flood event has come even close to the 1872 event since then. Water levels reached 3.38 m in Lübeck, 3.40 m in Travemünde and Eckernförde, 3.30 m in Kiel, 3.49 m in

145 Schleswig and  $3.27 \,\mathrm{m}$  in Flensburg (Petersen and Rohde, 1977). For Danish coastlines, Jacobsen et al. (2021) provide trend free

sea-level estimates based on the comprehensive collation of contemporaneous oceanic and atmospheric information by Colding (1881). Relative to the mean sea level in the year 2020, the water level reached 2.90 m at Køge and increased westward to more than 3.5 m by the Danish mainland (Jacobsen et al., 2021).

Favourable Unfavourable conditions for a storm flood surge are generated when westerlies transport large amounts of water

150 through the Danish Straits and into the Baltic Sea. A dangerous rise in the water level at the Baltic Sea coasts of Germany and Denmark can occur if the wind subsequently changes to a northeasterly direction. This mechanism was already discussed by Baensch (1875). Therefore, it is necessary to consider the atmospheric situation at least two weeks before the event when reconstructing the 1872 storm surge and similar events.

#### 2.1.1 Atmospheric conditions

- 155 Between 1 and 11 November, low pressure was found over Scandinavia and the Norwegian Sea. Strong winds from westerly to southwesterly directions caused a intense net transport of water through the Danish Straits and into the Baltic Sea. The maximum cumulative transport at Cape Arkona on the island of Rügen (54.7°N 13.4°E) peaked occurred on 9 November (Rosenhagen and Bork, 2009). On 10 November, the weather pattern changed dramatically. A low crossed central Europe on a quite unusual track from northwest to southeast, while pressure rose sharply over Scandinavia. Consequently, the winds shifted
- 160 from southwest to northeast, and the piled-up waters in the eastern Baltic Sea could flow-were released as a long wave travelling to the southwest. This situation low pressure over central Europe, high pressure over Scandinavia and a maximum pressure gradient over the southwestern Baltic Sea prevailed during the next three days, with both the high and the low intensifying further. In the morning of 13 November, the high over central Scandinavia had an unusually high sea level pressure of 1047 hPa, whereas the low with a core pressure of 990 hPa was located over the border region of Saxony, Prussia and Bohemia. As a
- 165 consequence, the northeasterly storm over the southwestern Baltic reached full gale force. With the weakening of both pressure centres, the strong winds died down, and water levels fell.

#### 2.1.2 Data sources

The atmospheric conditions driving the development that culminated in the 1872 storm surge can be retrieved from a global reanalysis based on synoptic pressure observations (Compo et al., 2011). However, more local data is available than is included in

- 170 global reanalyses. For our control simulation of the 1872 storm surge (denoted O), we, therefore, utilised two different sources of atmospheric forcing. First, to spin up the ocean model, we used forcing from the 20th Century Reanalysis in its most recent version 20CRv3 (Slivinski et al., 2019) for a simulation spanning the years 1871 to 1873. The 20CRv3 data set is available in three-hourly resolution and 75 km grids (Slivinski et al., 2019) (https://psl.noaa.gov/data/gridded/data.20thC\_ReanV3.html). Second, we used a regional, gridded reconstruction with higher spatial (0.5° grids) and temporal (hourly) resolution (Rosen-
- 175 hagen and Bork, 2009) in the days preceding and during the storm surge event. This data set was supplied by the German national meteorological service (DWD)DWD. It is based on a more extensive set of observations and captures the very intense wind conditions during the event more accurately than the coarse, global reanalysis (Feuchter et al., 2013). For the analysis of the 1872 event, we have access to a substantial amount of local and regional data, notably from Germany. Observations have

also been preserved from other nations, many of which had already established weather services. In Denmark, Niels Hoffmeyer

180 , the first director of the newly founded Danish Meteorological Institute, reconstructed sea level pressure fields from numerous observations that the DMI-Danish Meteorological Institute (DMI) had collected.

As pointed out in the previous section, one of the preconditions for the catastrophic flooding was the period of strong westerlies prior to the event that transported large amounts of water into the Baltic Sea. Therefore, the period from 1 to 14 November 1872 was considered in the reconstruction by Rosenhagen and Bork (2009), and the investigated area covered the northeast Atlantic and northern Europe as far east as the Baltic states. We used this data set when available, i.e., from 06:00 1 November until the storm surge abated almost two weeks later.

The methods for generating the detailed 1872 atmospheric reconstruction is are described in Rosenhagen and Bork (2009). Here we give a brief overview of the concept behind the manipulation. Generally, we are interested in observations of sea level pressure and wind direction and speed. From there, we can reconstruct the two-dimensional (geostrophic) wind fields that are

- 190 required to run our ocean model. In practice, geostrophic wind fields can be determined by triangulation and compared to the wind observations. This construction is achieved by assuming an equilibrium between the Coriolis force and the pressure gradient force (Alexandersson et al., 1998). An extrapolation needs to be done to obtain winds at 10 m height since the pressure fields have been reduced to sea level. Such extrapolations can be accomplished using empirical formulae. Many approaches have been suggested for this purpose, but common to them all is that they are quite dependent on the thermal layering of the
- 195 lower troposphere, which we do not know. Further, this approach does not directly take into account frictional effects. Both factors can be approximated by using the distance from the sea, dependent on the wind direction.

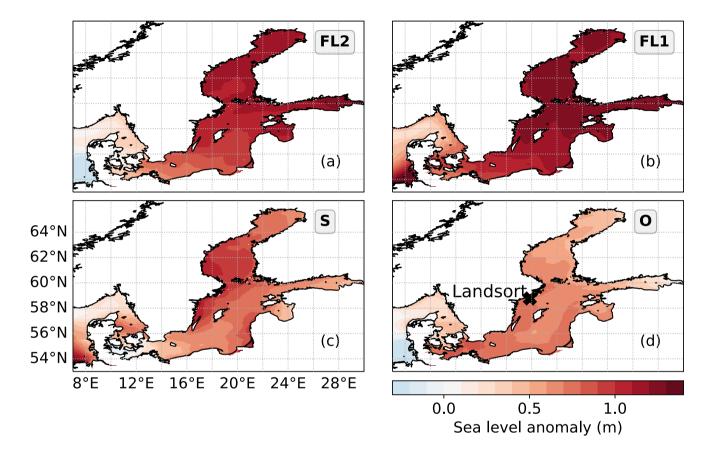
#### 2.2 Alternative preconditioning

185

To investigate scenarios of how altered antecedent conditions could have affected the development of the 1872 storm surge, we conducted three different experiments with alternative preconditioning. Two of the cases (FL1 and FL2) represent instances of high filling levels within the majority of the Baltic Sea. Case S incorporates a seiche effect. The data and methods for generating the scenarios are described in Sect. 2.2.1. The selection and physical conditions surrounding the instances are described in Sect. 2.2.3–2.2.4.

## 2.2.1 Scenario construction

- As previously mentioned, the filling level of the Baltic Sea in November 1872 was fairly moderate. To demonstrate the implica-205 tions for extreme sea levels if the Baltic had been preconditioned differently, we formed scenarios by imposing the atmospheric forcing of 1872 onto three alternative cases where the water mass distributions sea-level patterns, were different (Fig. 2). The water level at Landsort (58.8°N, 17.9°E) (location marked in panel (d), Fig. 2) is commonly used to represent the filling level in the Baltic Sea because it is close to the nodal line of the Baltic (Feistel et al., 2008; Lisitzin, 1974; Matthäus and Franck, 1992; Weisse and V . The development of the Landsort water level for the respective simulations are shown in Fig. 3. In addition to showing the
- 210 Landsort water level, Fig. 3 indicates the periods we use as preconditioning (i.e. alternative antecedent conditions) for the perturbed cases and the Landsort water levels corresponding to the snapshots in Fig. 2.



**Figure 2.** The sea level anomaly field that corresponds to the maximum water level at Landsort for each simulation (see Fig. 3 for time series). The magnitude of the sea level anomalies are indicated by the colorbar. Panel (d) shows the unperturbed case (O) from 14:00 11 November 1872. Preconditioning for the sea level anomalies in panels (a) and (b) were obtained from an ocean hindcast (Andrée et al., 2021). The time is adjusted to match case O. Therefore, the time steps shown correspond to 9 November at 19:00 (FL2) and midnight (FL1), respectively. Case S (panel (c) uses the same conditions as O, except that the atmospheric forcing between midnight on 9 November and up until 15:00 on 12 November 1872 are is replaced by the corresponding times from 1st to 4th January 2017. The panel represents 04:00 on 12 November. Panel (d) shows the location of station Landsort, which is used to estimate the filling level.

