The heatwave in North India and Pakistan in April-May 2022.

Technical summary. Details on the attribution system in Christidis (2021).

Nikolaos Christidis, May 2022.

A real-time attribution study was conducted during the heatwave that affected large parts of North-India and Pakistan in April-May 2022. The analysis was produced with a system developed in Hadley Centre for the attribution of extremes in near-real time (Christidis, 2021). It employs an unconditional attribution framing, which estimates the changing risk of critical temperature threshold crossings under any possible conditions. The system also adopts the well-established and peer-reviewed risk-based methodology that infers probabilities of extreme events with and without the effect of human influence from large multi-model ensembles of climate model simulations. The new analysis employed coupled model data drawn from large multi-model ensembles of the Coupled Model Intercomparison Project phase 6 (CMIP6, Eyring et al., 2016). In total, the study uses data from 14 models that provide the necessary experiments for event attribution, namely historical simulations extended to the end of the 21st century with the medium emissions scenario SSP2-4.5 (ALL; Riahi et al., 2017) and simulations with natural forcings only (NAT) to year 2020. Each model provides several simulations for each experiment and there are in total 82 ALL and 71 NAT model runs for temperature, and similar numbers for rainfall (87 ALL and 72 NAT) as listed in Table 1.

MODEL	ALL	NAT
	hist + ssp245	
ACCESS-CM2	3	3
ACCESS-ESM1-5	18	3
BCC-CSM2-MR	1	3
CESM2	3	3
CNRM-CM6-1	6	10
CanESM5	25	15
FGOALS-g3	4	3
GFDL-ESM4	3	3
GISS-E2-1-G	3	5
HadGEM3-GC31-LL	5	5
IPSL-CM6A-LR	9	10
MIROC6	3	3
MRI-ESM2-0	1	3
NorESM2-LM	3	3
Total	87	72

Table 1. The CMIP6 models used in the attribution analysis. The table gives the number of simulations per experiment and the total mutli-model ensemble size (last row).

The study aims to a) estimate the likelihood of the combined April and May temperature reaching a new record in year 2022 over a region that has so far been largely affected by high temperature anomalies (62-86E; 23-31N) and b) assess the role of anthropogenic forcings in the changing likelihood of extreme heatwaves. Extreme events are defined as exceedances of the previous record anomaly of 2.24 °C (relative to 1901-1930) observed in year 2010. Temperature observations come

from the CRUTEM5 dataset (Osborn et al., 2020), from which only post-1900 data are retained, when the coverage can adequately represent the mean regional temperature. The model simulations start at year 1850. The likelihood of extreme heatwaves is calculated under three different climatic conditions:

- the natural climate, represented by all April-May temperature anomalies extracted from the NAT experiment.
- the present climate, represented by the temperature anomalies in years 2013-2032 extracted from the ALL experiment.
- the climate of the late 21st century, represented by temperature anomalies in years 2081-2100 extracted from the ALL experiment (ALL simulations extended with SSP2 4.5).

Observed and modelled timeseries of the April-May anomalies averaged over the reference region are illustrated in Fig. 1. Both CRUTEM5 and the ALL experiment suggest an increase in temperature since the late 20th century that continues throughout the 21st century, expected to steadily increase the likelihood of extremely hot events. Such long-term warming is not seen in the NAT climate, suggesting it is of anthropogenic origin.



Figure 1. Timeseries of the April-May temperature anomaly (relative to 1901-1930) in the reference region (62-86E; 23-31N) computed with observational data from CRUTEM5 (black line) and the CMIP6 ALL (red lines) and NAT (green lines) simulations.

The models were evaluated against the observations (Fig. 2) by applying a number of evaluation tests commonly employed in event attribution studies (Christidis et al., 2013). The observed temperature trend is well within the range of the ALL simulations (Fig. 2, top panel) and in close agreement with the ensemble mean. Power spectra also indicate good consistency between the models and CRUTEM5 (middle panel). The Q-Q plot produced for each simulation separately shows lines that lie close to the diagonal, which indicates that the modelled distribution compares well with

the observed one. Hence, on the basis of this assessments, the models are deemed suitable for an attribution analysis of extreme heatwaves in the reference region.



Figure 2. Evaluation of the CMIP6 models. Top panel: temperature trends over the observational period computed with CRUTEM5 (black dashed line) and individual ALL simulations (vertical bars). The dashed red line marks the ensemble mean. Middle panel: Power spectra from CRUTEM4 (black) and the ALL simulations (orange). Bottom panel: Quantile-Quantile plot for each of the ALL simulations.

Probabilities of a new temperature record in the region are computed next. The 2010 anomaly (previous record) is set as a threshold to define extreme events. Return time estimates (inverse probabilities) and their associated uncertainty are reported in Table 2. It is found that a new record in the region would occur approximately every 300 years in the NAT world, while years with April-May temperatures higher than the one in 2010 are now common (return time of about 3 years) and, under SSP2-4.5, the threshold is set to be crossed almost every year by the end of the century. The analysis suggests that human influence has increased the likelihood of extreme April-May temperature anomalies by a factor of about 100 (Table 3). By the end of the century the likelihood is estimated to increase by a factor of 275 relative to the natural climate.

Table 2. Return time estimates for extremely hot events. The 5-95% uncertainty range is given inbrackets.

	Return Time (years)
NAT	312 (258 to 384)
ALL-present	3.1 (3.0 to 3.3)
ALL-future	1.15 (1.13 to 1.17)

 Table 3. Risk ratio estimates. The 5-95% uncertainty range is given in brackets.

	Risk Ratio
Prob (present) / Prob (NAT)	100 (80 to 123)
Prob (future) / Prob (NAT)	275 (224 to 333)

References

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