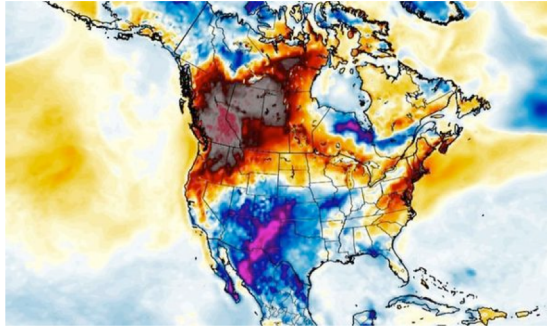


Attribution of extreme events to climate change

Aglaé Jézéquel, LMD

Recent extreme weather events – part of the natural variability...



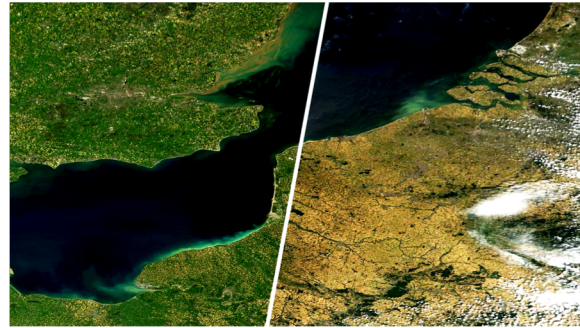
Canadian heatwave - June 2021



German flood - July 2021

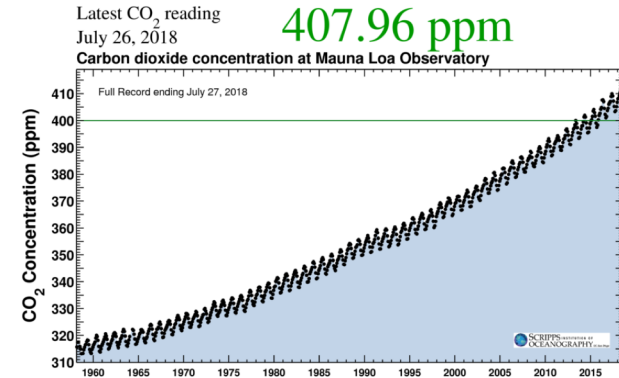
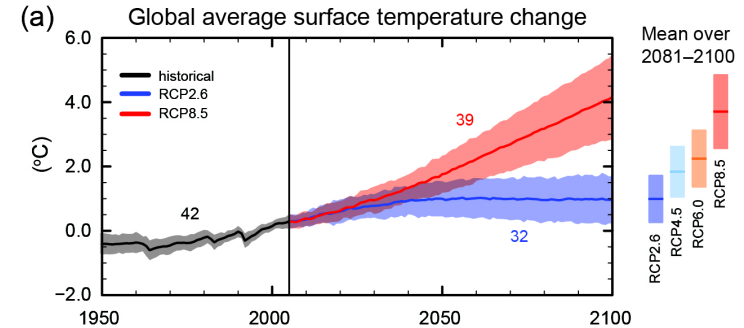
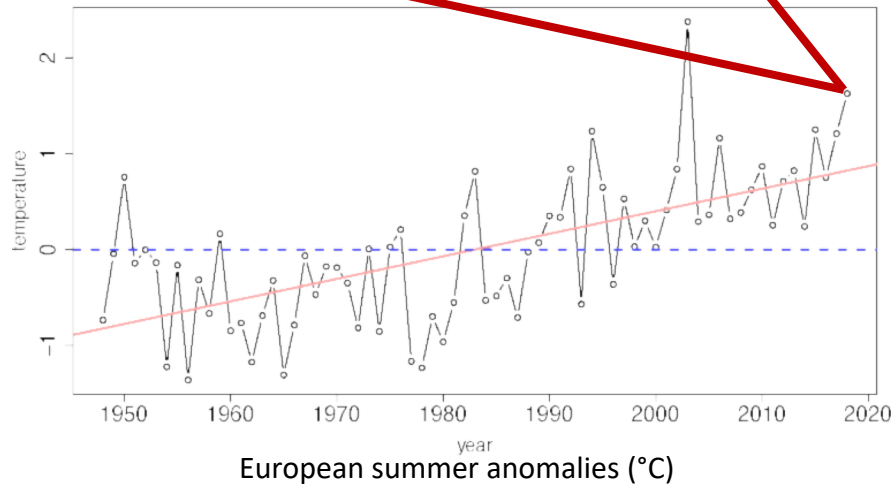
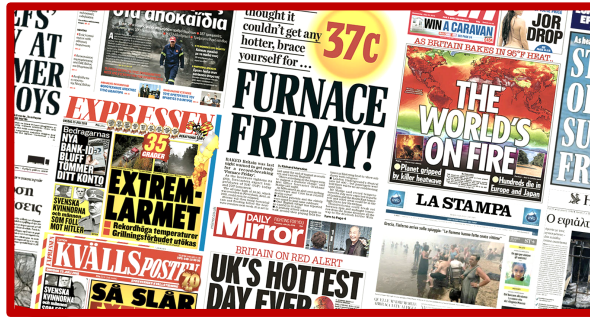


Australian bushfires – 2019-2020

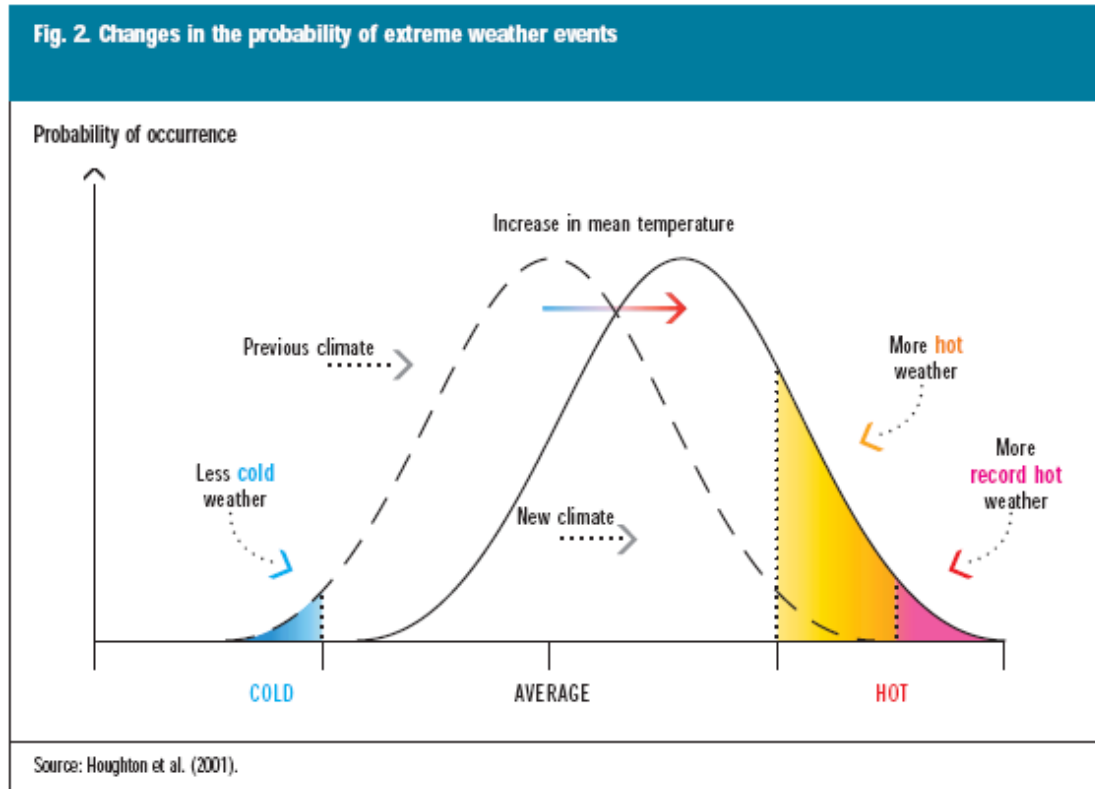


French drought - May vs July 2018

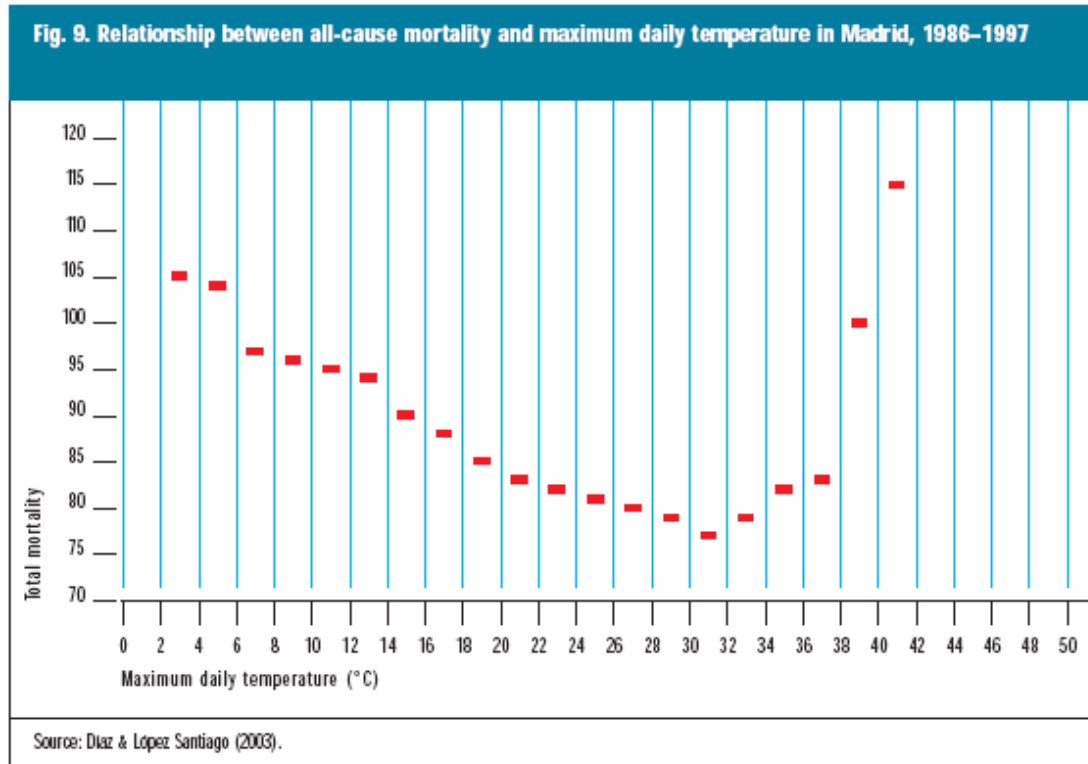
... in a changing climate



First effect of a change: small changes in mean can lead to « large » effects in extremes



