



# A Methodology for the Spatiotemporal Identification of Compound Hazards (SI-CH)

Wind and Precipitation Extremes in Great Britain (1979–2019)





Aloïs Tilloy<sup>1,3</sup>, Bruce D. Malamud<sup>1</sup>, Amélie Joly-Laugel<sup>2</sup>

<sup>1</sup>Department of Geography, King's College London, London WC2B 4BG, United Kingdom

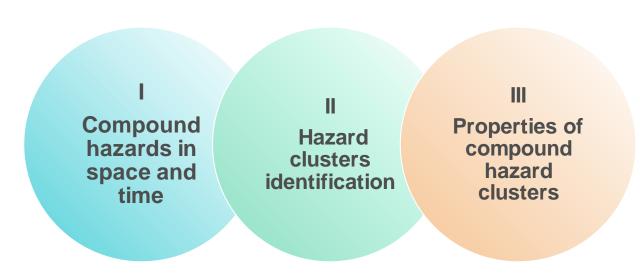
<sup>2</sup>EDF Energy R&D UK Centre, Croydon CR0 2AJ, United Kingdom

<sup>3</sup>European Commission, Joint Research Centre, Ispra, Italy

### Spatial and temporal scales of compound events

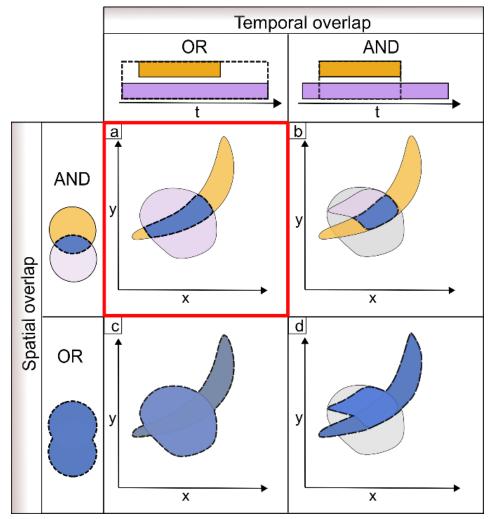
- Compound natural hazards can operate on different spatial and temporal scales than their component single hazards.
- Two key compound hazard questions:
  - How do we define and characterize compound hazards in time and space?
  - What are appropriate methods to quantify spatiotemporal attributes of compound hazards?

- Here we illustrate a methodology for the spatial-temporal identification of compound hazards (SI-CH) applied to wind and precipitation extremes in Great Britain (1979–2019).
- Approach aimed to be applicable to different natural hazards interrelations.



### Spatial and temporal scales of compound events

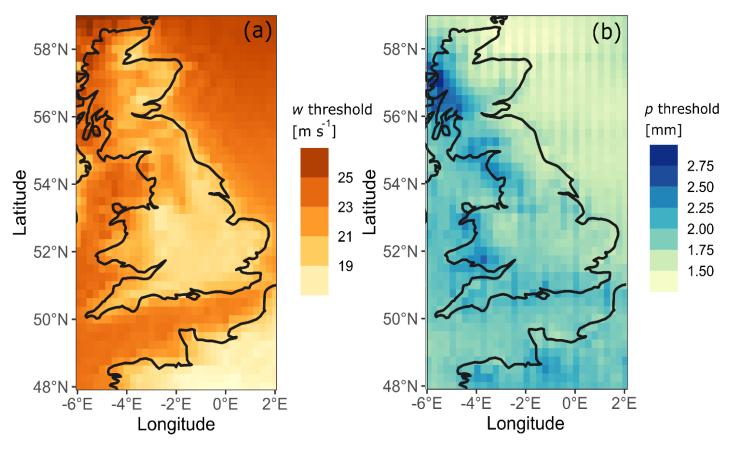
- Hazard clusters: a cluster in space and time representing the footprint of a singular phenomenon.
- Compound extremes: two or more associated extreme events occurring the same time and place.
- Spatiotemporal footprint of compound hazards: Area impacted by two(or more) hazards during the aggregated duration of a event (AND-OR).



Different spatial and temporal scales considered to define compound hazard events. Each case representing a combination of spatial and temporal overall.

#### Extremes sampling

- Hourly wind and precipitation data from ERA5 (1979–2019).
- We consider for each hour:
  - Hourly maximum wind gusts (average 3 s of wind)
  - Precipitation (total rainfall and snow).
- For each we take the 99<sup>th</sup>
   percentile computed on each
   grid cell of the domain (1485
   cells).
- Compound hazard clusters: co-occurrences of extreme wind and extreme rainfall clusters.