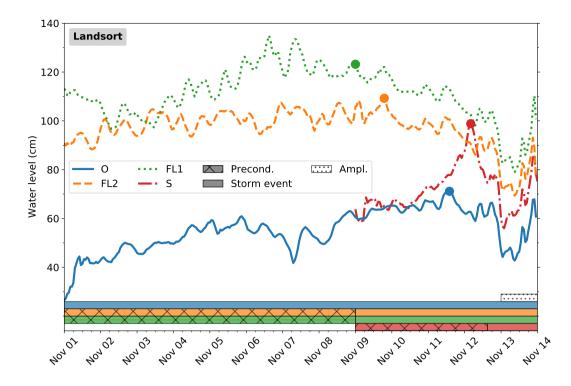


Figure 3. Preconditioning of the original (O) and alternative scenarios (FL2, FL1 and S) illustrated by the water level at station Landsort (lines). The dots show the Landsort water levels corresponding to the sea level distributions in Fig. 2. Horizontal bars indicate the respective preconditioning periods; hashes indicate periods where the forcing in the alternative scenarios differs from that in O. See Sect. 2.2.1 for a description of the scenarios. The dotted bar indicates the period used to amplify the wind speed (see Sect. 2.3).

Scenarios FL1 and FL2 utilise monthly archived initial conditions from a regional ocean hindcast (Andrée et al., 2021). We forced the ocean model with the same regional reanalysis as the ocean hindcast (i.e. the Uncertainties in Ensembles of Regional Re-Analyses (UERRA) HARMONIE/V1 data set (Ridal et al., 2017)) from the initialisation at the beginning of the respective 215 month until the desired preconditioning state was reached (see Sect. 2.2.3–2.2.4). Horizontal bars in Fig. 3 mark these periods. The atmospheric forcing was thereafter switched directly to that of the high-resolution, 1872 reconstruction corresponding to 9 November. From then on and throughout the rest of the simulations, the atmospheric forcing that drives cases FL1 and FL2 is identical to the unperturbed (O) case. Differences in the dynamic development for each scenario are therefore solely due to perturbations of the initial state. The periods that utilise unperturbed atmospheric forcing from the 1872 event are indicated by solid colours (horizontal bars, Fig. 3). Case S is identical to O until midnight 9 November 1872, when the forcing was

220

switched to that of midnight 1 January 2017. This forcing was utilised up until 15:00 on 4 January when it was switched to the corresponding time from 12 November 1872. In effect, we replaced approximately 3.5 days of case O to incorporate a seiche effect in S.

#### 2.2.2 Case FL2 - 13 March 1990

As a complement to using Landsort's water level we did a spatial integration of sea-level anomalies eastward of 13°E to assess the Baltic<del>filling level's volume changes over time</del>. The highest value corresponds to the Landsort maximum on 30 January 1983 and is described in Sect. 2.2.3 (case FL1). The second highest event constitutes our case FL2, initialised on 13 March 1990.

The year 1990 started unusually warm and was dominated by winds from southerly to westerly directions. Intense activity from low-pressure systems over the North Atlantic resulted in a succession of storms and frontal passages tracking over the North Sea. The strong zonal winds with intermittent episodes of northwesterly winds <u>pushed water masses caused a net water</u> transport into the Baltic Sea. From 21 February until 13 March, when case FL2 was initialised, the water level at Landsort steadily increased. Sea level elevations were high overall but lower in the Bothnian Bay and Baltic Proper than in case FL1. The water level was exceptionally high also in the Gulf of Finland. Soomere and Pindsoo (2016) visualised modelled water 235 levels above 80 cm near Tallinn for more than a week in March 1990.

#### 2.2.3 Case FL1 - 1 February 1983

Case FL1 occurs in the aftermath of the highest observed water level at Landsort (Wolski et al., 2014). The atmospheric conditions leading up to this event constituted an extensive period of mild and wet weather with strong, zonal winds. The water level at Landsort started rising within the first few days of December. On 18 January, a low-pressure system that generated

- 240 northwesterly, hurricane-strength winds along the Danish North Sea coastlines tracked from the north of the UK and eastward towards the central Baltic Sea. During its passage, the relative water level at Landsort reached its highest observed value in an almost 136-year long record. In the last week of January, southwesterly to westerly winds over the North Sea and the south to central Baltic Sea were mainly between 10 to  $20 \text{ ms}^{-1}$ . On 31 January, the Baltic Sea experienced winds of only a few metres per second, as a new low-pressure system was moving in over the northern UK. The wind-driven volume increase
- 245 in the Baltic Sea generated persistent, elevated sea levels throughout most of the Baltic Sea (Fig. 2). The FL1 simulation was initialised from the state of the ocean at midnight on 1 February. At that time, the water level at Landsort had lowered slightly but remained exceptionally high (Fig. 3).

#### 2.2.4 Case S - 4 January 2017

We constructed case S to incorporate the dynamics of a so-called silent surge event that impacted the western Baltic Sea in 2017 (She and Nielsen, 2019). The Danish Storm Council classified the silent surge as a 50-year 50-year event (i.e. 2% or less chance of occurring in a given year) along Danish coastlines, despite only moderate and far-field wind forcing that was mainly distributed over the central Baltic Sea (She and Nielsen, 2019). A key component in this development was the preconditioning, with an elevated water level in the Baltic Sea and the Kattegat, in comparison to the southwestern Baltic Sea (She and Nielsen, 2019). This much more temporary and dynamic preconditioning is blended into case S.

- Case S utilised the same atmospheric forcing and initial conditions as O, except for the period between midnight 9 November and 15:00 on 12 November, which was replaced by midnight 1 January to 15:00 on 4 January. This period was used to alter the preconditioning compared to O. Leading up to midnight 9 November, southerly to southwesterly winds had <del>pushed water</del> masses northward into piled up water in the northern Baltic Sea, generating a substantial sea-level gradient between the northern and southwestern ends. The onset of 1 January 2017 forcing started with northerly winds of around  $10 \text{ ms}^{-1}$  over the North
- Sea, southwesterly winds over the Baltic Proper and weaker, northerly winds over the northern Baltic basins. Water masses that had been piled up in the Bothnian Bay had started to move been released and the wave energy was propagating southwards. The wind turned northwest with around  $10 \text{ m s}^{-1}$  wind speeds over the Baltic and slightly higher over the North Sea. The wind field over the North Sea intensified and turned more westerly as a low-pressure system reached Norway. It tracked over the central Baltic Sea, following a southeasterly trajectory while generating northwesterly winds of around  $20 \text{ m s}^{-1}$  on its backside. At
- the forefront of the system, the southwesterly to easterly winds <u>pushed water masses piled up water</u> north and westward. North of this low-pressure system, a high-pressure system intensified. This weather pattern generated northeasterly winds of about  $20 \text{ ms}^{-1}$  over the Baltic Sea, along with northerly winds over Kattegat.

The atmospheric forcing that generated the 2017 surge continues to unfold for several hours after we switch back to the 1872 forcing (Sect. 2.2.1). In this way, the scenario captures the piling-up in the central Baltic Sea that sets the stage for the

270 2017 surge. It also captures the atmosphere's development into a persistent pressure distribution similar to 12 November 1872. From then on, we utilise the more intense and longer-lasting winds of 1872. In the observed development, relatively weaker, northeasterly winds over the Baltic Sea persisted for some hours more, thereby adding to the severity of the 2017 surge.

#### 2.3 Wind forcing amplification

In addition to the experiments detailed above, we conducted simulations of cases FL1, FL2 and O to amplify the wind forcing. These experiments aimed at illustrating whether changes in the wind forcing would generate feedback by either dampening or enhancing the influence of preconditioning in the perturbed scenarios relative to the control. We achieved this intensification of the wind forcing by increasing the wind speed by 20% (FL1, FL2 and O) or 30% (FL1 and FL2 only) in the atmospheric forcing corresponding to 13 November 1872. This period is indicated by a dotted, horizontal bar in Fig. 3.

# 2.4 Storm surge modelling

- For the storm surge simulations, we used the regional, 3D, baroclinic ocean circulation model HIROMB-BOOS Model (HBM) for the North Sea and Baltic Sea (Berg and Poulsen, 2012; Kleine, 1994; She et al., 2007). For a detailed description, see e.g. (Berg and Poulsen, 2012; Poulsen and Berg, 2012)Berg and Poulsen (2012); Poulsen and Berg (2012). HBM employs a two-way nesting scheme, allowing for the exchange of mass and momentum between the coarse and finer grids to resolve the complex flow structures of water exchange in the transition zone between the brackish Baltic Sea and the more saline North
- 285 Sea. The coarse grid domain has a spatial resolution of 5.5 km and 50-50 vertical layers. The fine-grid domains are located in the German Bight and the inner Danish waters (transition zone between the North and Baltic Sea). They have 1.9 and 0.9 km spatial resolution with 24 and 52 24 and 52 vertical layers, respectively. We used climatological river run-off data obtained

from the Hydrological Predictions for the Environment model for Europe (E-HYPE) (Donnelly et al., 2016). HBM has been used for a wide range of applications in, e.g., climate and hindcast studies (Andrée et al., 2021; Fu et al., 2012; Madsen, 2009;

290 Su et al., 2021; Tian et al., 2016), for assessing wind-driven sea-level sensitivity (Andrée et al., 2022) as well as for local marine management efforts of coastal estuaries (Murawski et al., 2021) and radioactive tracer studies (Lin et al., 2022). The present version was used for operational storm surge forecasting at the Danish Meteorological Institute DMI between 2013 and 2018.

## **3** Results

Frequency of specific durations (1-14 days) for water levels of 50-80 cm. Plot (a) is for the entire period with observation data
 (1886-2021 - results provided per year), and plots (b)-(d) are for the specific events FL2, FL1, and S, respectively (results per event). Plots (b)-(d) have a similar y-axis range. Data are from the Swedish Meteorological and Hydrological Institute (SMHI) Open data service (SMHI, 2021).