A small shift in the extremes can lead to large impacts

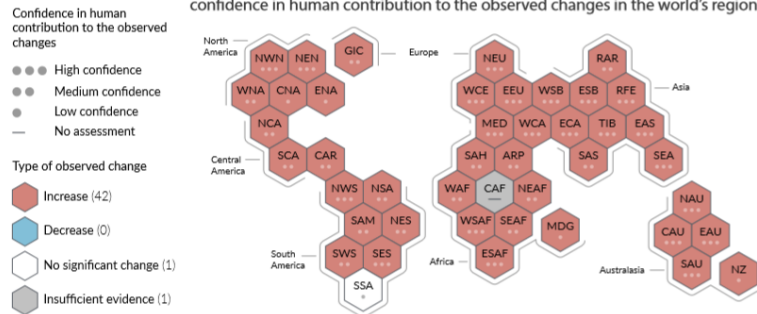


WHO, 2005

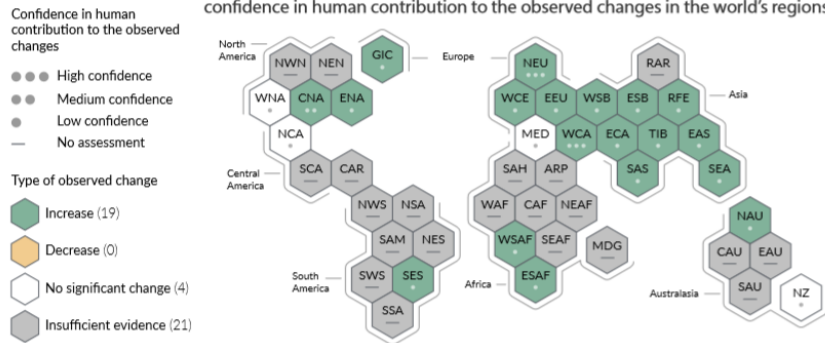
Mortality vs temperature in Madrid

Climate change is already affecting every region across the globe with human influence contributing to many observed changes in weather and climate extremes

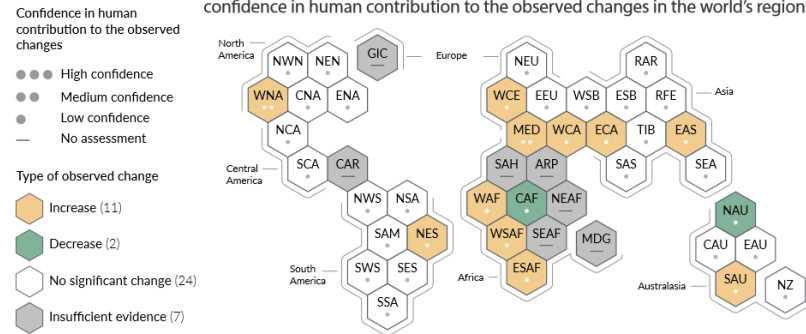
a) Synthesis of assessment of observed change in **hot extremes** and confidence in human contribution to the observed changes in the world's regions



b) Synthesis of assessment of observed change in **heavy precipitation** and confidence in human contribution to the observed changes in the world's regions

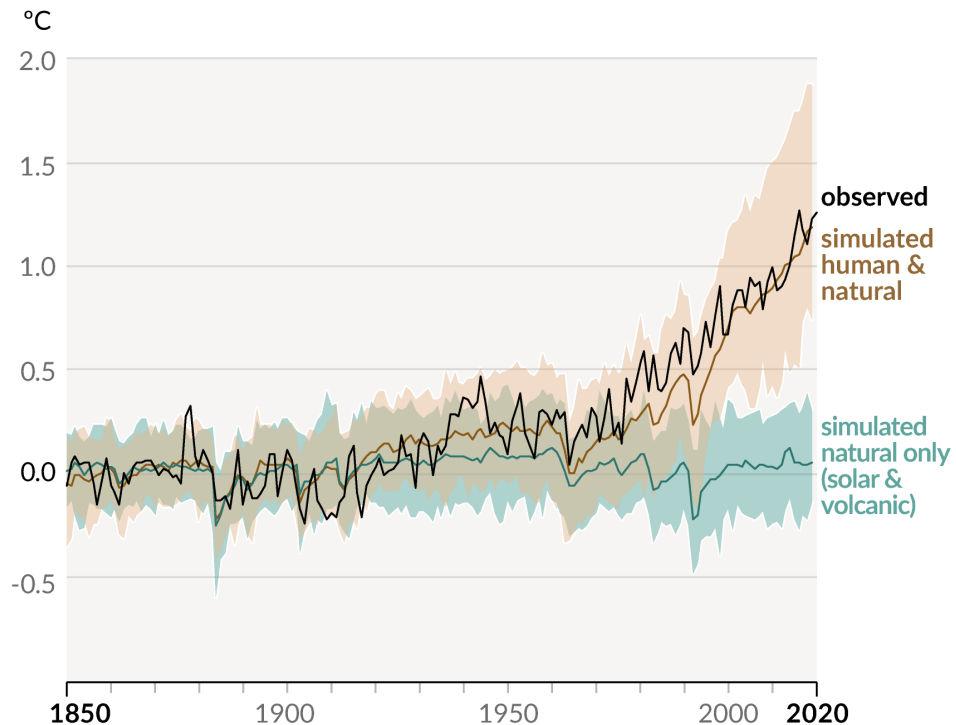


c) Synthesis of assessment of observed change in **agricultural drought** and confidence in human contribution to the observed changes in the world's regions



Global temperature change attribution

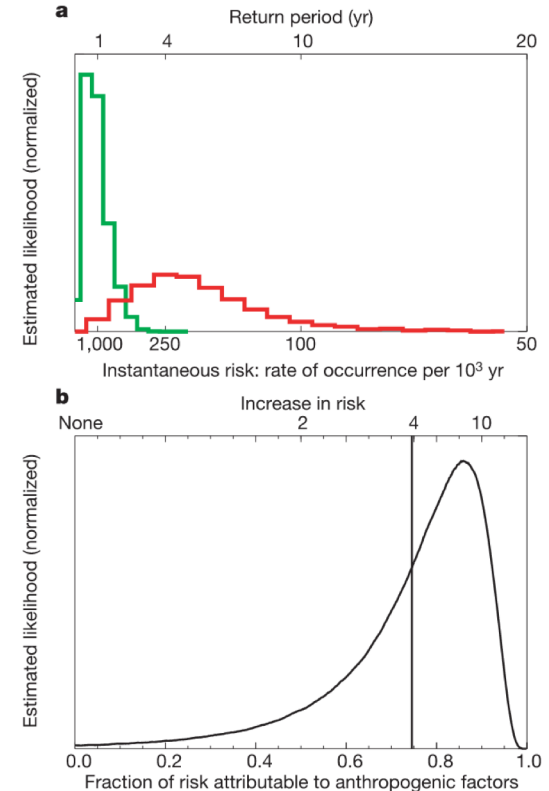
b) Change in global surface temperature (annual average) as **observed** and simulated using **human & natural** and **only natural** factors (both 1850-2020)



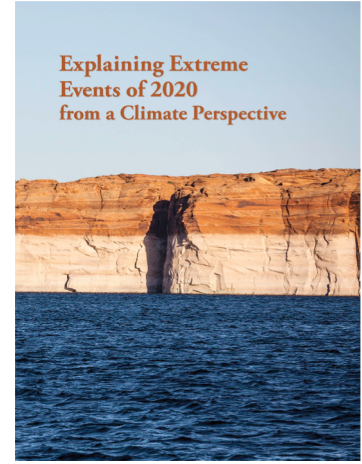
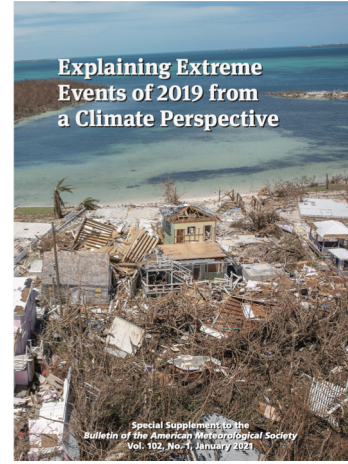
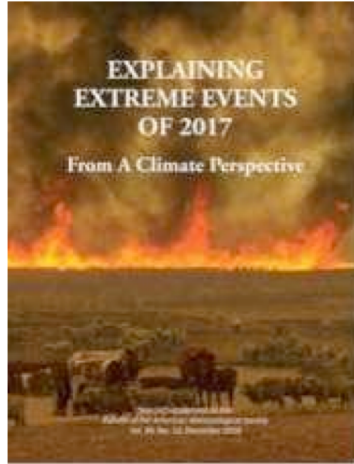
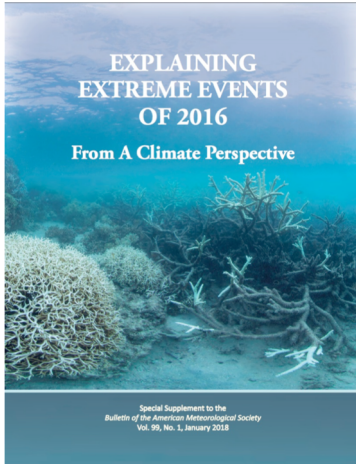
What is extreme event
attribution?

Beginnings of EEA

- “Will it ever be possible to sue anyone for damaging the climate?” *Allen (2003) Nature*
- First EEA of summer 2003 European heatwave -> Change in risk of mean European summer temperatures exceeding the 1.6 K threshold. *Stott et al (2004)*



A booming field



Framing Extreme Event Attribution

Was **this event** **influenced by** **climate change** ?

1) **How does one define the event to study ?**

Choice of the event, of the region, of the duration. Definition of the class of events.