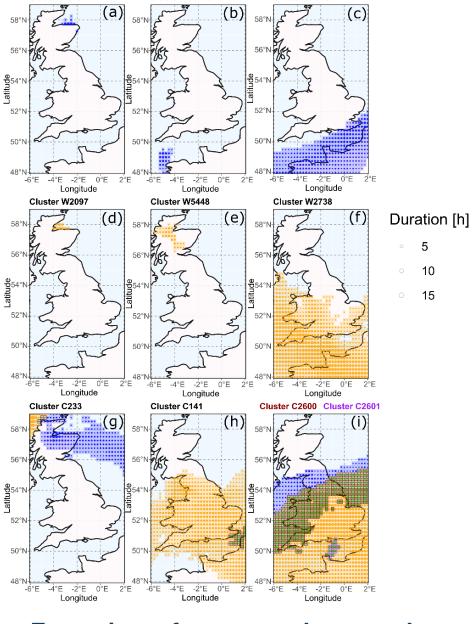


Threshold values corresponding to  $99^{th}$  percentile of each grid cell, 1979-2019, for hourly maximum wind gust (w) and hourly rainfall accumulation (r).

#### Cluster identification

- Extremes are point objects with coordinates in space (latitude and longitude) and time (date)
- Clustering algorithm: Density Based Spatial
   Clustering of Applications with Noise (DBSCAN)
- Extremes are clustered in time and space
- Each cluster has attributes

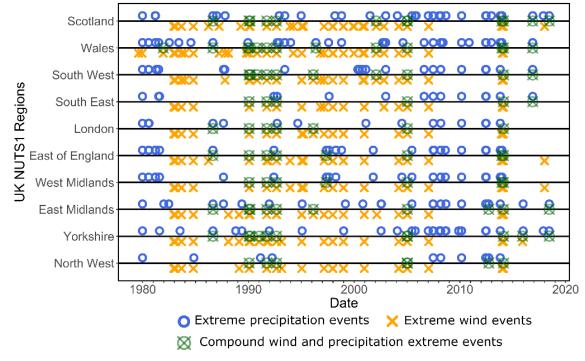
	Attribute	Wind	Precipitation	Compound wind-precipitation
		clusters	clusters	clusters
Intensity	$p_a$ (mm)		✓	✓
	$w_g \text{ (m s}^{-1})$	✓		✓
Scales	Footprint (%)	✓	✓	✓
	Duration (h)	✓	✓	✓
Historical	Start time (h)	✓	✓	✓
	End time (h)	✓	✓	✓
	Location (cells	✓	✓	✓
	involved)			



Footprints of ten example natural hazard clusters over Great Britain.

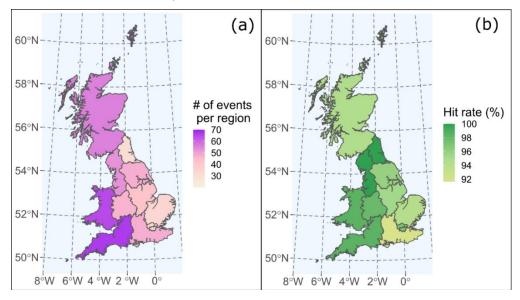
### Confrontation with significant events

We create "Great Britain Significant
Weather Events Catalogue 1979–2019"
consisting of 157 significant Great
Britain weather events between January
1979 and September 2019.



Timeline of 157 events in the Great Britain Significant Weather Events Catalogue 1979– 2019

- Also created "Database of 4555 compound hazard clusters for Great Britain (1979-2019)".
- Hit rate (# of events with corresponding clusters / total # of events) used to assess the capacity of our "Spatiotemporal Identification of Compound Hazards" (SI-CH) methodology.
- Over Great Britain, hit rate = 93.4%.