As already stated, we use case O as a reference simulation for the 1872 storm surge. The peak water levels obtained for this simulation agree with historical records within a few decimeters along the Danish coastlines but are overestimated by almost a meter at Travemünde. Overall, the results from case O confirm that the simulation is an appropriate point of departure for

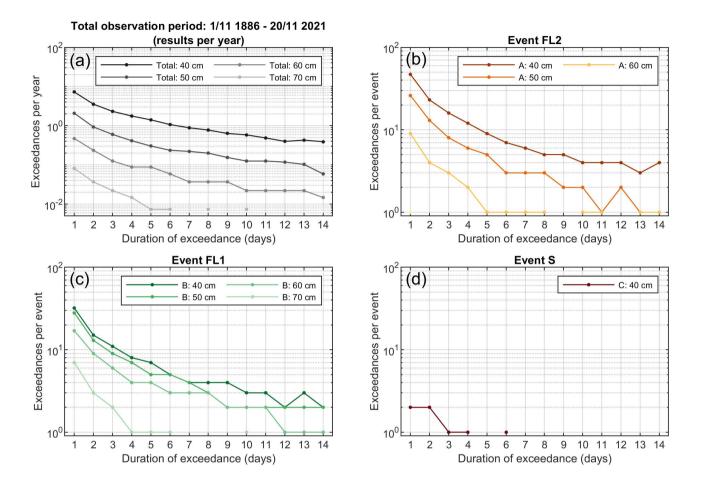
300

exploring alternative developments of the 1872 storm surge event.

Figure 2 shows the initial distribution of water masses sea-level pattern in the Baltic Sea corresponding to the 1872 storm and the three alternative scenarios. As illustrated, cases FL2 and FL1 are characterised by overall increased volumes in the Baltic Sea. In By contrast, case S is mainly characterised by a temporary piling-up of water in the Gulf of Bothnia. For both

- 305 FL2 and FL1, the filling level is consistently higher than during the 1872 storm surge (O). Conversely, S is roughly similar in magnitude to O but exhibits a somewhat different mass distributionsea-level pattern. Figure 3 shows the corresponding water levels measured at Landsort, which is often used to indicate the general Baltic Sea filling level (Feistel et al., 2008; Matthäus and Franck, 1992; Weisse and Weidemann, 2017). The Landsort water level reflects the volume of water that could potentially flow back and cause floods in the western Baltic Sea and the inner Danish seas upon release. The timestamps on Fig. 3 are
- 310 adjusted so that the development of cases FL2, FL1 and S matches that of the unperturbed event. As also shown in Fig. 2, cases FL2 and FL1 start with very high water levels at Landsort (Fig. 3) in comparison to the unperturbed event. At the end of the preconditioning period, the difference between these cases amounts to about 15 cm. This shift remains after the onset of the 1872 forcing (9 November), and they display very similar temporal patterns onward. This similarity can also be seen in case O regarding sub-daily oscillations. Cases FL2 and FL1 continued to be the highest throughout the event among the
- 315 four cases presented here. The seiche event (case S) is identical to case O until the modification of the initial conditions on 9 November. Rather than the slow processes that bring about the high filling levels in cases FL2 and FL1 (Sect. 2.2.3–2.2.2), the preconditions for case S develop rapidly in just a little over a day. Even though the forcing only differs from case O for a few days, the water level reaches 27 cm higher at Landsort due to the characteristics of this preconditioning. The 1872 event, case O, maintains a Landsort water level of around 60 cm until the sharp decrease, shared by all events, during the night between

320 12–13 November. At the time of this drop in water level, the atmospheric forcing is identical for all cases, which result in nearly identical water level reductions of 21 to 22 cm across all four cases.



**Figure 4.** Frequency of specific durations (1-14 days) for water levels of 40 to 70 cm. Plot (a) is for the entire period with observation data (1886-2021 - results provided per year), and plots (b)-(d) are for the specific events FL2, FL1, and S, respectively (results per event). Plots (b)-(d) have a similar y-axis range. Data are from the Swedish Meteorological and Hydrological Institute (SMHI) Open data service (SMHI, 2021).

Due to the connection between high water-level events in the western Baltic Sea and the associated filling level of the Baltic Sea in general (Weisse and Weidemann, 2017), we assess the entire observation period (1886-2021) and each scenario for the relationship between occurrence pattern between elevated sea levels and the their corresponding duration. For this analysis, the Landort site is used since the water level here is a good proxy of the general filling level of the Baltic Sea. Further adding to this suitability, Landsort observations available as far back as 1886 we use Landsort observations, available from the Swedish

325

13

Meteorological and Hydrological Institute (SMHI, 2021) - and dating back to 1886.

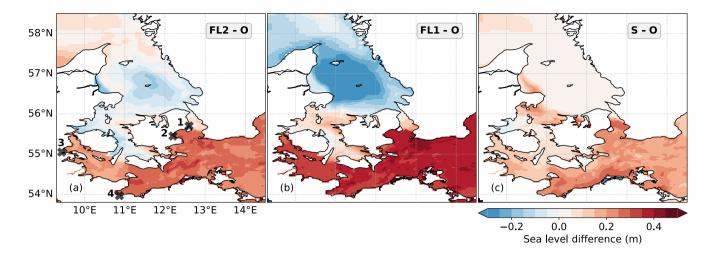


Figure 5. The effect of alternative preconditioning on the 1872 storm surge. The panels show the difference between the maximum sea level obtained with alternative preconditioning and the maximum sea level obtained with the unperturbed preconditioning (O). The magnitude of the differences are indicated by the colorbar. Panel (a) shows the locations of København (Copenhagen, the Danish eapited capital) (1), Køge (2), Aabenraa (3) and Travemünde (4).

Specifically, we here calculate the frequency in which mean water levels, in 10 cm with which certain elevated water levels occur (in 10 cm steps and aggregated to different durations of 1-14 days), occur. This aggregation is done per year.

- 330 This analysis is performed on a yearly basis for the entire time series and per event for each of the events, defined by the general curve breakpoint for the onset and ending of each event (108, 138 and 83 days for events FL2, FL1 and S, respectively). From Fig. 4 it is, for example, seen that an average. As an example, a three-day sea level of at least 60 cm + 60 cm occurs three times during FL2, and six times during FL1 and but does not occur for event S (panels b-d), (b)-(d), Fig. 4). The same water-level threshold and duration occur on average  $\frac{0.13}{0.13}$  times per year (panel a). (a), Fig. 4).
- From the empirical cumulative distribution function (not shown), we find that 99.0% of the observations occur in the -50 to 335  $50 \mathrm{\,cm}$  interval and that 1, 10 and 100 year return periods correspond to hourly water levels of approximately  $75.7 \mathrm{\,cm}$ ,  $85.5 \mathrm{\,cm}$ and 93.5 cm. Based on Fig. 4 and these return period statistics, the magnitude of water levels corresponding to FL1 and FL2 reflect relatively rare and extreme events, whereas event S is a high but not rare event. On this note, however, the one-year return period level at Landsort accounts for 81 % of the 100-year return period level, keeping in mind the close relation to the 340 general Baltic Sea filling level. Therefore, relatively high filling levels are seen at frequent intervals.

The freshwater content in the Baltic Sea means that there is a northward tilt of the sea level throughout the Baltic Sea. This characteristic results in a discrepancy between modelled values and observed relative water levels at Landsort, which is why we here choose not to reflect scenario preconditioning levels in terms of return period rates.

Figure 5 shows the effect of the different preconditioning on the resulting maximum water levels in the western Baltic Sea. 345 We subtracted the maximum values from the unperturbed case (O) from the maximums for cases FL2, FL1 and S to highlight **Table 1.** Summary of the simulated peak water levels for the different experiments (Sect. 2). The unperturbed simulation (O) numbers are given in absolute values. For the remaining scenarios, the values shown indicate the difference to the unperturbed simulation (O's values subtracted). The Landsort column represents the maximum water level after 9 November (marked with dots in Fig. 3) and is included here for comparison. The experiments FL2, FL1 and S, utilise the same atmospheric forcing as O but has different preconditioning. The scenarios denoted + 20 % are the same as the respective O, FL2 and FL1, except that the wind speed was increased by 20 % on 13 November.