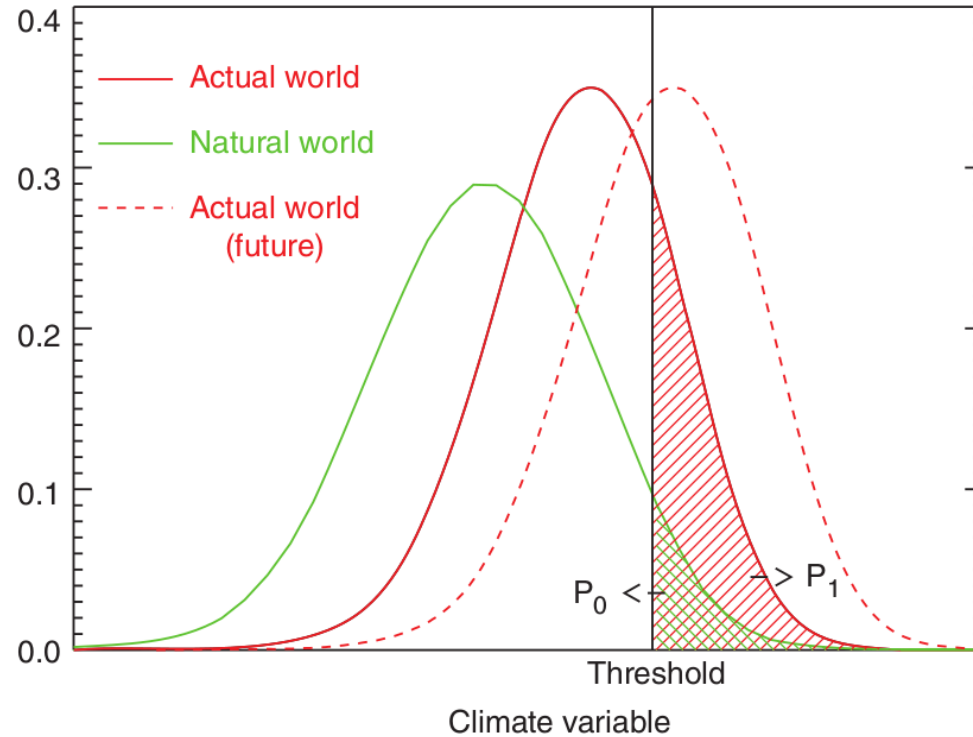
2) **What does one mean by “influenced by” ?**

Choice of the level of conditioning

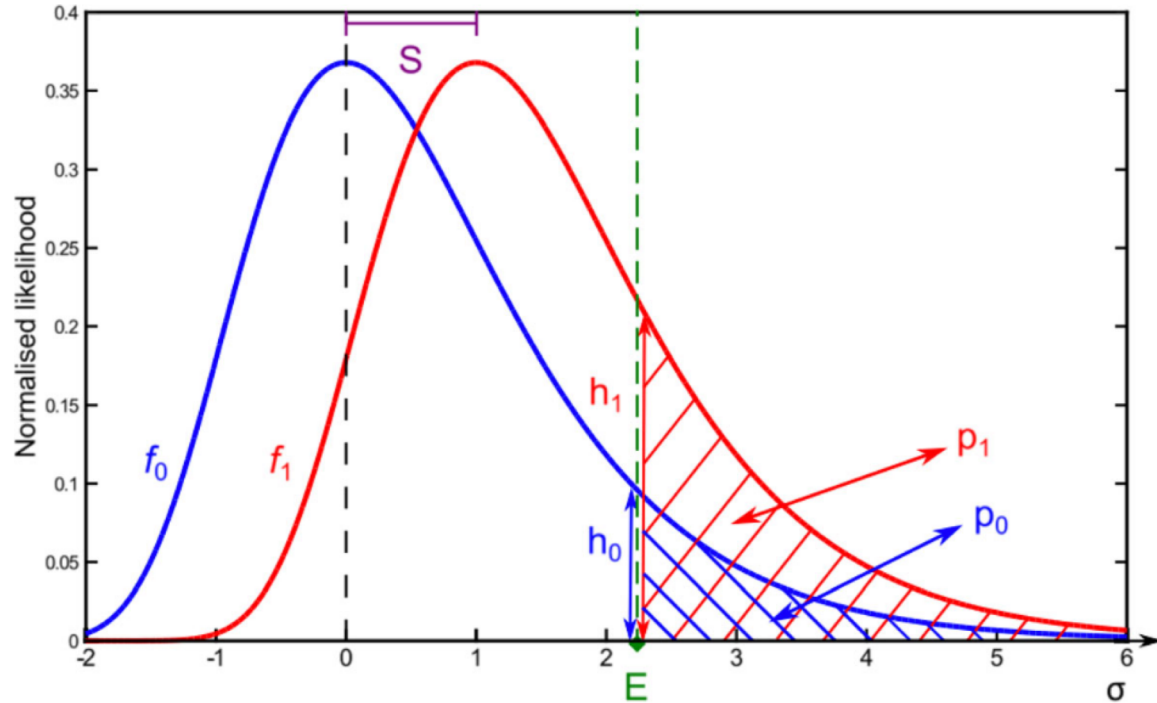
3) **How does one represent climate change ?**

Choice of the natural world

General approach



Event definition matters

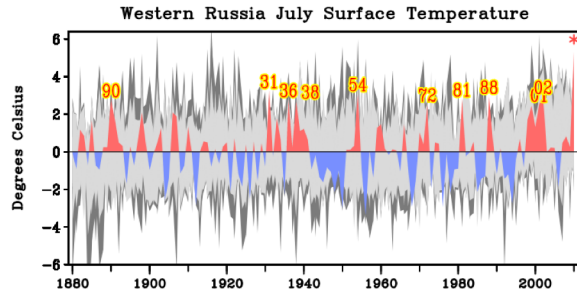


-> more about event definition tomorrow

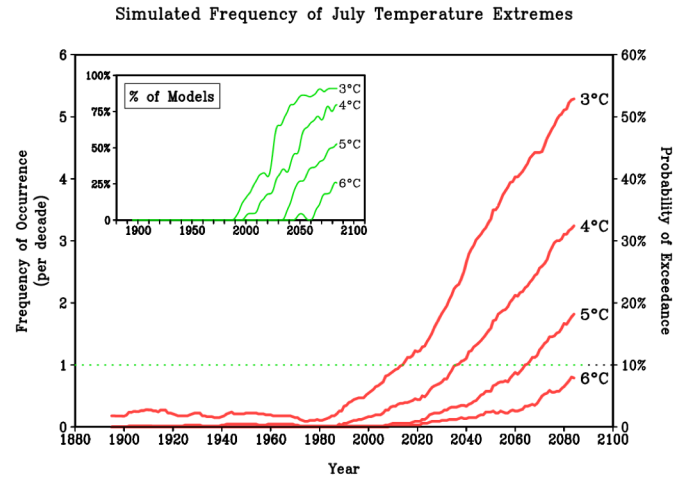
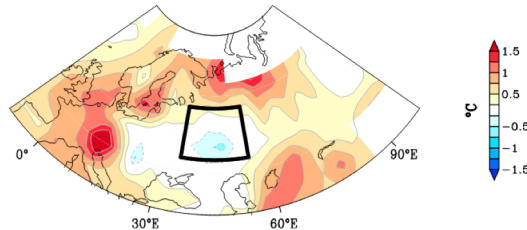
Harrington 2019

Framing matters

“it is very unlikely that warming attributable to increasing greenhouse gas concentrations contributed substantially to the **magnitude** of this heat wave”



Surface Temp Trend: 1880–2009



Dole et al (2011)

Framing matters

“ For July temperature in Moscow, we estimate that the local warming trend has increased the number of records expected in the past decade fivefold, which implies an approximate 80% **probability** that the 2010 July heat record would not have occurred without climate warming.”

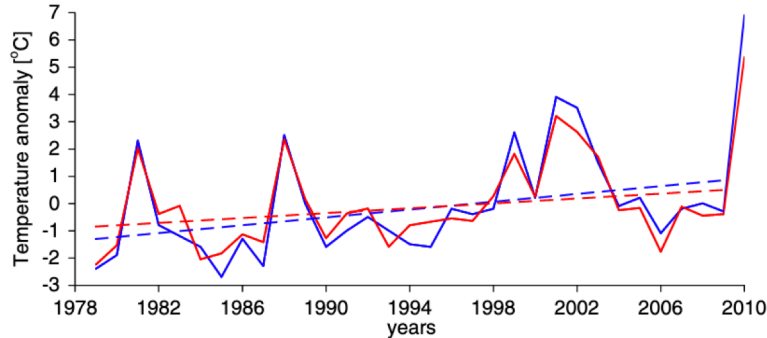


Fig. 5. Comparison of temperature anomalies from remote sensing systems surface data (red; ref. 15) over the Moscow region (35°E–40°E, 54°N–58°N) versus Moscow station data (blue; ref. 21). The solid lines show the average July value for each year, whereas the dashed lines show the linear trend of these data for 1979–2009 (i.e., excluding the record 2010 value). The satellite data have a trend of 0.45 °C per decade for 1979–2009, as compared to 0.72 °C per decade for the Moscow station data.

