



ESD Ideas: Translating historical extreme weather events into a warmer world

Ed Hawkins¹, Gilbert P. Compo^{2,3} and Prashant D. Sardeshmukh²

5 ¹ National Centre for Atmospheric Science, Department of Meteorology, University of Reading, Reading, UK

² Cooperative Institute for Research in Environmental Sciences, University of Colorado at Boulder, Boulder, USA

³ NOAA Physical Sciences Laboratory, Boulder, USA

Correspondence to: Ed Hawkins (ed.hawkins@ncas.ac.uk)

Abstract. A new reanalysis-based approach is proposed to examine how extreme weather events differ in a warmer or cooler counter-factual world. This approach offers a novel way to develop plausible storylines for some types of extreme event that other methods may not be suitable for. As a proof-of-concept, a reanalysis of a severe windstorm that occurred in February 1903 is translated into a warmer world where it produces higher wind speeds and increased rainfall, suggesting that this storm would be more damaging if it occurred today rather than 120 years ago.

Whenever a severe weather event occurs and causes harmful impacts to a particular region, one question that is asked by disaster responders, recovery planners, politicians and journalists is whether climate change has caused or affected the event. The cause of the harmful impacts is the unusual weather, but climate change may have made the weather event more likely, more severe, or potentially both. In those cases, the harmful impacts may be partly or even mostly due to the change in climate. In some cases, the worst consequences may be due to the vulnerability or exposure of those living in the region, or a combination of many different factors (e.g. Otto et al., 2022).

Many methodologies exist to understand how climate change has affected extreme events. These are broadly categorized into risk-based approaches and storyline approaches (Stott and Christidis, 2023). The risk-based approaches examine the change in likelihood and magnitude of a particular class of event (e.g. Stott et al., 2004), whereas storyline approaches consider how climate change may have affected a specific event (Trenberth et al., 2015; Shepherd et al., 2018). Other studies consider the related question of what a plausible worst-case event might look like in a particular climate (e.g. Thompson et al., 2017). Some of these methods are now regularly used to provide attribution statements soon after events occur (van Oldenborgh et al., 2021).

Event storyline approaches attempt to quantify how an extreme event would be different in an altered climate. This can be achieved by producing reconstructions of the event as it occurred and in a counter-factual cooler or warmer climate to compare the consequences. Various approaches exist for such analyses, including statistical methods (e.g. Cattiaux et al., 2010), nudging a climate model (e.g. van Garderen et al., 2021; Sánchez-Benítez et al., 2022) and forecast-based (e.g. Wehner et al., 2019; Leach et al., 2021). Here, we propose a complementary reanalysis-based approach to developing event storylines using a proof-



of-concept analysis of a severe extra-tropical windstorm; this type of extreme event has not been examined using other methods.

Specifically, we use the NOAA-CIRES-DOE 20th Century Reanalysis v3 system (20CRv3; Slivinski et al., 2021) which
35 assimilates surface pressure observations into a NOAA weather forecast model to reconstruct the atmospheric circulation from
1806-2015 at 0.7° resolution using 80 ensemble members. Boundary conditions of SSTs and sea ice concentration are
prescribed in 20CRv3, and so counter-factual versions of extreme events can be generated by perturbing the SST boundary
conditions and assimilating the same pressure observations. By using 20CRv3 no other perturbations are required, unlike if
this approach used a reanalysis that assimilated other types of observation. In the experiments described here, sea ice and
40 atmospheric greenhouse gas concentrations remain fixed, and the SST perturbation is spatially uniform. A ‘spin-up’ period
needs to be run prior to the extreme event to ensure that the atmosphere has adjusted to the counter-factual SSTs; in this
example a period of 6 months was used. Sensitivity experiments are planned to explore all these issues.