	Preconditioning		Peak water level (cm)		
Name	Landsort (cm)	København	Køge	Travemünde	Aabenraa
0	71	114	252	425	385
FL2	+ 38	+ 2	+ 28	+ 27	+ 20
FL1	+ 52	+ 10	+ 36	+ 35	+ 32
S	+ 27	+ 26	+ 20	+ 21	+ 13
O + 20%	Same as O	+ 47	+ 108	+ 151	+ 158
FL2 + 20 %	Same as FL2	+ 49	+ 142	+ 181	+ 171
FL1 + 20 %	Same as FL1	+ 60	+ 153	+ 188	+ 183

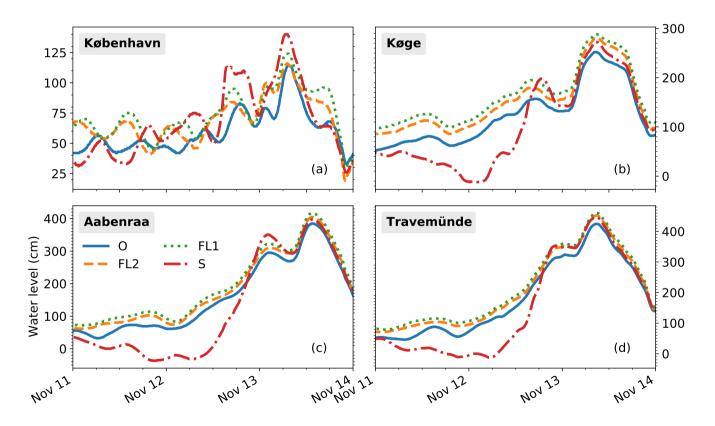
spatial differences. The sea-level tilt between the northern- and easternmost basin ends versus the southern Baltic was most pronounced in the unperturbed representation. The maximum water level at Landsort occurred as these water masses gradually were flowing the piled-up waters were released and propagated south and westwards, reducing the water level in the north and east and causing it to rise throughout the southwestern Baltic (panel (d), Fig. 2). The alternative preconditioning results in

- altered peak water levels throughout the southwestern Baltic Sea, as seen in Fig. 5. Of these, case FL2 FL1 results in the highest water levels by far. The peak water levels reach values in the general order of 0.3-0.45 m 0.3 to 0.45 m above the 1872 (case O) reference, with the largest differences seen as a piling-up south of the Swedish coastline where the water masses propagating wave encounter shallow depths. In a very narrow bay parallel to the German northeast coastline, the difference exceeds 0.5 m. In descending order, case FL2 FL1 is followed by case FL1 FL2 and case S showing corresponding residuals, relative to case
- O. FL2 results in values of 0.2 to 0.3 m and display similar spatial patterns. For case S, on the other hand, differences of 0.25 to 0.3 m are mainly confined to the northeastern German coast, eastward of the narrow passageway between Germany and Denmark (Fehmarn Belt). One interesting feature of this case is that the signal of sea-level elevation extends into the Sound, past the very shallow threshold (Darss Sill, minimum depth of 8 m) separating Denmark's biggest island from Sweden. Up to 0.3 m higher water levels occur in the region of the Danish capital and Sweden's third-biggest city. For all cases, the three
  straits of Øresund, Storebælt and Lillebælt enforce drastically reduced residual levels, and the corresponding levels in Kattegat
- even show a negative amplitude for cases FL2 and FL1, with residual levels down to approximately -0.3 m for the former latter of these.

The maximum water levels (Table 1) and temporal water level developments (Fig. 6) are shown for four different stations distributed around the western Baltic Sea (locations marked red in panel (a), Fig. 51). Referring to the O case, the timing of maximum levels occur within 1 h 40 min for København (Copenhagen), Køge and Travemünde (Table 2). In contrast, Aabenraa,

**Table 2.** Time of the peak water levels reached (see Table 1). Absolute timestamps are retrieved from the unperturbed simulation (O). For the remaining scenarios, the values shown indicate the difference in minutes compared to the unperturbed simulation (O's timestamps subtracted).

	Peak time (min)					
Name	København	Køge	Travemünde	Aabenraa		
0	Nov 13, 07:10	Nov 13, 08:10	Nov 13, 08:50	Nov 13, 13:30		
FL2	-10	10	-10	0		
FL1	-30	10	-10	-10		
S	-40	10	10	0		
O + 20 %	10	20	30	40		
FL2 + 20 %	0	30	20	30		
FL1 + 20 %	0	50	20	30		



**Figure 6.** The effect over time of alternative preconditioning for the 1872 storm surge. The panels show how the water levels develop over time for the unperturbed case (O) and the three alternative preconditioning scenarios (FL2, FL1 and S) at four different locations. Notice the differences in the y-axis scale.

located along the Jutland east coast in the westernmost part of the Baltic Sea, has a peak 6 h 20 min after København, which has the earliest of the other three peaks. The alternative preconditioning result in higher peak water levels with differences ranging between 2 to 36 cm for all locations (Table 1). For comparison, the water level at Landsort was between 27 and 52 cm higher than O across the other scenarios. Between Køge and Copenhagen, the maximum water levels differ dramatically given

- 370 the 30 km distance between them, with peak levels of 2.52 to 2.88 m for Køge and 1.14 to 1.40 m for Copenhagen (Table 1). Case FL2\_FL1 exhibits the highest value for Køge, whereas case S is the highest for Copenhagen. In addition, Køge has a longer peak duration than Copenhagen. The fact that the Copenhagen time series is measured from the northern part of the city highly influences these results, as this location is located north of the shallow sill at the southern entrance of the Sound. Therefore, these results mainly reflect inner-Copenhagen sea levels, whereas the suburbs of Copenhagen facing towards the
- 375 south are likely to experience sea levels more comparable to those for Køge. Peak water levels for Aabenraa and Travemünde vary between 4.25 to 4.60 m and 3.85 to 4.17 m respectively, with the same order of cases as for Køge, whereas the peak duration to a higher degree resembles that of Copenhagen.

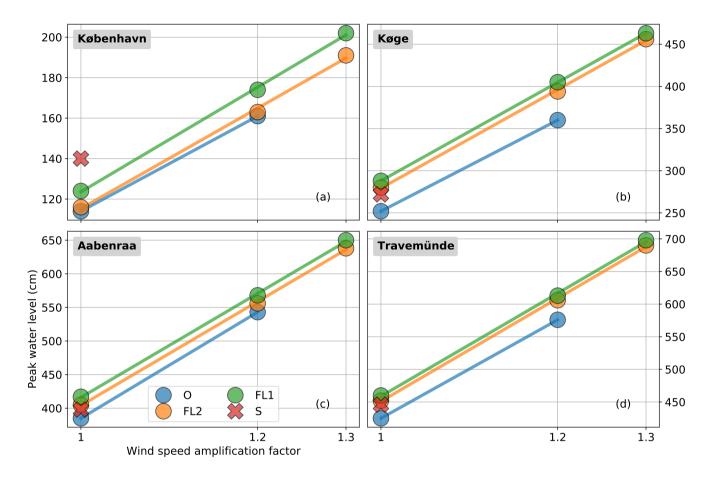
To investigate the combined effect of stronger winds and enhanced preconditioning for the 1872 event, we amplified the wind fields used to force the ocean simulations. The amplification was restricted to 13 November, and we used a fixed factor over the

- 380 entire wind field. The results from intensifying the wind speed by 20 % (cases FL2, FL1 and O) and 30 % (cases FL2 and FL1) are shown in Fig. 7. Amplification of the wind speed resulted in increased peak water levels with an almost linear response (Fig. 7), which. This finding depends strongly on the model's wind stress parameterisation and drag coefficient, which was discussed in Andrée et al. (2022) for idealized simulations with the same model. The linear response seems to indicate that, at least for the peak values, any dynamic changes to the water-mass distribution sea-level patterns induced by the enhanced wind
- are marginal. At Copenhagen, 20 % wind speed amplification resulted in 40 to 41 % (up to 0.5 m) higher water levels, and 63 to 65 % (up to almost 0.8 m) for a 30 % increase in the wind speed. Køge had a slightly higher response for 20% wind speed increase (41 to 43 %, up to 1.14 m) and lower for 3030 % (61 to 63 %, 1.76 m). Corresponding increases for Aabenraa reached 36 to 41 % (up to 1.58 m) and 56 to 58 % (2.33 m) and for Travemünde 33 to 36 % (up to 1.54 m) and 52 to 53 % (2.38 m), respectively.
- As shown in Table 2, the higher wind speeds delay the peak water levels in all cases and for all locations, while the preconditioning itself shifts the peak times both backwards and forwards in time.

# 4 Discussion

In this paper, we quantify extreme water levels that <u>could may</u> have been obtained as a consequence of the 1872 storm if the preconditioning was different. For this aim, we compared realistic model simulations of the 1872 storm surge with three alternative scenarios having more <u>favourable unfavourable</u> preconditioning, drawn from reconstructions of contemporary sea-

395 alternative so level events.



**Figure 7.** The effect of alternative preconditioning and wind speed intensification on peak water levels at four locations. The <u>sea level's</u> response to the amplified wind speed is strongly dependent on the model's wind stress parameterisation and drag coefficient, as discussed in Andrée et al. (2022) for the <u>same model</u>. The experiments O, FL2, FL1 and S with amplification factor 1 are the same as in Fig. 6. In addition, experiments O, FL2 and FL1 were run with wind speeds multiplied by a factor of 1.2 or 1.3 for FL2 and FL1 only. The lines show linear fits to the peak water levels for FL2, FL1 and S, respectively (filled circles). Note the different scales on the y-axes. See Sect. 2 for details on the respective intensification.

## 4.1 Effect of preconditioning

As shown in Table 1 and Fig. 5–6, the simulated extreme water levels for all three alternative scenarios overshoot the unperturbed values. When comparing S against FL2 and FL1, it is evident that the antecedent sea-level patterns (i.e. water mass

400

distributions) also play a key role. The latter is also clearly seen from Fig. 6 regarding the local dynamics observed at København, Køge, Travemünde and Aabenraa. Depending on the exposed site of interest, our findings further suggest that the role of the preconditioning is crucial and that the effect is site-specific.