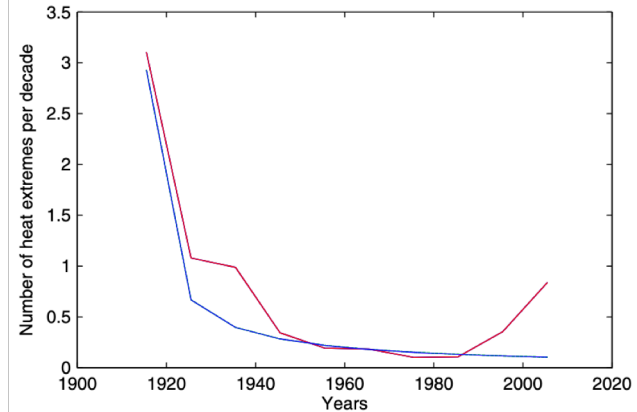
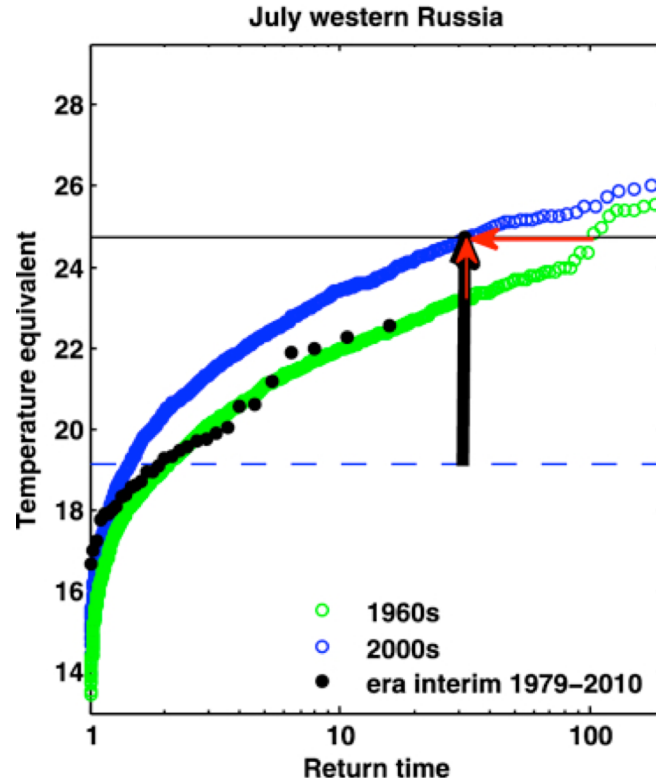
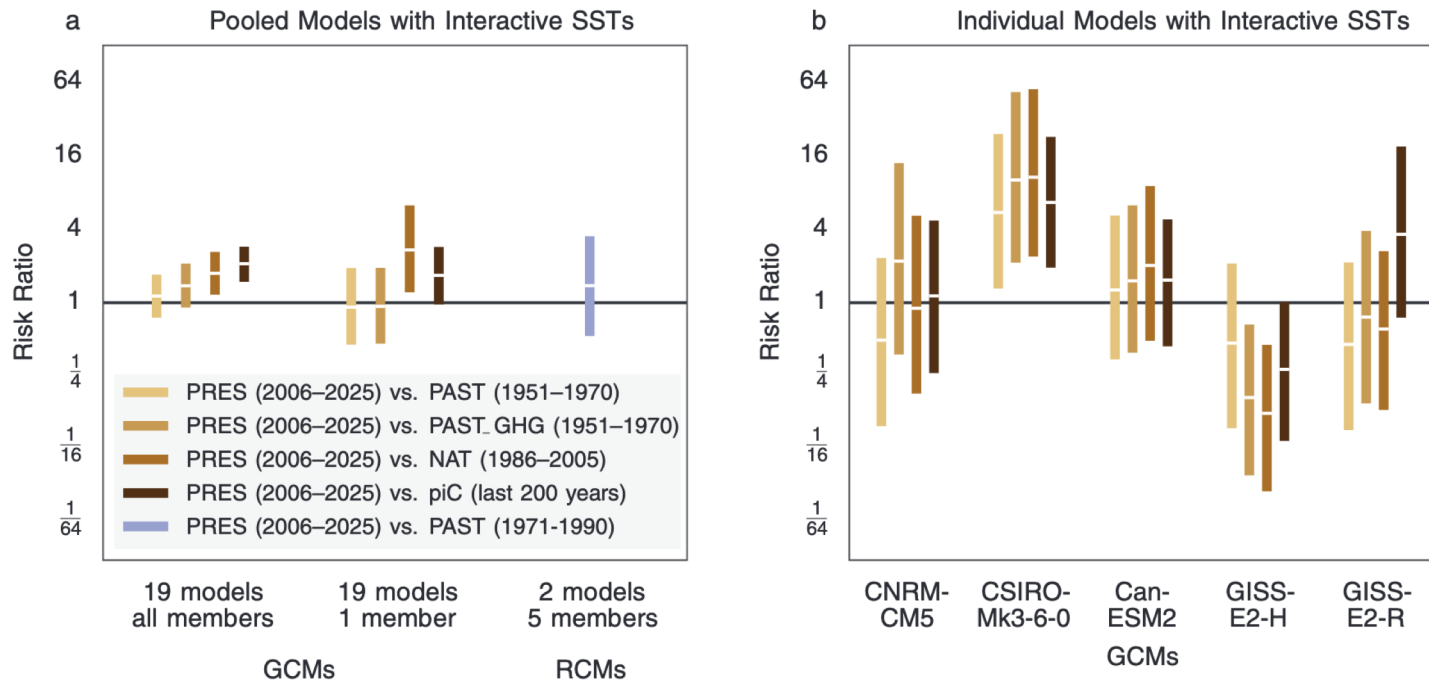


Fig. 4. Expected number of unprecedented July heat extremes in Moscow for the past 10 decades. Red is the expectation based on Monte Carlo simulations using the observed climate trend shown in Fig. 1E. Blue is the number expected in a stationary climate (1/n law). Warming in the 1920s and 1930s and again in the past two decades increases the expectation of extremes during those decades.

Framing matters – Otto et al (2012)



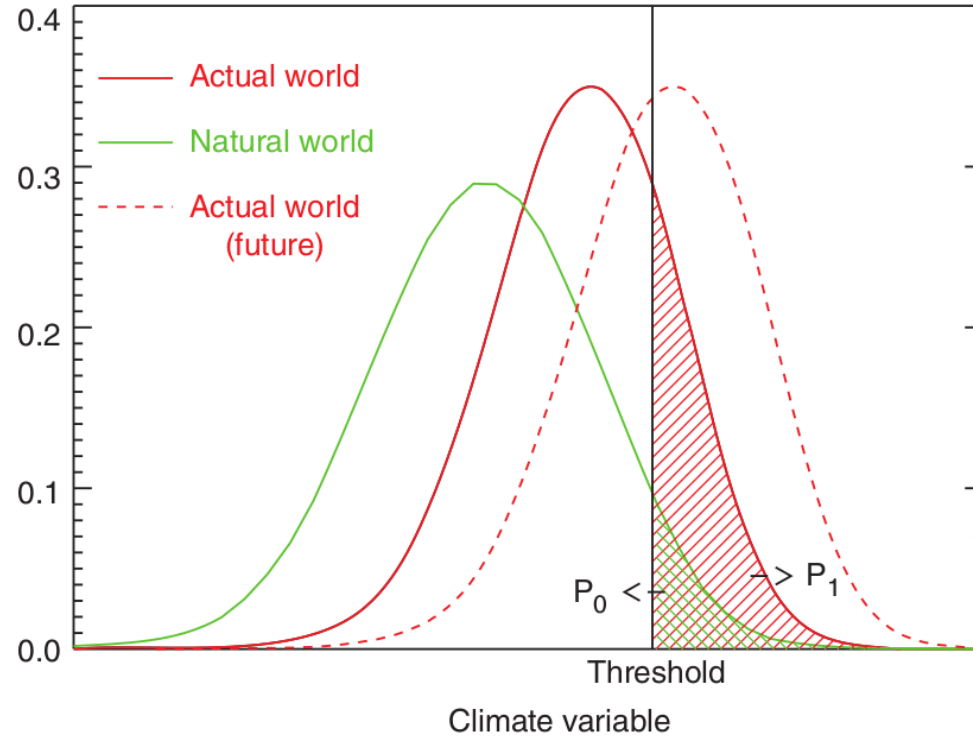
Definition of the counterfactual world matters



Different approaches

Approach matters

Risk-based approach



Risk-based approach

Probability of exceedance in the factual world

$$p_t^F = \mathbb{P}_t^F(Y_t \geq Y_{2019}^o)$$

Probability of exceedance in the counterfactual world

$$p_t^C = \mathbb{P}_t^C(Y_t \geq Y_{2019}^o)$$

Intensity of the event in the factual world

$$\mathbf{I}_t^F = \mathcal{Q}_t^F(1 - p_{2019}^F)$$

Intensity of the event in the counterfactual world

$$\mathbf{I}_t^C = \mathcal{Q}_t^C(1 - p_{2019}^F)$$

Probability ration

$$\text{PR}_t = p_t^F / p_t^C$$

Fraction of attributable risk

$$\text{FAR}_t = 1 - \frac{1}{\text{PR}_t}$$

Difference of intensity

$$\Delta \mathbf{I}_t = \mathbf{I}_t^F - \mathbf{I}_t^C$$

-> see tomorrow's practical on how to calculate them

Risk-based approach

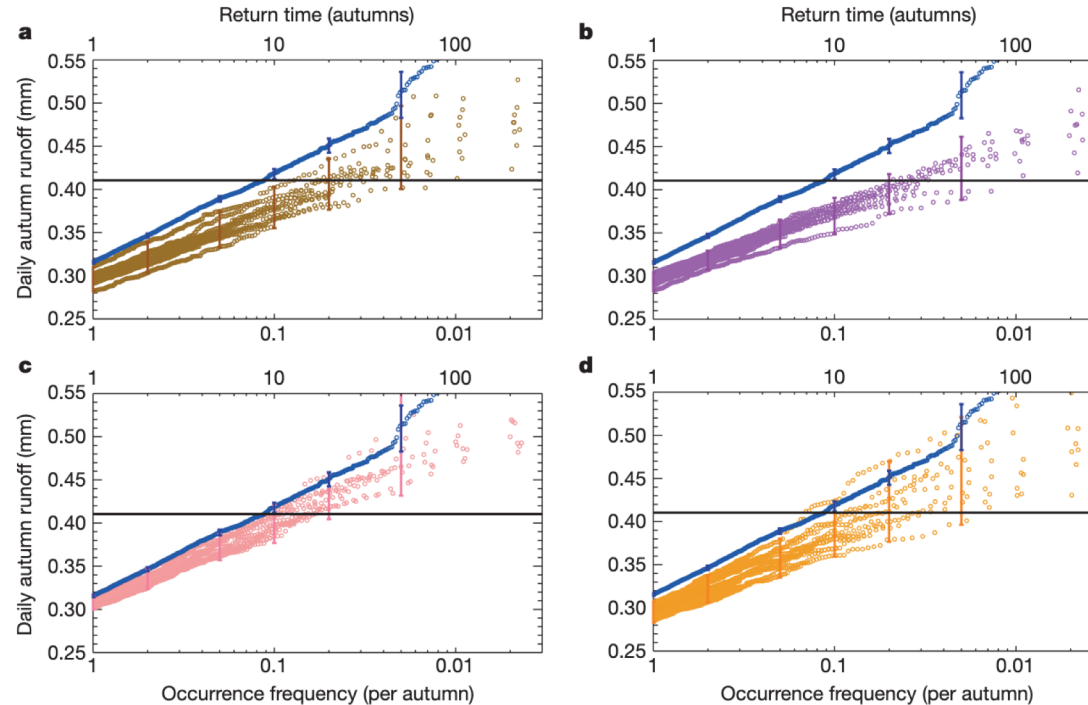


Figure 3 | Change in occurrence frequency of daily river runoff for England and Wales autumn 2000. **a–d**, Occurrence frequency curves of runoff (circles) synthesized from all precipitation simulations in A2000 and A2000N climates. Top axis of each panel is equivalent return time. Each panel shows identical A2000 runoff (blue). A2000N runoffs differ, being in climates generated using attributable SST warming estimates from HadCM3 (**a**; brown), GFDLR30 (**b**; purple), NCARPCM1 (**c**; pink) and MIROC3.2 (**d**; orange), with 10 curves corresponding to equiprobable amplitudes of warming. Bars represent 5–95% confidence intervals (see Methods). Horizontal line marks the highest autumn 2000 runoff synthesized from ERA-40 precipitation (0.41 mm).