A proof-of-concept experiment has applied this approach to a severe extra-tropical windstorm known as Storm Ulysses, which
occurred in February 1903, to examine how the consequences of this historical event may have been different had it occurred
45 in a warmer world. Three versions of the reanalysis are considered: (1) the original 20CRv3, (2) an improved version of
20CRv3 with added historical surface pressure observations and a small change to the data assimilation scheme (Hawkins et
al. 2022), and (3) same as (2), but with a uniform +2K perturbation added to the sea surface temperature (SST) boundary
conditions and assimilating the same surface pressure observations. This perturbation plausibly translates the reanalysis of
Storm Ulysses into a warmer world.

50 Storm Ulysses is not well represented in the original 20CRv3, but the improved reanalysis shows a far more intense storm,
mainly from adding new rescued pressure observations; it is a credible reconstruction of one of the most extreme windstorms
to occur over the British & Irish Isles in the past 120 years (Hawkins et al., 2022). Figure 1 (top row) shows the wet-bulb
potential temperature at 850 hPa for one specific time during the storm for the different experiments. The storm in the improved
reanalysis has a hook-shaped Shapiro-Keyser-type structure which is not present in the original 20CRv3. As expected, the
55 storm structure in the warmer world experiment looks similar to the improved reanalysis except for a roughly 2.5K offset.
Specific humidity and surface air temperatures are also higher (not shown).

The warmer world version of the storm generates stronger maximum winds (middle row) and increased rainfall (bottom row)
compared to the improved reanalysis, suggesting that the consequences of the same surface circulation pattern would be more
severe in a warmer world. Although the increase in wind footprint appears small over land (around 1 m/s in some places), this
60 implies a significant increase in damage (>10%; roughly related to the cube of the wind speed; Klawa and Ulbrich, 2003). The
total rainfall over land during the storm increases by 26%, i.e. around 10%/K when using the temperature change at 850 hPa



to normalise the rainfall change, which is larger than might be expected due to the Clausius-Clapeyron relationship alone. An animation of the storm is included as a Supplementary Figure.

These proof-of-concept experiments have demonstrated the potential of using a surface pressure based reanalysis to explore heavily-constrained storylines which examine the thermodynamic and local dynamical changes in extreme weather events such as windstorms and potentially heavy rainfall events. Downscaling these simulations would also be possible to provide additional smaller-scale details. This approach does not currently consider any large-scale dynamical component to the changes. The analysis presented highlights how historical (and modern) weather events could be translated into warmer climates to consider plausible ‘worst-case’ events. This approach also offers the opportunity to attribute changes in observed weather events to human influence by translating modern events into cooler worlds. The 20CRv3 reanalysis currently ends in 2015 but could be extended to run in near-real-time to examine extreme events soon after they occur.

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Data availability

Data available from: <https://github.com/ed-hawkins/ulysses-storm-data>

Author contribution

Ed Hawkins: Investigation, Formal Analysis, Writing – Original Draft, Conceptualization