While this study intends to generate physically plausible scenarios, the way we modify the preconditions of the 1872 simulation by chaining together different physical events is purely synthetic. One could argue whether the combinations are physically conceivable since they effectively represent unobserved events. All three of the cases FL2, FL1 and S could, however, be rele-

405

vant in a climate change context.

Firstly, experiments FL2 and FL1 comprise high filling levels in the Baltic Sea. Figure 6 shows that the developments of these events are highly similar. Due to the higher filling level (14 cm higher Landsort water level for FL1 than FL2), experiment FL1 results in higher peak water levels (Table 1). However, the difference is lower than the difference at Landsort. This discrepancy

410 implies that the differences in peak water levels due to an increased volume in the Baltic Sea are not simple linear superpositions of the historic peak water levels and the volume difference as reflected by Landsort's filling level. An increased volume in the Baltic Sea will result from anthropogenic sea-level rise. Simply adding these drivers' contributions might overestimate the future peak water levels.

Secondly, experiment S demonstrates a scenario where an extra-tropical cyclone (ETC) precedes the 1872 event, similar to

- 415 the 2017 storm surge event. Such successive events could become more common under the climate warming scenarios because of more frequent atmospheric blocking. Atmospheric blocking events are prevailing, meteorological disturbances, commonly anti-cyclonic weather patterns, that deflect the large-scale, westerly flow in the mid-latitudes (Barriopedro et al., 2006; Stendel et al., 2021; Woollings et al., 2018). Such flow-diversions can cause weather patterns to be blocked over a region, and the phenomenon is linked to various hydro-meteorological extremes (Rutgersson et al., 2021; Stendel et al., 2021). It has been
- 420 proposed that atmospheric blocking events will occur more frequently in the future with climate change, particularly in the Northern Hemisphere (Nabizadeh et al., 2019). However, the understanding is hampered by the fact that climate models tend to underestimate the frequency of events (Zappa et al., 2014), and by a lack of knowledge of the feedback processes that may arise due to potential future changes in atmospheric dynamics (Stendel et al., 2021).

We have discussed different approaches to preconditioning and their effect on extreme water levels. By comparing the 1872 and 2017 floods, it is clear that wind speed is also an essential factor. So the question arises whether the 1872 storm with altered preconditioning would constitute a "worst-case event". Two other storm events with a synoptic situation comparable to the 1872 event occurred in the 20th century. On 30–31 December 1904, the second-highest water level (1.43 m) for the period 1889-2007 was observed in Fredericia. In Travemünde (2.22 m) and Flensburg (2.33 m), high water levels were observed as well. Nine years later, on 30–31 December 1913, the highest recorded water level was recorded in Gedser. In Svendborg, water

430 was  $\frac{5-6}{5}$  to  $\frac{6}{5}$  feet, and in Flensburg 2 m above normal. These events resemble the 1872 catastrophe with strong westerlies

followed by storms from the northeast. From these events, global reanalysis-based estimates of the pressure gradients in the region are larger than in 1872. In both cases (1904 and 1913), this situation persisted for only a couple of hours. In addition, the wind was from a slightly different direction, so not much damage was caused. However, a combination of the location and track of the 1872 low with pressure gradients of, e.g., the 1904 low over a more extended period, appears synoptically entirely possible. This would result in winds approximately 30% stronger than in the 1872 case.

435

It is not clear whether such a situation would happen more frequently under climate change conditions (Stendel et al., 2021). As Scandinavian highs often occur in autumn and winter, strong lows moving eastward over northern Germany could initiate similar flooding events. With increasing temperatures, the atmosphere can bear more water vapour, so it appears possible that such a low could undergo vigorous development.

440 More speculatively, intense low-pressure systems originating from tropical cyclones have been observed over Great Britain. While this appears to have happened before (for example, the "Great storm of 1703"), from a physical perspective, such events could be expected to happen more frequently in a warmer climate. There is, however, currently no indication in model simulations that such kinds of events could will occur more frequently than in the past.

#### 4.2 Implications for risk management

- The 1872 storm surge was exceptional in both intensity and loss of lives and is by far the worst event documented in the western Baltic Sea by strong historical evidence (Hallin et al., 2021; Jacobsen et al., 2021). In this respect, the event has frequently been used as the benchmark "worst-case scenario" for coastal floods in the Baltic. However, given the results discussed above, one could argue for using even more extreme values from a physical perspective. While undoubtedly the severity of the 1872 storm was driven by high wind speeds (above  $30 \text{ m s}^{-1}$ ), we show here that the filling level of the Baltic Sea can add several
- 450 decimeters more. Given that large parts of the coastal areas in the western Baltic are low-lying this is a significant contribution. What remains is to quantify the present and future probability of such compound events. The 1872 storm surge has already been classified as a "low-probability, high impact event", so these would be even more rare events. Speculatively, extrapolating from Fig. 6 would have resulted in approximately the same flood levels as in 1872 by "swapping" 5 % on the wind speed for optimal preconditioning, which perhaps would be *more* probable than the 1872 event itself.
- 455 Compared to 1872, the geography of the Baltic Sea region has significantly changed, and the number of people, assets and societal interests located along the coasts have increased as a result of general population growth and coastal urbanisation. Most of the major coastal cities along the Baltic Sea, including the low-lying capital region of Denmark that sits within the bottleneck passageway to the North Sea, have expanded in size and now critically rely on infrastructure that requires protection from seawater. Hence, the need for robust evidence on the risks of current and future storm surges has never been higher.
- 460

As mentioned above, extreme sea level statistics based on tide gauge measurements or future projections of extreme sea levels currently generally comprise the "standard" for engineers and risk managers to cope with the accumulating climate risks due to storm surges and sea-level rise. Our research shows that a more hybrid approach, combining extreme sea level statistics with state-of-the-art climate and ocean modelling, might be needed to understand the context of these extremes better. In this way, we can better account for the uncertainties and ensure a more robust platform for decision-making on climate change 465 adaptation and disaster risk management. Such a hybrid approach could take the form displayed in this paper, where historical, well-described high water level events like the 1872 storm are revisited, and detailed numerical models are used to expand the uncertainty (e.g. by supplementing actual tide gauge measurements with perturbed model members) and to add to our physical understanding of how a combination of different factors lead to specific water levels.

## 4.3 Compound events under climate change and pre-warning system

- 470 As discussed previously, compound events, a combination of weather and climate extremes, are becoming more and more of increasingly becoming a concern for many locations as the climate warms (AghaKouchak et al., 2020; Zscheischler et al., 2018). Those investigations, however, have not shed light on today's non-extreme events. The Intergovernmental Panel on Climate Change (IPCC) has identified one of the primary climate change-related compound events as the consecutive occurrence of extreme or non-extreme events (Field et al., 2012). Climate change is altering storm surge events in our research area,
- 475 and a non-extreme sea-level event today can have enormous consequences when it is paired with a subsequent, more severe storm surge event. As demonstrated by our results, a strong storm surge event in the western Baltic Sea area might have highly diverse effects depending on the initial filling conditions. However, our earlier attention was primarily drawn to the extreme cases, leaving the more common events largely under-researched (Weisse and Weidemann, 2017). Preconditioning and storm surge duration were found to be critical in this research. Thus, the current early warning system is challenged.
- The local storm surge early warnings are a vital tool for reducing the impact of events on human activities and preventing economic loss in the face of global warming scenarios. The current storm surge warning system is based on a straightforward peak-over-threshold method, with the threshold increasing in tandem with the rise in mean sea level. The issue with the existing warning system is that it is difficult to contemplate storm surge events lasting <u>over</u> an extended period of time. As a result, non-extreme events are typically overlooked while developing an early warning system. We demon-
- 485 strated that an early warning system should in principle consider far more time than the conventional forecast method now in use (5 days). As a result, it can account for , i.e. to better account for the potential preconditioning of an extreme storm surge event. ECMWF began operational application of medium range forecasts (6-15 days) in 1979 (Bengtsson, 1985). With more than 40 years of experience, the medium-range forecast is becoming increasingly accurate, and recent advances in identifying the growing errors in the long-range forecast have contributed to enhance the operating system's predictability
- 490 (Lillo and Parsons, 2017; Matsueda and Palmer, 2018). Our findings provide guidance for future developments of early warning systems. Indeed, it is easier to provide warnings for the longer-duration volume build-up in the Baltic Sea than for the shorter piling-up duration in experiment S. Early warnings for FL experiment situations that are well-designed allow for more time for planning and execution of hazard prevention and preparation measures.

### 5 Conclusions

495 Natural hazards and extreme events are contingent on the conditions before the event itself. However, historical records from before modern-era instrumental measurements often comprise only maximum values. Even when high-resolution observational

or model products are available, it has long been the practice to assess the peak values without considering their context through the application of extreme value analysis. Perturbations of one or several of the constituents that together comprise a natural hazard allow for explorations of alternative scenarios to take the context of the hazard hazard context into account. This study

500 focused on perturbations of the preconditioning of an exceptional storm surge event in the mouth of a semi-enclosed, inland water body. The hazard is a high impact, low probability storm surge event that occurred in the western Baltic Sea in 1872. We generated alternative developments of the extreme sea level hazard for this event by substituting the initial conditions. Here, we showed that alternative conditions could have further worsened the impacts by adding several decimetres to peak water levels. We suggest that a more hybrid approach of assessing the combined drivers and their contexts could provide a more robust foundation for climate adaptation and disaster risk management.