Datasets for EEA

Reanalyses

GCMs -> CMIP5/CMIP6 models

RCMs

-> weather@home

-> CORDEX

...

They all have their limitations

Storyline approach

Disentangling dynamics and thermodynamics

Theoretical basis

How did climate change affect the physical processes leading to the event?

→ Division between dynamics and thermodynamics

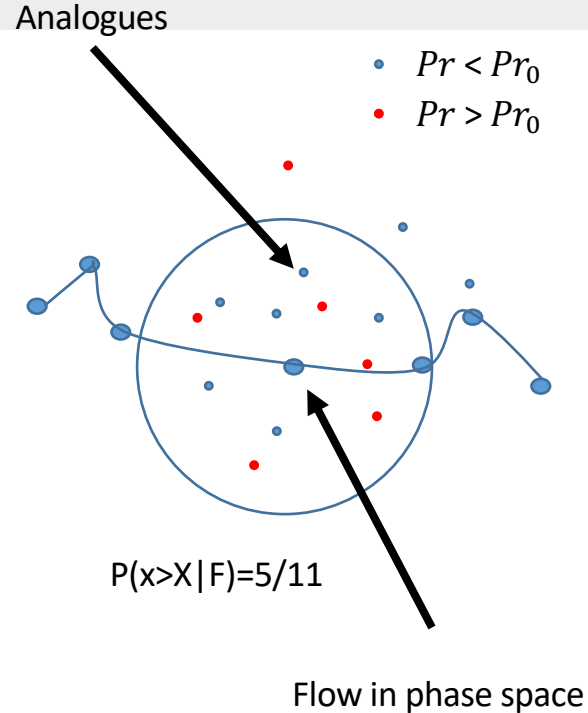
Trenberth et al (2015) Nature Clim. Change

Shepherd (2016) Current Climate Change Reports

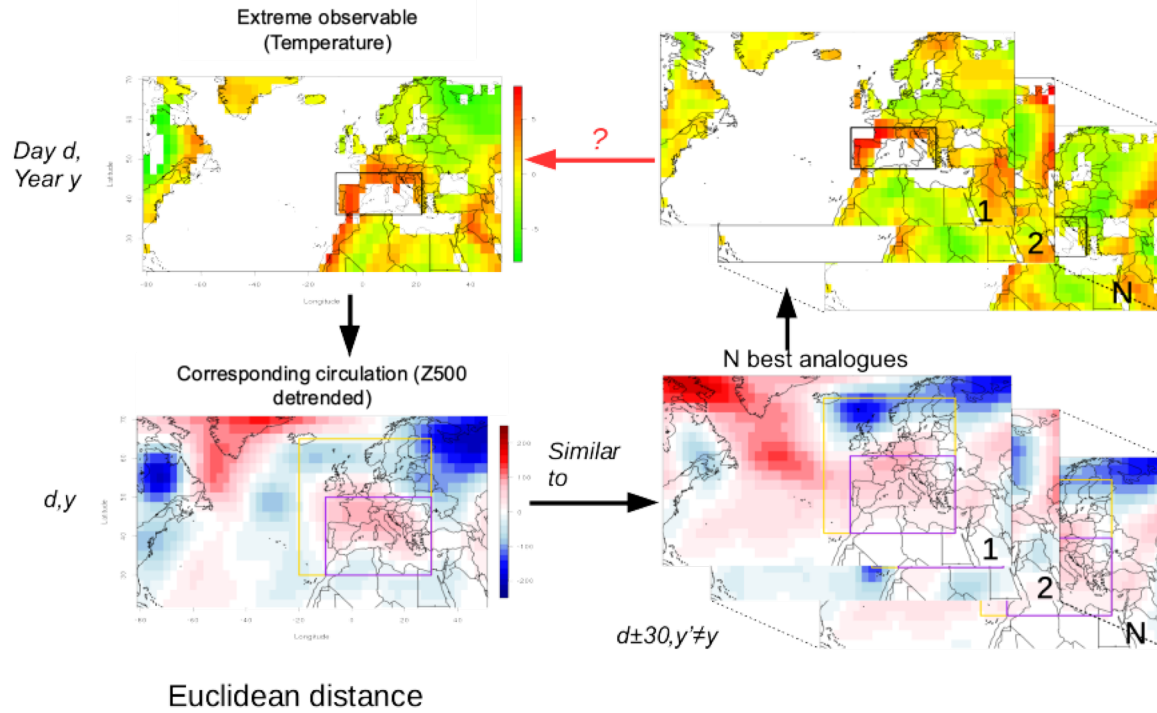
Flow-conditioned probabilities $P(X > X_0 | Flow)$ ($X=pr, T$)

→ To estimate conditional probability of exceedance of a threshold given the flow:

$P(Pr > Pr_0 | Flow)$ determined by counting hits in the neighbourhood of the flow in phase space



Flow analogues

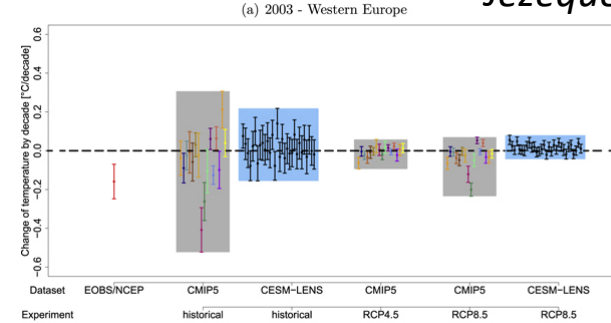
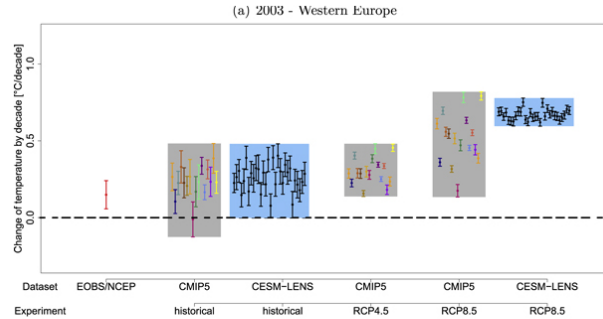


Jézéquel et al. (2018) *Clim. Dyn.*

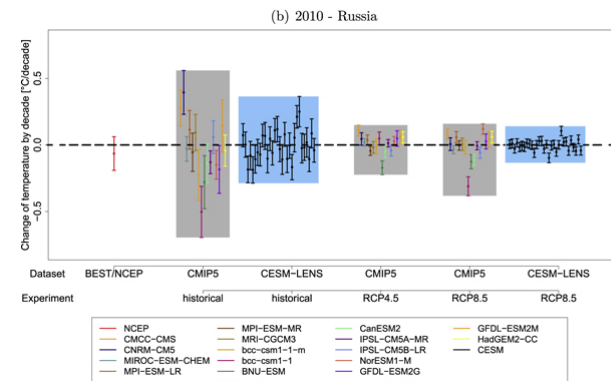
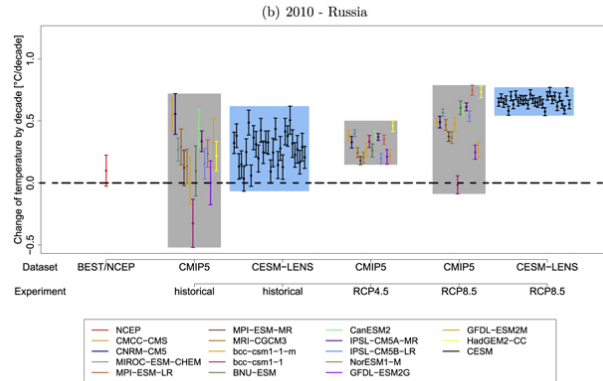
Residual thermodynamical trends

Jézéquel et al 2020

HW 2003



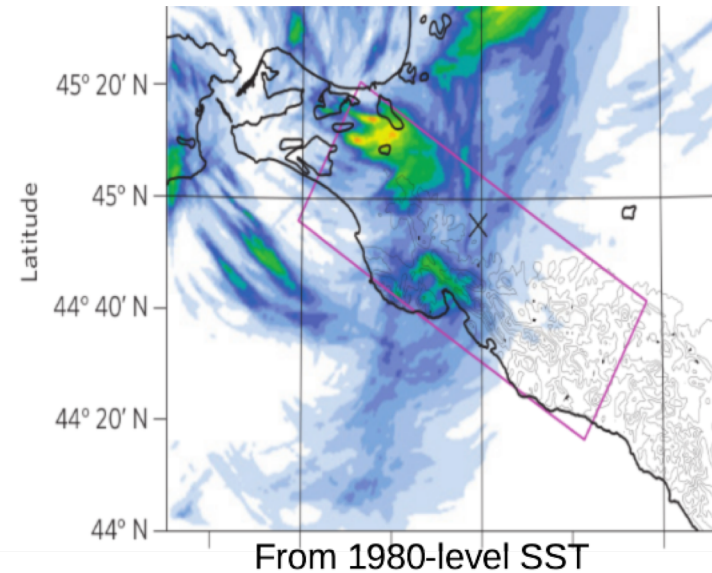
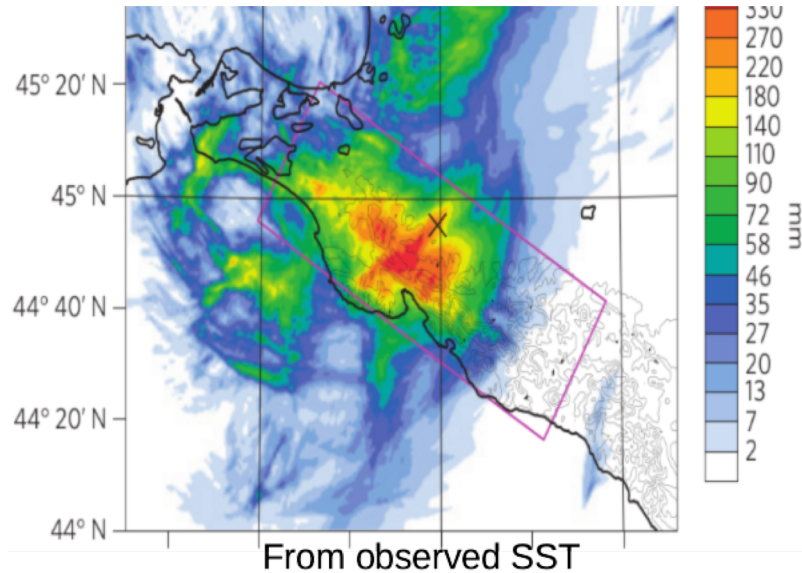
HW 2010