Map of Great Britain divided into 11 NUTS1 regions showing: (a) the number of events per region, (b) for each region, the hit rate

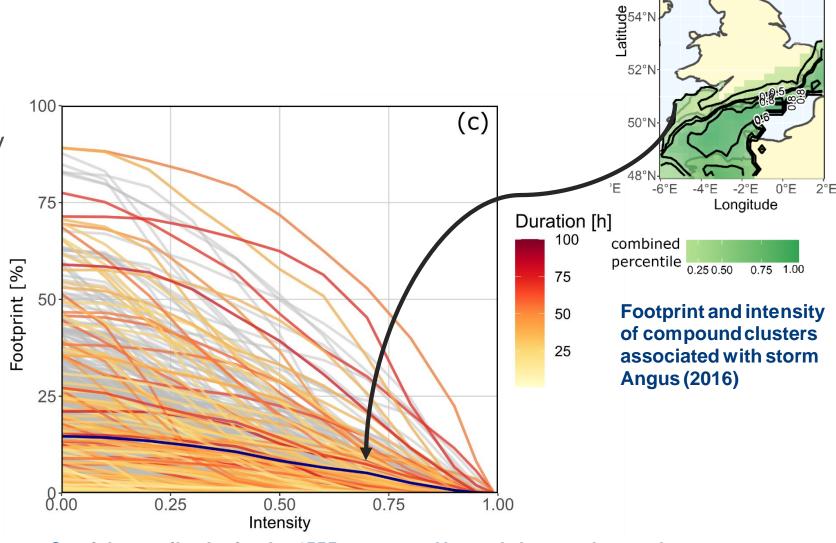
## Properties of compound hazard clusters

 Combined intensity of compound hazards

minimum cumulative probability

$$P(x_i, y_i) = \min[\frac{R_{x,i}}{N_x + 1}, \frac{R_{y,i}}{N_y + 1})$$

- Spatial scale, temporal scale, intensity
- Most intense compound hazard clusters linked to a significant weather event
- >1 cluster per event



(c)

## Thank you

alois.tilloy@ec.europa.eu

#### **Resources:**

Tilloy, A., Malamud, B. D., & Joly-Laugel, A. (2022). A Methodology for the Spatiotemporal Identification of Compound Hazards: Wind and Precipitation Extremes in Great Britain (1979–2019). *Earth System Dynamics* (In Press).

- ERA5 Hazard Clusters Database for Great Britain 1979–2019 (Wind, Precipitation, Compound hazards).
- Great Britain Significant Weather Events Catalogue 1979–2019.

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Research a

#### A methodology for the spatiotemporal identification of compound hazards: wind and precipitation extremes in Great Britain (1979–2019)

Alois Tilloy. <sup>1,2</sup>, Bruce D. Malamud<sup>1</sup>, and Amélie Joly-Laugel<sup>3</sup>

<sup>1</sup>Department of Geography, King's College London, London WC2B 4BG, United Kingdom

<sup>2</sup>European Commission, Joint Research Centre, Ispra, Italy

<sup>2</sup>EDF Energy R & D UK Centre, Croydon CRO 2AJ, United Kingdom

Correspondence: Alots Tilloy (alois tilloy@ec.europa.eu)

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Abstract Compound hazards refer to two or more different natural hazards occurring over the same tin period and spatial area. Compound hazards can operate on different spatial and temporal scales than their component single hazards. This article proposes a definition of compound hazards in space and time, presents a methodology for the spatio-temporal identification of compound hazards (SI-CH), and compiles two compound-hazard-related open-access databases for extreme precipitation and wind in Great Britain over a 40-year period. The SI-CH methodology is applied to hourly precipitation and wind gust values for 1979-2019 from climate reanalysis (ERA5) within a region including Great Britain and the British Channel. Extreme values (above the 99 % quantile) of precipitation and wind gust are clustered with the Density-Based Spatial Clustering of Appli-cations with Noise (DBSCAN) algorithm, creating clusters for precipitation and wind gusts. Compound hazard clusters that correspond to the spatial overlap of single hazard clusters during the aggregated duration of the two hazards are then identified. We compile these clusters into a detailed and comprehensive ERA5 Hazard Clusters Database 1979-2019 (given in the Supplement), which consists of 18 086 precipitation clusters, 6190 wind clusters, and 4555 compound hazard clusters for 1979-2019 in Great Britain. The methodology's ability to identify extreme precipitation and wind events is assessed with a catalogue of 157 significant events (96 extreme precin-itation and 61 extreme wind events) in Great Britain over the period 1979-2019 (also given in the Supplement). We find good agreement between the SI-CH outputs and the catalogue with an overall hit rate (ratio between the number of joint events and the total number of events) of 93.7 %. The spatial variation of hazard intensity within wind, precipitation, and compound hazard clusters is then visualised and analysed. The study finds that the SI-CH approach (given as R code in the Supplement) can accurately identify single and compound hazard events and represent spatial and temporal properties of these events. We find that compound wind and precip-itation extremes, despite occurring on smaller scales than single extremes, can occur on large scales in Great Britain with a decre spatial scale when the combined intensity of the hazards increases.

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