505

Furthermore, we find that the pressure gradient of this notorious storm has been exceeded by similar pressure patterns on at least two occasions during the 20th century, although these events have been shorter lasting. When adding artificial intensification of the wind speed, our simulations yield almost linear responses of further water levels increases throughout the western Baltic Sea, highlighting the need for good assessments of wind extremes.

510

We stress that understanding and awareness of preconditioning increases the actionable information before a natural hazard. Earlier warnings allow for more time for planning and executing hazard prevention and preparation efforts.

Author contributions. EA: drafting of the manuscript and acquisition, analysis and interpretation of data. JS: acquisition of data and analysis and interpretation of data, editing of the manuscript. MADL, MS and MD: analysis and interpretation of data, editing of the manuscript. KM, MD and MADL: project supervision. All authors contributed to the manuscript and approved the submitted version.

515 Competing interests. The authors declare that they have no conflict of interest.

Acknowledgements. The work reported in this paper is part of a greater shared effort between the Technical University of Denmark (DTU) and the Danish Meteorological Institute (DMI) with the aim of investigating the processes that lead to extreme storm surges through meticulous numerical atmospheric-oceanic modelling. Part of the funding was provided by the Danish State through the Danish Climate Atlas. A portion of the work was carried out within the "Extreme events in the coastal zone – a multidisciplinary approach for better preparedness" project, hosted by Uppsala University and funded by Swedish Research Council Formas.

520

## References

- AghaKouchak, A., Chiang, F., Huning, L. S., Love, C. A., Mallakpour, I., Mazdiyasni, O., Moftakhari, H., Papalexiou, S. M., Ragno, E., and Sadegh, M.: Climate extremes and compound hazards in a warming world, Annual Review of Earth and Planetary Sciences, 48, 519–548, 2020.
- 525 Alexandersson, H., Schmith, T., Iden, K., and Tuomenvirta, H.: Long-term variations of the storm climate over NW Europe, The Global atmosphere and ocean system, 6, 97–120, 1998.
  - Andrée, E., Su, J., Larsen, M. A. D., Madsen, K. S., and Drews, M.: Simulating major storm surge events in a complex coastal region, Ocean Modelling, p. 101802, 2021.
  - Andrée, E., Drews, M., Su, J., Larsen, M. A. D., Drønen, N., and Madsen, K. S.: Simulating wind-driven extreme sea levels: Sensitivity to
- 530 wind speed and direction, Weather and Climate Extremes, 36, 100 422, https://doi.org/https://doi.org/10.1016/j.wace.2022.100422, 2022.
  Arns, A., Wahl, T., Wolff, C., Vafeidis, A. T., Haigh, I. D., Woodworth, P., Niehüser, S., and Jensen, J.: Non-linear interaction modulates global extreme sea levels, coastal flood exposure, and impacts, Nature communications, 11, 1–9, 2020.
  - Baensch, O.: Die Sturmfluth an den Ostsee-Küsten des Preussischen Staates vom 12./13. November 1872, Zeitschrift für Bauwesen, Berlin, 1875.
- 535 Barriopedro, D., García-Herrera, R., Lupo, A. R., and Hernández, E.: A climatology of Northern Hemisphere blocking, Journal of Climate, 19, 1042–1063, 2006.

Bengtsson, L.: Medium-range forecasting at the ECMWF, in: Advances in Geophysics, vol. 28, pp. 3–54, Elsevier, 1985.

Berg, P. and Poulsen, J. W.: Implementation details for HBM, in: DMI Technical Report 12-11, p. 147, DMI Copenhagen, 2012.

- Bevacqua, E., Maraun, D., Vousdoukas, M. I., Voukouvalas, E., Vrac, M., Mentaschi, L., and Widmann, M.: Higher probability of compound flooding from precipitation and storm surge in Europe under anthropogenic climate change, Science Advances, 5, eaaw5531, https://doi.org/10.1126/sciadv.aaw5531, 2019.
  - Bischiniotis, K., van den Hurk, B., Jongman, B., Coughlan de Perez, E., Veldkamp, T., de Moel, H., and Aerts, J.: The influence of antecedent conditions on flood risk in sub-Saharan Africa, Natural Hazards and Earth System Sciences, 18, 271–285, https://doi.org/10.5194/nhess-18-271-2018, 2018.
- 545 Bradstock, R. A., Cohn, J. S., Gill, A. M., Bedward, M., and Lucas, C.: Prediction of the probability of large fires in the Sydney region of south-eastern Australia using fire weather, International Journal of Wildland Fire, 18, 932–943, https://doi.org/10.1071/WF08133, 2009.
  - Brown, S., Nicholls, R. J., Goodwin, P., Haigh, I., Lincke, D., Vafeidis, A., and Hinkel, J.: Quantifying land and people exposed to sea-level rise with no mitigation and 1.5°C and 2.0°C rise in global temperatures to year 2300, Earth's Future, 6, 583–600, 2018.

Buchanan, M. K., Oppenheimer, M., and Kopp, R. E.: Amplification of flood frequencies with local sea level rise and emerging flood regimes,

550 Environmental Research Letters, 12, 064 009, https://doi.org/10.1088/1748-9326/aa6cb3, 2017.

- Bureau Veritas: 44. Jahrgang (1872) Registre international de classification de navires, in: Deutsches Schiffahrtsmuseum Bremerhaven, vol. 44, Bureau Veritas, http://www.digishelf.de/piresolver?id=54962810X, iSSN: 11380883, 1872.
  - Calafat, F. M. and Marcos, M.: Probabilistic reanalysis of storm surge extremes in Europe, Proceedings of the National Academy of Sciences, 117, 1877–1883, https://doi.org/10.1073/pnas.1913049117, 2020.
- 555 Clemmensen, L. B., Bendixen, M., Hede, M. U., Kroon, A., Nielsen, L., and Murray, A. S.: Morphological records of storm floods exemplified by the impact of the 1872 Baltic storm on a sandy spit system in south-eastern Denmark, Earth Surface Processes and Landforms, 39, 499–508, https://doi.org/https://doi.org/10.1002/esp.3466, 2014.

Colding, A.: Nogle Undersøgelser over Stormen over Nord- og Mellem-Europa af 12'te - 14'de November 1872, Bianco Lunos Kgl. Hof-Bogtrykkeri, https://doi.org/10.48563/dtu-0000041, 1881.

- 560 Coles, S., Bawa, J., Trenner, L., and Dorazio, P.: An introduction to statistical modeling of extreme values, vol. 208, Springer, 2001. Commission, E., Centre, J. R., Gazzard, R., Müller, M., Sciunnach, R., Pecl, J., Konstantinov, V., Sbirnea, R., Cruz, M., Chassagne, F., Nugent, C., Benchikha, A., Kok, E., Gonschorek, A., Mharzi Alaoui, H., Maianti, P., Timovska, M., Zaken, A., Repšienė, S., Ascoli, D., Botnen, D., Leray, T., Libertà, G., Moffat, A., San-Miguel-Ayanz, J., Leisavnieks, E., Mitri, G., Pezzatti, B., Ruuska, R., Kaliger, A., Stoof, C., Fonzo, M., Beyeler, S., Oom, D., Eritsov, A., Maren, A., Pešut, I., Papageorgiou, K., Sandahl, L., Pfeiffer, H., Fresu, G., Debreceni, P.,
- 565 Longauerová, V., Sydorenko, S., Glazko, Z., Branco, A., Marzoli, M., Theodoridou, C., De Rigo, D., JaunkIkis, Z., Ferrari, D., Durrant, T., Micillo, G., Piwnicki, J., Humer, F., Vivancos, T., Joannelle, P., Szczygieł, R., Pereira, T., Moreira, J., Vacik, H., Assali, F., Lopez-Santalla, A., Dursun, K., Petkoviček, S., Baltaci, U., Nuijten, D., Nagy, D., Jakša, J., Conedera, M., Abbas, M., Toumasis, I., Boca, R., and Mara, S.: Forest fires in Europe, Middle East and North Africa 2018, Publications Office, https://doi.org/doi/10.2760/561734, 2019.
- Compo, G. P., Whitaker, J. S., Sardeshmukh, P. D., Matsui, N., Allan, R. J., Yin, X., Gleason, B. E., Vose, R. S., Rutledge, G., Bessemoulin,
  P., et al.: The twentieth century reanalysis project, Quarterly Journal of the Royal Meteorological Society, 137, 1–28, 2011.
  - Couasnon, A., Eilander, D., Muis, S., Veldkamp, T. I., Haigh, I. D., Wahl, T., Winsemius, H. C., and Ward, P. J.: Measuring compound flood potential from river discharge and storm surge extremes at the global scale, Natural Hazards and Earth System Sciences, 20, 489–504, 2020.
- Dangendorf, S., Frederikse, T., Chafik, L., Klinck, J. M., Ezer, T., and Hamlington, B. D.: Data-driven reconstruction reveals large-scale
   ocean circulation control on coastal sea level, Nature Climate Change, 11, 514–520, https://doi.org/10.1038/s41558-021-01046-1, 2021.
- Donnelly, C., Andersson, J. C., and Arheimer, B.: Using flow signatures and catchment similarities to evaluate the E-HYPE multi-basin model across Europe, Hydrological Sciences Journal, 61, 255–273, https://doi.org/10.1080/02626667.2015.1027710, 2016.
- Feistel, R., Seifert, T., Feistel, S., Nausch, G., Bogdanska, B., Broman, B., Hansen, L., Holfort, J., Mohrholz, V., Schmager, G., Hagen, E., Perlet, I., and Wasmund, N.: Digital Supplement, chap. 20, pp. 625–667, John Wiley & Sons, Ltd, https://doi.org/https://doi.org/10.1002/9780470283134.ch20, 2008.
  - Feuchter, D., Jörg, C., Rosenhagen, G., Auchmann, R., Romppainen-Martius, O., and Brönnimann, S.: The 1872 Baltic Sea storm surge, 2013.
  - Field, C. B., Barros, V., and Stocker, T. F.: Managing the risks of extreme events and disasters to advance climate change adaptation. Special report of the Intergovernmental Panel on Climate Change (IPCC), https://www.ipcc.ch/report/managing-the-risks-of-extreme-events-and-disasters-to-advance-climate-change-adaptation, 2012.
  - Frederikse, T., Landerer, F., Caron, L., Adhikari, S., Parkes, D., Humphrey, V. W., Dangendorf, S., Hogarth, P., Zanna, L., Cheng, L., and Wu, Y.-H.: The causes of sea-level rise since 1900, Nature, 584, 393–397, https://doi.org/10.1038/s41586-020-2591-3, 2020.