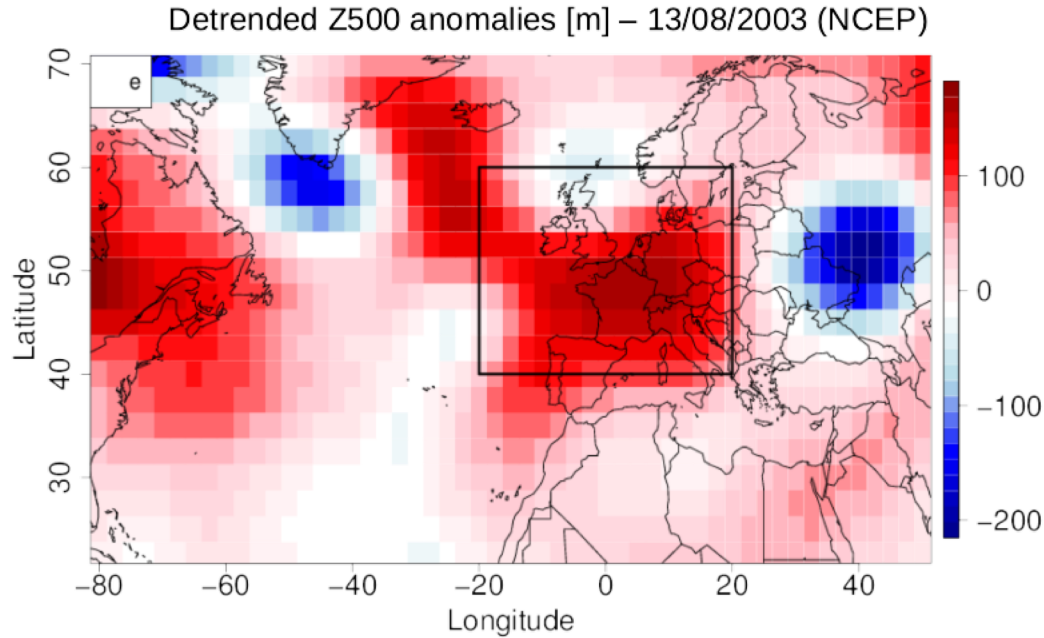
Conditional (Thermodynamical) trend

Residual trend

Conditionnal attribution in a model



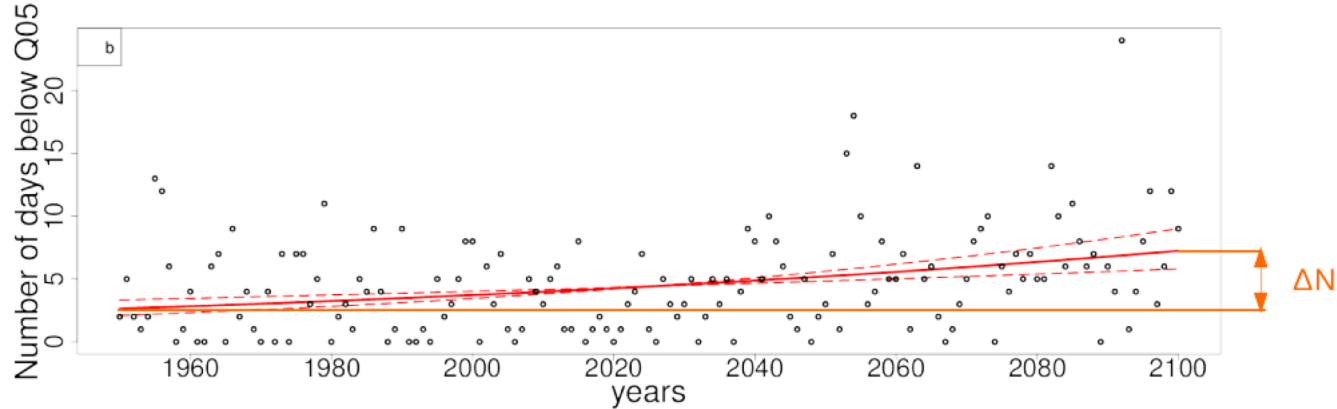
Conditional trends



Does climate change modify the probability of occurrence of this Z500 pattern?

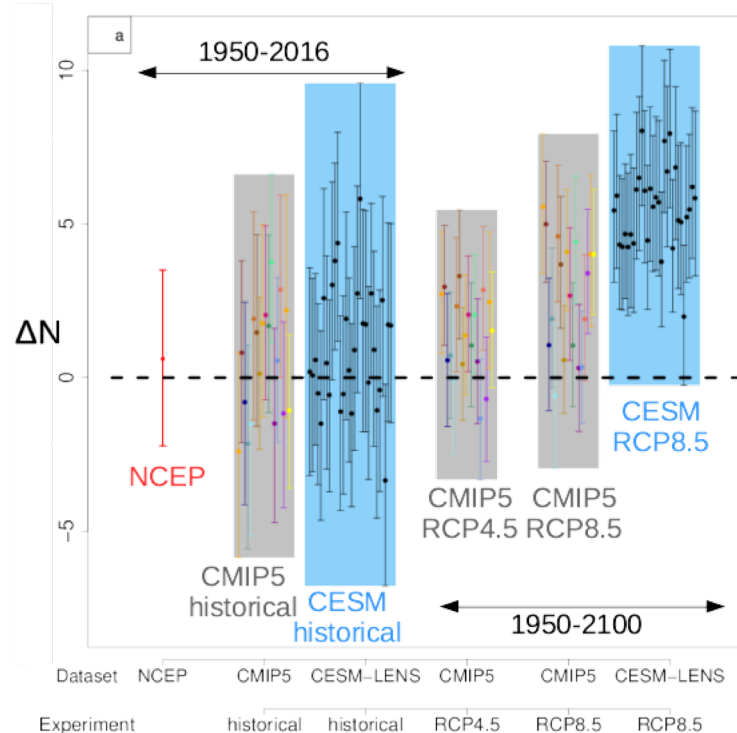
Jézéquel et al. (2018) Env. Res. Let.

Conditional trends



ΔN : Difference in yearly number of days close to the circulation of interest between the beginning and the end of the time series

Conditional trends

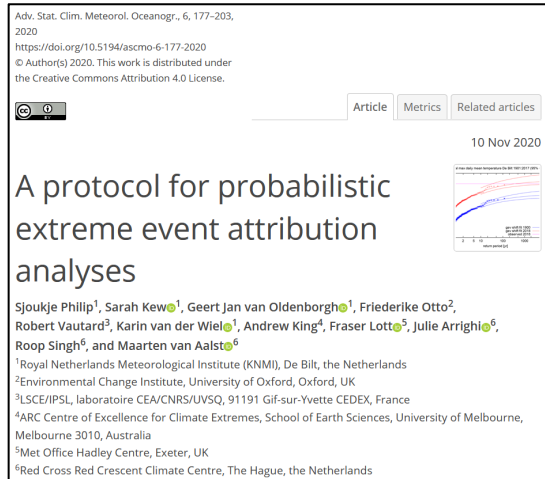


- No significant trend on the historical period
- Most models find a significant positive trend for the 2003 heatwave

Some further challenges

Rapid event attribution

- Do it in near real-time
- To have more reach
- Peer-review related questions (many collective discussions)



- Trigger conditions
- *Bring together experts*
- Define the event
- Collect observations and available models
- Detection: observation analysis
- Model evaluation
- Attribution: model analysis
- Hazard Synthesis
- Vulnerability and exposure
- Communication summaries