Gilbert Compo: Conceptualization, Writing – Review & Editing, Resources

Prashant Sardeshmukh: Conceptualization, Writing – Review & Editing

Competing interests

None



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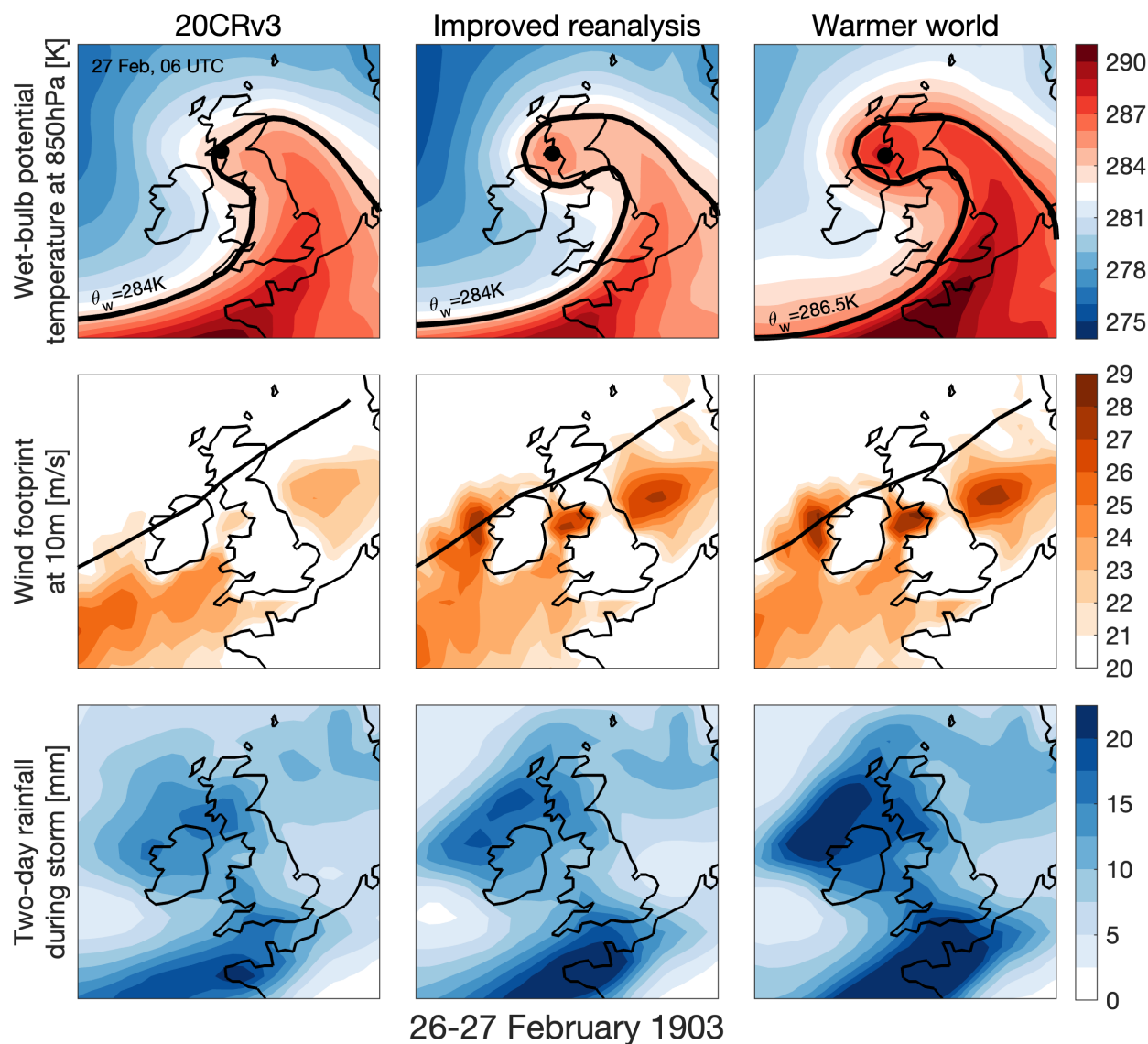
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Storm Ulysses



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Figure 1: Translating Storm Ulysses into a warmer world. The columns represent the original 20th Century Reanalysis v3 (20CRv3; left), the improved reanalysis (middle) and the warmer world simulation (right). The wet-bulb potential temperature (θ_w) at 850 hPa at 06 UTC on 27th February 1903 (top row) shows the synoptic structure of the storm as it passes over the UK & Ireland. 20CRv3 does not accurately represent the intensity of the storm, but this is corrected in the improved reanalysis, mainly due to adding additional observations (Hawkins et al. 2022). The warmer world simulation shows a very similar atmospheric structure to the improved reanalysis and is warmer by about 2.5K at 850 hPa. The thick lines indicate particular isotherms as labelled and the black dot represents the centre of the storm. The wind footprint (middle row; maximum ensemble mean wind speed at 10m during the storm) shows stronger peak wind speeds in the improved reanalysis than 20CRv3, which are stronger again in a warmer world. The track of Storm Ulysses is shown with the thick black line. The rainfall during the two days of the storm increases in a warmer world (bottom row). Supplementary Figure 1 is an animated version of this figure which shows the 850 hPa wet-bulb potential temperature, wind speed (with sea level pressure) and rainfall rate, every 3-hours during the storm for the three experiments.