585

- Fu, W., She, J., and Dobrynin, M.: A 20-year reanalysis experiment in the Baltic Sea using three-dimensional variational (3DVAR) method, Ocean Science, 8, 827–844, https://doi.org/10.5194/os-8-827-2012, 2012.
- 590 Hallegatte, S., Green, C., Nicholls, R. J., and Corfee-Morlot, J.: Future flood losses in major coastal cities, Nature climate change, 3, 802, 2013.
  - Hallin, C., Hofstede, J. L., Martinez, G., Jensen, J., Baron, N., Heimann, T., Kroon, A., Arns, A., Almström, B., Sørensen, P., et al.: A Comparative Study of the Effects of the 1872 Storm and Coastal Flood Risk Management in Denmark, Germany, and Sweden, Water, 13, 1697, 2021.

- 595 Harjanne, A., Haavisto, R., Tuomenvirta, H., and Gregow, H.: Risk management perspective for climate service development Results from a study on Finnish organizations, Advances in Science and Research, 14, 293–304, https://doi.org/10.5194/asr-14-293-2017, 2017.
  - Hendry, A., Haigh, I. D., Nicholls, R. J., Winter, H., Neal, R., Wahl, T., Joly-Laugel, A., and Darby, S. E.: Assessing the characteristics and drivers of compound flooding events around the UK coast, Hydrology and Earth System Sciences, 23, 3117–3139, https://doi.org/10.5194/hess-23-3117-2019, 2019.
- 600 Hilker, N., Badoux, A., and Hegg, C.: The Swiss flood and landslide damage database 1972–2007, Natural Hazards and Earth System Sciences, 9, 913–925, https://doi.org/10.5194/nhess-9-913-2009, 2009.
  - Jacobsen, T., Sørensen, C., Woge Nielsen, J., and Su, J.: Historical extreme high water levels along the coastline of Denmark, DMI Report 21-28, Danish Meteorological Institute; Danish Coastal Authority, 2021.
- Johnson, F., White, C. J., van Dijk, A., Ekstrom, M., Evans, J. P., Jakob, D., Kiem, A. S., Leonard, M., Rouillard, A., and Westra, S.: Natural
   hazards in Australia: floods, Climatic Change, 139, 21–35, https://doi.org/10.1007/s10584-016-1689-y, 2016.
  - Jönsson, B., Döös, K., Nycander, J., and Lundberg, P.: Standing waves in the Gulf of Finland and their relationship to the basin-wide Baltic seiches, Journal of Geophysical Research: Oceans, 113, https://doi.org/https://doi.org/10.1029/2006JC003862, 2008.
    - Kiecksee, H., Thran, P., and Kruhl, H.: Die Ostsee-Sturmflut 1872: Heinz Kiecksee ; mit einem Beitrag von P. Thran und H. Kruhl, Schriften des Deutschen Schiffahrtsmuseums, Westholsteinische Verlagsanstalt Boyens, 1972.
- 610 Kleine, E.: Das operationelle Modell des BSH f
  ür Nordsee und Ostsee: Konzeption und 
  Übersicht, Bundesamt f
  ür Seeschiffahrt und Hydrographie, 1994.
  - Lavaud, L., Bertin, X., Martins, K., Arnaud, G., and Bouin, M.-N.: The contribution of short-wave breaking to storm surges: The case Klaus in the Southern Bay of Biscay, Ocean Modelling, 156, 101710, 2020.

Leppäranta, M. and Myrberg, K.: Physical oceanography of the Baltic Sea, Springer Science & Business Media, 2009.

- 615 Lillo, S. P. and Parsons, D. B.: Investigating the dynamics of error growth in ECMWF medium-range forecast busts, Quarterly Journal of the Royal Meteorological Society, 143, 1211–1226, 2017.
  - Lin, M., Qiao, J., Hou, X., Steier, P., Golser, R., Schmidt, M., Dellwig, O., Hansson, M., Örjan Bäck, Vartti, V.-P., Stedmon, C., She, J., Murawski, J., Aldahan, A., and Schmied, S. A.: Anthropogenic 236U and 233U in the Baltic Sea: Distributions, source terms, and budgets, Water Research, 210, 117987, https://doi.org/https://doi.org/10.1016/j.watres.2021.117987, 2022.
- 620 Lisitzin, E.: Seiches, in: Sea-Level Changes, Elsevier Oceanography Series, chap. 7, pp. 185–196, Elsevier, https://doi.org/https://doi.org/10.1016/S0422-9894(08)70781-5, 1974.
  - Madsen, K. S.: Recent and future climatic changes in temperture, salinity, and sea level of the the North Sea and the Baltic Sea, Ph.D. thesis, University of Copenhagen, 2009.
  - Marcos, M., Calafat, F. M., Berihuete, Á., and Dangendorf, S.: Long-term variations in global sea level extremes, Journal of Geophysical
- 625 Research: Oceans, 120, 8115–8134, 2015.
- Masson-Delmotte, V., Zhai, P., Pirani, A., Connors, S. L., Péan, C., Berger, S., Caud, N., Chen, Y., Goldfarb, L., Gomis, M. I., Huang, M., Leitzell, K., Lonnoy, E., Matthews, J., Maycock, T. K., Waterfield, T. O. Yelekçi, R. Y., and Zhou, B., eds.: Climate Change 2021: The Physical Science Basis. Contribution of Working Group I to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change, chap. Summary for Policymakers, Cambridge University Press, 2021.
- 630 Matsueda, M. and Palmer, T.: Estimates of flow-dependent predictability of wintertime Euro-Atlantic weather regimes in medium-range forecasts, Quarterly Journal of the Royal Meteorological Society, 144, 1012–1027, 2018.

Matthäus, W. and Franck, H.: Characteristics of major Baltic inflows – a statistical analysis, Continental Shelf Research, 12, 1375–1400, 1992.

McMillan, S. K., Wilson, H. F., Tague, C. L., Hanes, D. M., Inamdar, S., Karwan, D. L., Loecke, T., Morrison, J., Murphy, S. F., and

- Vidon, P.: Before the storm: antecedent conditions as regulators of hydrologic and biogeochemical response to extreme climate events,
   Biogeochemistry, 141, 487–501, https://doi.org/10.1007/s10533-018-0482-6, 2018.
  - Modrakowski, L.-C., Su, J., and Nielsen, A. B.: The Precautionary Principles of the Potential Risks of Compound Events in Danish Municipalities, Frontiers in Climate, 3, https://doi.org/10.3389/fclim.2021.772629, 2022.
- Mudersbach, C. and Jensen, J.: Küstenschutz an der Deutschen Ostseeküste, Zur Ermittlung von Eintrittswahrscheinlichkeiten extremer 640 Sturmflutwasserstände. Korrespondenz Wasserwirtschaft, 3, 136–144, 2010.
  - Murawski, J., She, J., Mohn, C., Frishfelds, V., and Nielsen, J. W.: Ocean Circulation Model Applications for the Estuary-Coastal-Open Sea Continuum, Frontiers in Marine Science, 8, 515, 2021.
    - Nabizadeh, E., Hassanzadeh, P., Yang, D., and Barnes, E. A.: Size of the Atmospheric Blocking Events: Scaling Law and Response to Climate Change, Geophysical Research Letters, 46, 13488–13499, https://doi.org/https://doi.org/10.1029/2019GL084863, 2019.
- 645 Oppenheimer, M., Glavovic, B., Hinkel, J., Roderik, v., Magnan, A., Abd-Elgawad, A., Rongshu, C., Miguel, C.-J., Robert, D., Ghosh, T., Hay, J., Ben, M., Meyssignac, B., Sebesvari, Z., A.J., S., Dangendorf, S., and Frederikse, T.: IPCC Special Report on the Ocean and Cryosphere in a Changing Climate, chap. Sea Level Rise and Implications for Low Lying Islands, Coasts and Communities, pp. 321 – 445, The Intergovernmental Panel on Climate Change, 2019.