Geert Jan van Oldenborgh

Climate researcher, Royal Netherlands Meteorological Institute

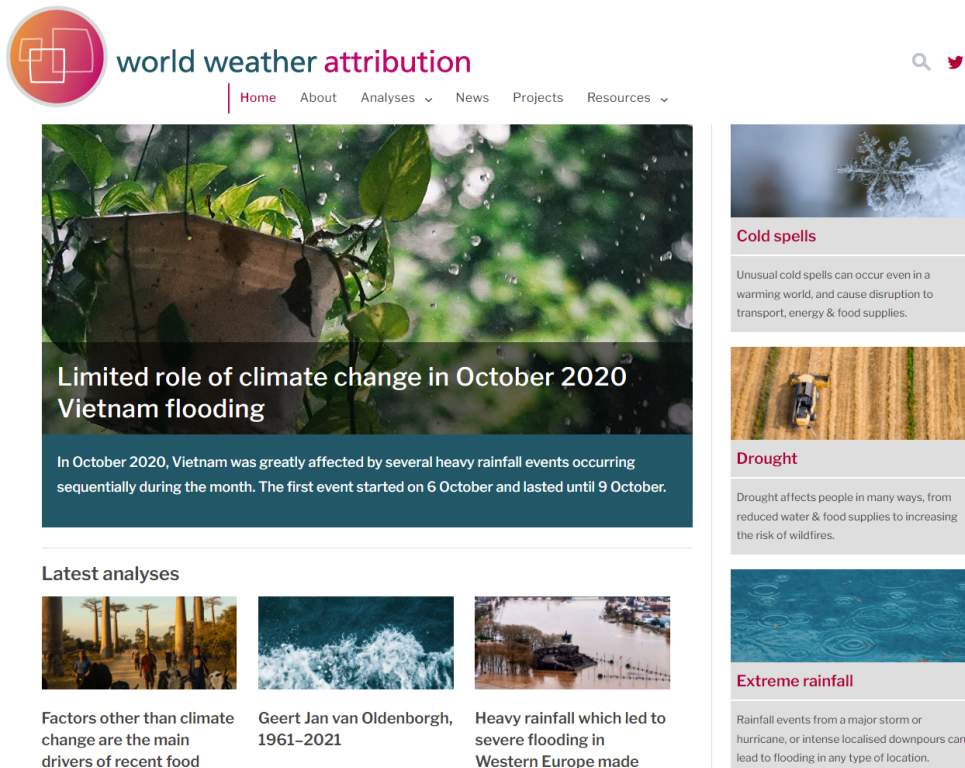
and Friederike Otto
& other colleagues



world weather attribution

Home About Analyses News

The « world weather attribution » network



The screenshot shows the homepage of the world weather attribution network. At the top is the logo, which consists of three overlapping squares in orange, pink, and purple, followed by the text "world weather attribution" in a sans-serif font. Below the logo is a navigation bar with links: "Home" (highlighted with a vertical line), "About", "Analyses" (with a dropdown arrow), "News", "Projects", and "Resources" (with a dropdown arrow). To the right of the navigation bar are search and social media icons. The main content area features a large hero image of green leaves with water droplets. Overlaid on this image is the title "Limited role of climate change in October 2020 Vietnam flooding" in white text. Below the title, a dark blue box contains the text: "In October 2020, Vietnam was greatly affected by several heavy rainfall events occurring sequentially during the month. The first event started on 6 October and lasted until 9 October." Below the hero image is a section titled "Latest analyses" in bold. It contains three columns, each with a small image and a text block. The first column has an image of people walking and the text "Factors other than climate change are the main drivers of recent food". The second column has an image of waves and the text "Geert Jan van Oldenborgh, 1961–2021". The third column has an image of a flooded street and the text "Heavy rainfall which led to severe flooding in Western Europe made". To the right of the main content area is a sidebar with three articles. Each article has a small image, a title in red, and a short paragraph. The first article is titled "Cold spells" and features an image of a snowflake. The second is titled "Drought" and features an image of a tractor in a field. The third is titled "Extreme rainfall" and features an image of raindrops on a blue surface.

world weather attribution

Home About Analyses News Projects Resources

Limited role of climate change in October 2020 Vietnam flooding

In October 2020, Vietnam was greatly affected by several heavy rainfall events occurring sequentially during the month. The first event started on 6 October and lasted until 9 October.

Latest analyses

Factors other than climate change are the main drivers of recent food

Geert Jan van Oldenborgh, 1961–2021

Heavy rainfall which led to severe flooding in Western Europe made

Cold spells

Unusual cold spells can occur even in a warming world, and cause disruption to transport, energy & food supplies.

Drought

Drought affects people in many ways, from reduced water & food supplies to increasing the risk of wildfires.

Extreme rainfall

Rainfall events from a major storm or hurricane, or intense localised downpours can lead to flooding in any type of location.

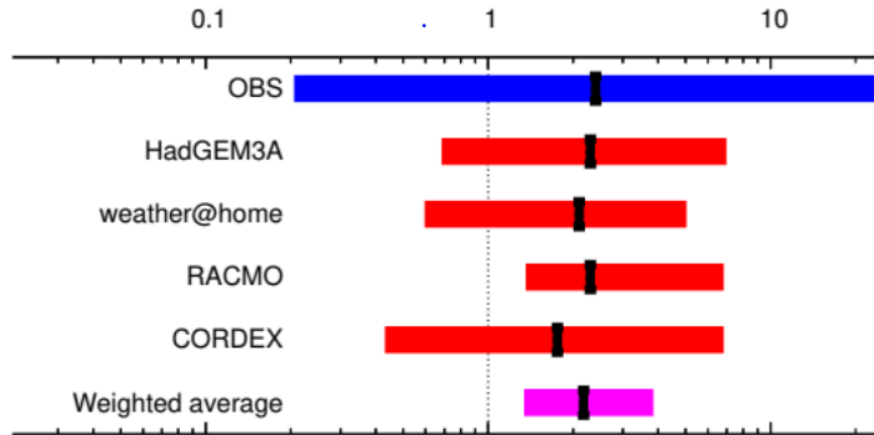
<https://www.worldweatherattribution.org>

3-day rainfalls that led to Seine river floods

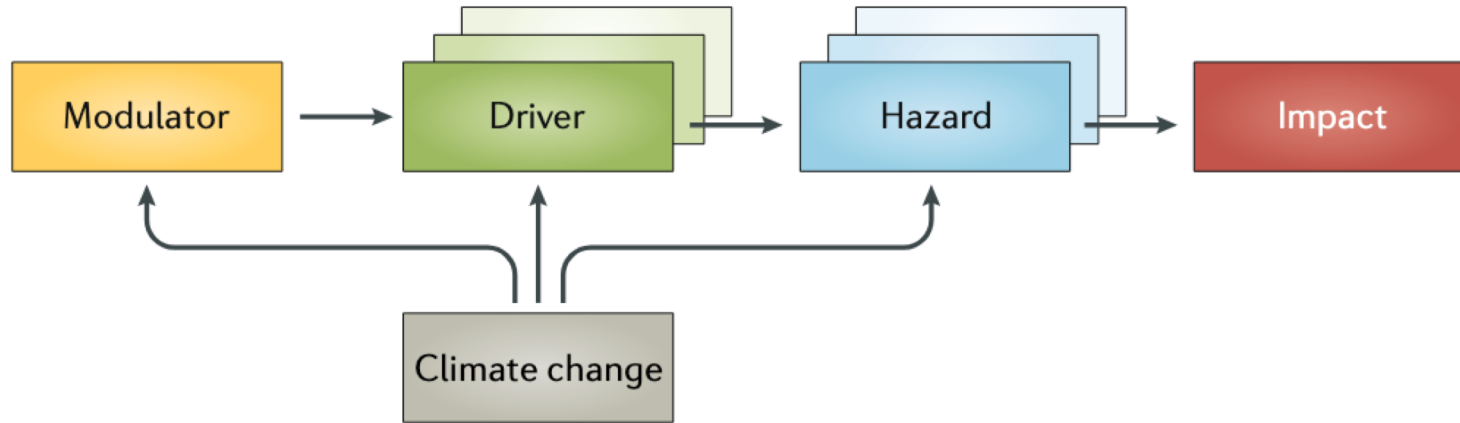


29-30-31 May 2016
~18 mm/day average
over the Seine catchment

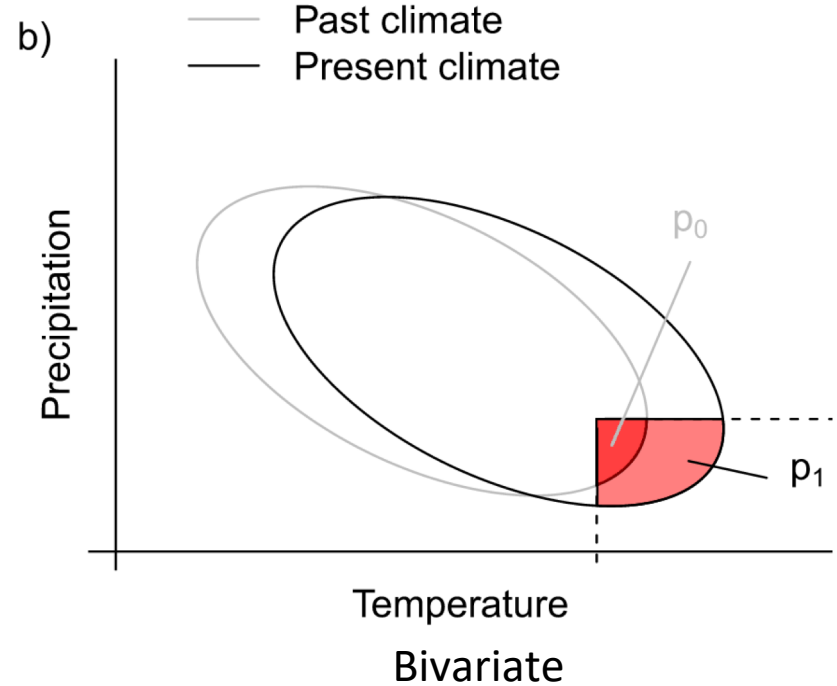
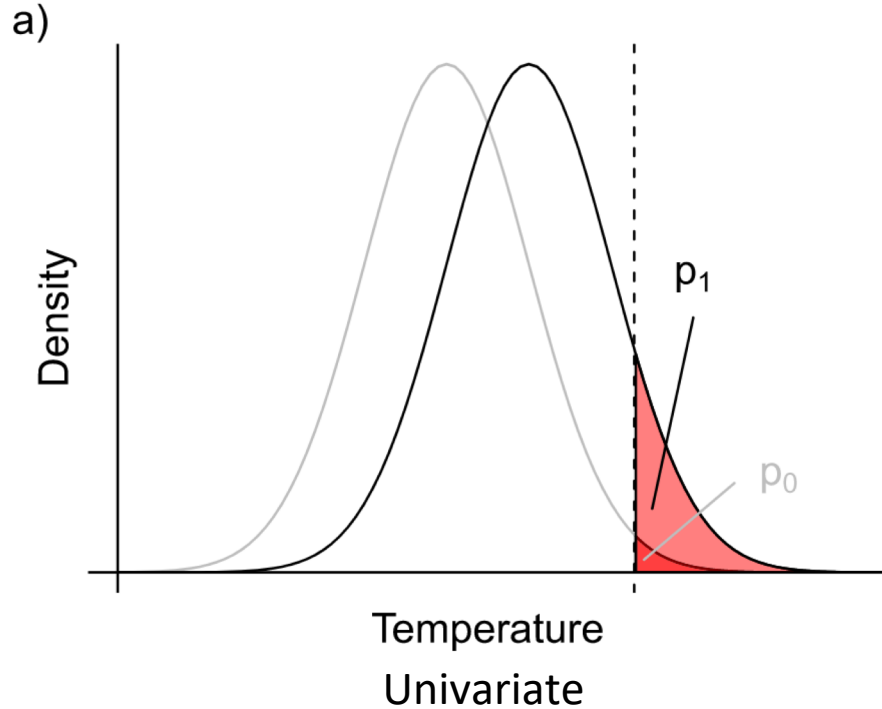
**Risk ratio of 3-day rainfall exceeding the observed
extreme : approximately 2**



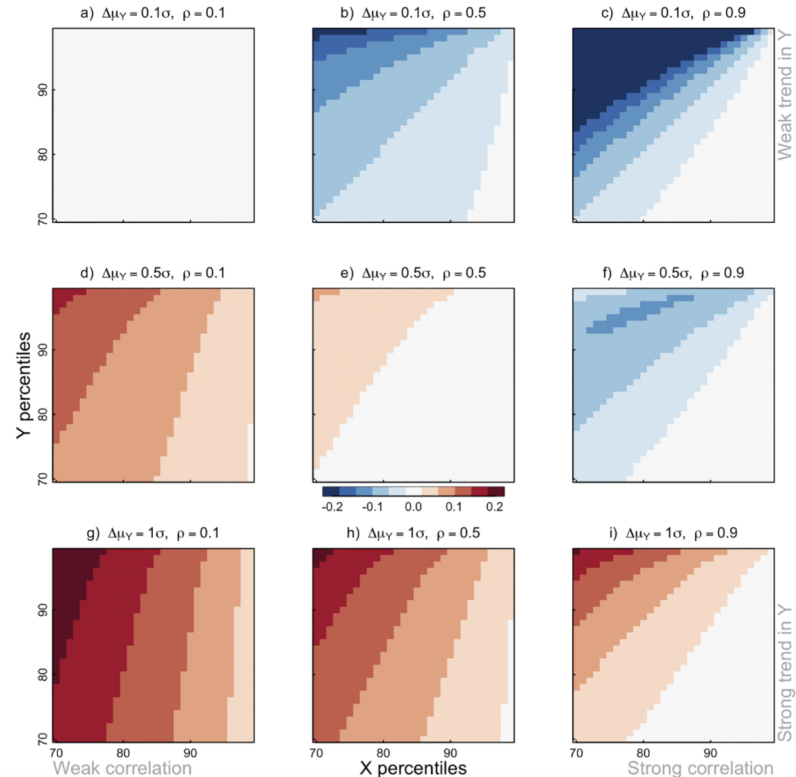
Compound events attribution



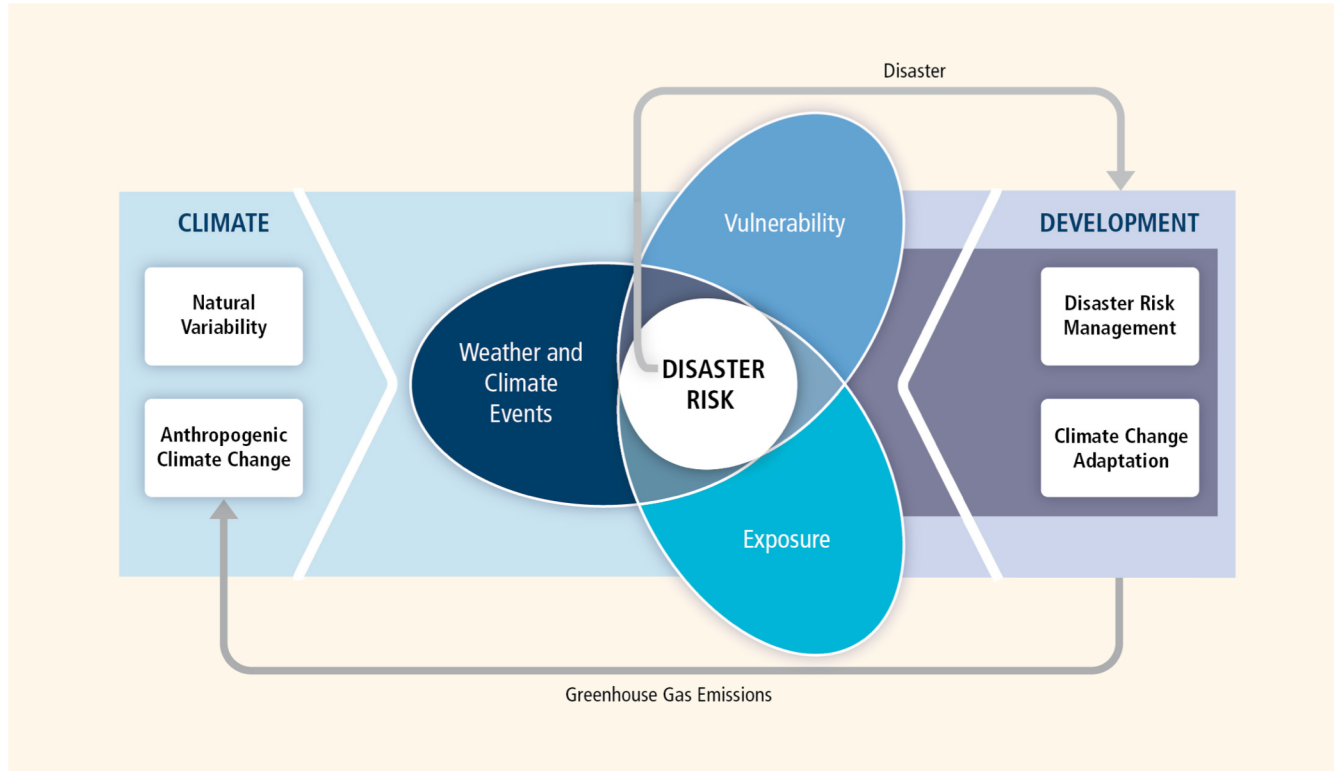
Compound events attribution



Compound events attribution



Extreme impacts attribution



Extreme impacts attribution

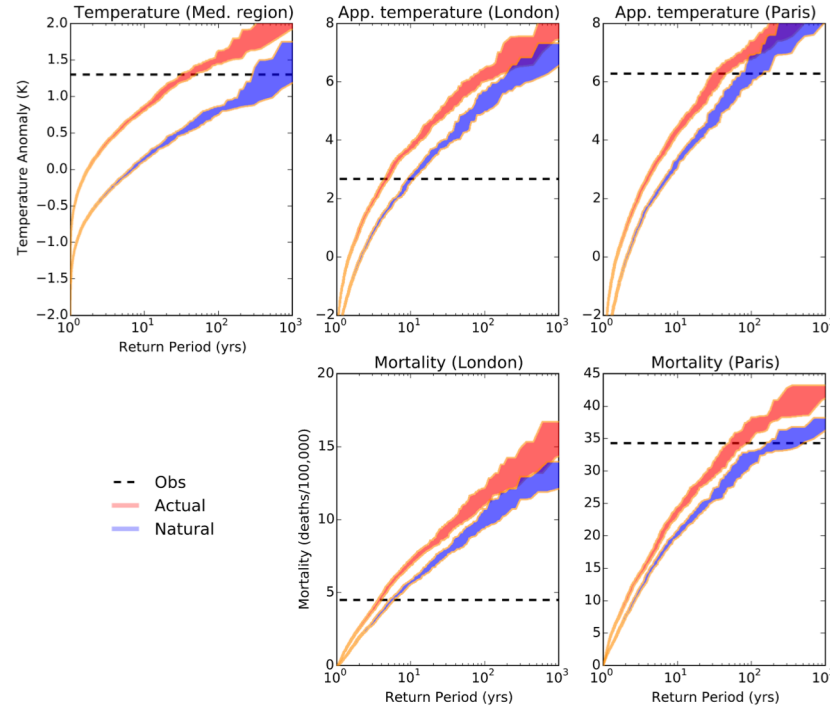
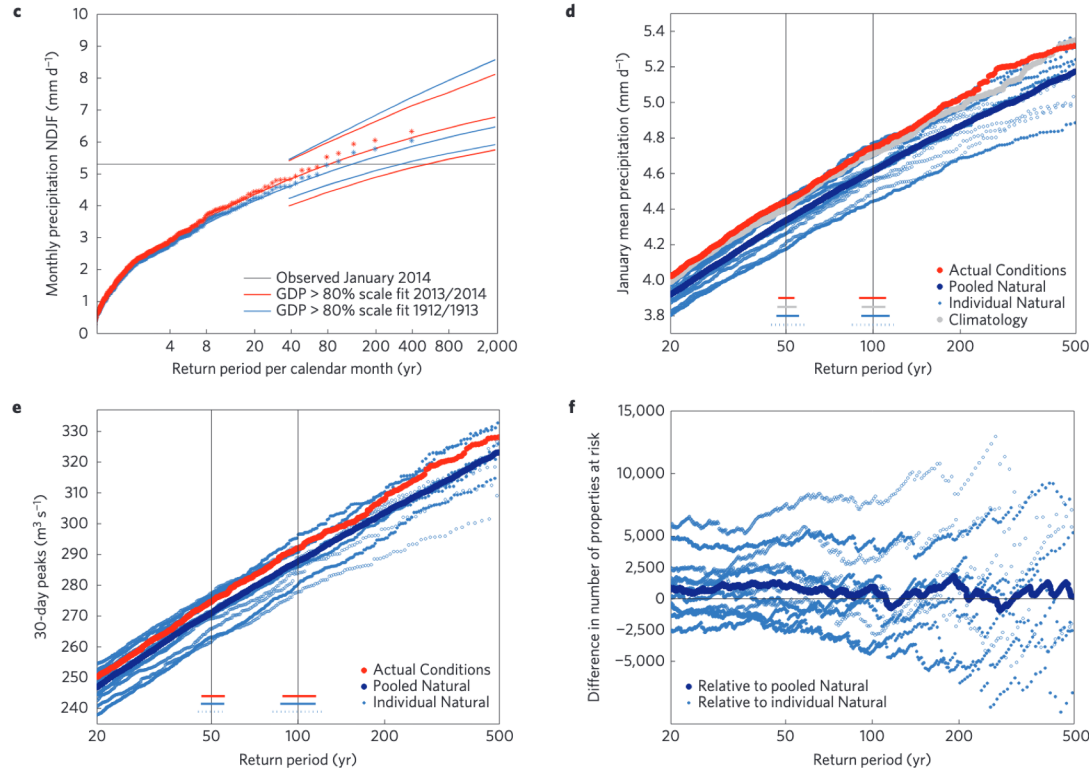


Figure 6. Temperature and mortality return period curves. (top, left) Summer-averaged temperature over the Mediterranean region and (top, middle and right) summer averaged apparent temperature over London and Paris. The bottom panels show the same but for cumulative summer heat-related mortality. Mortality counts are expressed per 100 000 population of the city. 5%-95% confidence intervals are plotted on the return level curves. The dashed line on each panel shows the value of the observed event.

Extreme impacts attribution



Some instructions for tomorrow's practical

Download R and Rstudio

Practical to be sent by mail today

Follow instructions to install the required package (see mail)