Petersen, M. and Rohde, H.: Sturmflut: die grossen Fluten an den Küsten Schleswig-Holsteins und in der Elbe, Wachholtz, 1977.

- 650 Poulsen, J. W. and Berg, P.: More details on HBM-general modelling theory and survey of recent studies, Tech. rep., Danish Meteorological Institute, 2012.
  - Pugh, D. T.: Tides, surges and mean sea level, John Wiley and Sons Inc., New York, NY, 1987.
  - Raymond, C., Horton, R. M., Zscheischler, J., Martius, O., AghaKouchak, A., Balch, J., Bowen, S. G., Camargo, S. J., Hess, J., Kornhuber, K., et al.: Understanding and managing connected extreme events, Nature climate change, 10, 611–621, 2020.
- Ridal, M., Olsson, E., Unden, P., Zimmermann, K., and Ohlsson, A.: Uncertainties in Ensembles of Regional Re-Analyses-Deliverable D2.
   7 HARMONIE reanalysis report of results and dataset, Tech. rep., Swedish Meteorological and Hydrological Institute, available online: http://www.uerra.eu/publications/deliverable-reports.html (accessed on 30 June 2021)., 2017.
  - Rosenhagen, G. and Bork, I.: Rekonstruktion der Sturmflutwetterlage vom 13. November 1872, Reconstruction of the storm-surge weather situation of November 13, 1872, 2009.
- 660 Rutgersson, A., Kjellström, E., Haapala, J., Stendel, M., Danilovich, I., Drews, M., Jylhä, K., Kujala, P., Guo Larsén, X., Halsnæs, K., et al.: Natural hazards and extreme events in the Baltic Sea region, Earth System Dynamics Discussions, pp. 1–80, 2021.

Samuelsson, M. and Stigebrandt, A.: Main characteristics of the long-term sea level variability in the Baltic Sea, Tellus a, 48, 672–683, 1996.
Santos, V. M., Casas-Prat, M., Poschlod, B., Ragno, E., Van Den Hurk, B., Hao, Z., Kalmár, T., Zhu, L., and Najafi, H.: Statistical modelling and climate variability of compound surge and precipitation events in a managed water system: a case study in the Netherlands, Hydrology and Earth System Sciences, 25, 3595–3615, 2021.

665

She, J. and Nielsen, J. W.: 'Silent' storm surge extremes in the western Baltic Sea on 4 January 2017, Journal of Operational Oceanography, 12, S111-+, 2019.

She, J., Berg, P., and Berg, J.: Bathymetry impacts on water exchange modelling through the Danish Straits, Journal of marine systems, 65, 450–459, 2007.

- 670 Slivinski, L. C., Compo, G. P., Whitaker, J. S., Sardeshmukh, P. D., Giese, B. S., McColl, C., Allan, R., Yin, X., Vose, R., Titchner, H., et al.: Towards a more reliable historical reanalysis: Improvements for version 3 of the Twentieth Century Reanalysis system, Quarterly Journal of the Royal Meteorological Society, 145, 2876–2908, 2019.
  - SMHI: SMHI Open Data: The national archive for oceanographic data [dataset], https://www.smhi.se/data/oceanografi/ ladda-ner-oceanografiska-observationer#param=sealevelrh2000,stations=all,stationid=207, 2021.
- 675 Soomere, T. and Pindsoo, K.: Spatial variability in the trends in extreme storm surges and weekly-scale high water levels in the eastern Baltic Sea, Continental Shelf Research, 115, 53–64, 2016.
  - Stendel, M., Francis, J., White, R., Williams, P. D., and Woollings, T.: Chapter 15 The jet stream and climate change, Climate Change, pp. 327–357, https://doi.org/10.1016/B978-0-12-821575-3.00015-3, 2021.
- Su, J., Andrée, E., Nielsen, J. W., Olsen, S. M., and Madsen, K. S.: Sea Level Projections From IPCC Special Report on the Ocean and
   Cryosphere Call for a New Climate Adaptation Strategy in the Skagerrak-Kattegat Seas, Frontiers in Marine Science, 8, 471, 2021.
  - Thorarinsdottir, T. L., Guttorp, P., Drews, M., Kaspersen, P. S., and de Bruin, K.: Sea level adaptation decisions under uncertainty, Water Resources Research, 53, 8147–8163, https://doi.org/10.1002/2016WR020354, 2017.
    - Tian, T., Su, J., Boberg, F., Yang, S., and Schmith, T.: Estimating uncertainty caused by ocean heat transport to the North Sea: experiments downscaling EC-Earth, Climate Dynamics, 46, 99–110, https://doi.org/10.1007/s00382-015-2571-8, 2016.
- 685 Travis, W. R. and Bates, B.: What is climate risk management?, Climate Risk Management, 1, 1–4, https://doi.org/https://doi.org/10.1016/j.crm.2014.02.003, 2014.
  - Vafeidis, A. T., Schuerch, M., Wolff, C., Spencer, T., Merkens, J. L., Hinkel, J., Lincke, D., Brown, S., and Nicholls, R. J.: Water-level attenuation in global-scale assessments of exposure to coastal flooding: a sensitivity analysis, Natural Hazards and Earth System Sciences, 19, 973–984, https://doi.org/10.5194/nhess-19-973-2019, 2019.
- 690 Vogel, J., Paton, E., Aich, V., and Bronstert, A.: Increasing compound warm spells and droughts in the Mediterranean Basin, Weather and Climate Extremes, 32, 100312, https://doi.org/10.1016/j.wace.2021.100312, 2021.
  - Vousdoukas, M. I., Voukouvalas, E., Mentaschi, L., Dottori, F., Giardino, A., Bouziotas, D., Bianchi, A., Salamon, P., and Feyen, L.: Developments in large-scale coastal flood hazard mapping, Natural Hazards and Earth System Sciences, 16, 1841–1853, 2016.
  - Vousdoukas, M. I., Mentaschi, L., Hinkel, J., Ward, P. J., Mongelli, I., Ciscar, J.-C., and Feyen, L.: Economic motivation for raising coastal flood defenses in Europe, Nature Communications, 11, 1–11, 2020.

695

- Wahl, T., Haigh, I. D., Nicholls, R. J., Arns, A., Dangendorf, S., Hinkel, J., and Slangen, A. B. A.: Understanding extreme sea levels for broad-scale coastal impact and adaptation analysis, Nature Communications, 8, 16075–, https://doi.org/10.1038/ncomms16075, 2017.
- Weisse, R. and Weidemann, H.: Baltic Sea extreme sea levels 1948-2011: Contributions from atmospheric forcing, Procedia IUTAM, 25, 65 – 69, https://doi.org/https://doi.org/10.1016/j.piutam.2017.09.010, 2017.
- 700 Weisse, R., Dailidienė, I., Hünicke, B., Kahma, K., Madsen, K., Omstedt, A., Parnell, K., Schöne, T., Soomere, T., Zhang, W., et al.: Sea level dynamics and coastal erosion in the Baltic Sea region, Earth System Dynamics, 12, 871–898, 2021.
  - Wolski, T., Wiśniewski, B., Giza, A., Kowalewska-Kalkowska, H., Boman, H., Grabbi-Kaiv, S., Hammarklint, T., Holfort, J., and Žydrune Lydeikaitė: Extreme sea levels at selected stations on the Baltic Sea coast, Oceanologia, 56, 259–290, https://doi.org/https://doi.org/10.5697/oc.56-2.259, 2014.
- 705 Woodworth, P. L., Melet, A., Marcos, M., Ray, R. D., Wöppelmann, G., Sasaki, Y. N., Cirano, M., Hibbert, A., Huthnance, J. M., Monserrat, S., et al.: Forcing factors affecting sea level changes at the coast, Surveys in Geophysics, 40, 1351–1397, 2019.

- Woollings, T., Barriopedro, D., Methven, J., Son, S.-W., Martius, O., Harvey, B., Sillmann, J., Lupo, A. R., and Seneviratne, S.: Blocking and its response to climate change, Current climate change reports, 4, 287–300, 2018.
  Workbar, C. and Krawes, W., The two dimensional exists a state Sen. Openeologies Acta 2, 425, 446, 1070.
- Wubber, C. and Krauss, W.: The two dimensional seiches of the Baltic Sea, Oceanologica Acta, 2, 435–446, 1979.
- 710 Zappa, G., Masato, G., Shaffrey, L., Woollings, T., and Hodges, K.: Linking Northern Hemisphere blocking and storm track biases in the CMIP5 climate models, Geophysical Research Letters, 41, 135–139, 2014.
  - Zscheischler, J., Westra, S., Van Den Hurk, B. J., Seneviratne, S. I., Ward, P. J., Pitman, A., AghaKouchak, A., Bresch, D. N., Leonard, M., Wahl, T., et al.: Future climate risk from compound events, Nature Climate Change, 8, 469–477, 2018.