

# Australian ClimateChange ScienceProgramme

Weather extremes and climate change  
The science behind the attribution of climatic events

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## At a glance

- Extreme weather and climate events have serious impacts on our economy society and environment.
- Climate change most clearly influences the *frequency* of extreme events, such as more frequent fire weather, more frequent and longer heatwaves, and more frequent extreme rainfall.
- Climate change also influences the *severity* of individual extreme events.
- Some changes to extreme events have already been observed in Australia—notably an increase in fire weather, record-breaking temperatures and heatwaves.
- Understanding what causes *individual* extreme events is difficult, and is a field of active research. Improved understanding of the causes of extreme weather events helps to plan for future impacts in Australia.
- Events relating to warm temperatures, such as the severity of individual heatwaves, are more easily attributed to recent climate change than rainfall events.
- The Australian Climate Change Science Programme, which involves researchers from CSIRO and the Bureau of Meteorology in collaboration with universities, provides information on the causes, nature, timing and consequences of climate change.

## EXTREME WEATHER AND CLIMATE EVENTS

Extreme weather and climate events often have a serious impact on our economy environment and society, and can cause loss of life, property and livelihoods. Researching extremes and understanding their causes is crucial for increasing our ability to help manage and predict their impacts.<sup>1</sup>

Extreme weather events are, by definition, events that are rare at a particular place and time of year. What is considered rare will vary from place to place. For example, an average daily temperature in Alice Springs in the middle of summer would be considered an extreme summer's day in Hobart. Similarly, the impact of certain extreme events will also vary with location. While extreme events can be defined for any climate variable, reliable Australian weather observations go back only 100 years or so, limiting our ability to examine changes to some types of extremes.<sup>2,3</sup>

Extremes can be characterised by the severity, duration and spatial extent of the event. Extreme weather that persists for some time, such as a season is often called an extreme climate event.

### Examples of recent extreme events

- From 27 January to 8 February 2009, a severe and prolonged heatwave (12–15 °C above the seasonal average of 28–32 °C) resulted in 374 more deaths in Victoria than would normally be expected during this time.<sup>4</sup>
- Black Saturday bushfires on 7 February 2009 ravaged Victoria, causing the loss of 173 lives, destroying more than 2000 homes and burning more than 430,000 hectares of land. These impacts cost about \$4.4 billion and were more severe than any previous fire event in the recorded history of Australia.<sup>5</sup>
- Heavy rainfall in Queensland in 2010–11 resulted in extensive flooding, impacting more than 78% of the state and over 2.5 million people, and leading to the loss of 33 lives. Around 29,000 homes and businesses suffered some form of inundation with a cost in excess of \$5 billion.<sup>6</sup>
- Tropical cyclone *Yasi* made landfall on Mission Beach in Queensland on 3 February 2011 and was one of the most powerful cyclones (rated category 5 with wind speeds of up to 205 km per hour, gusts up to 285 km per hour, and a 5 m tidal surge) to be recorded since 1918.
- Australian maximum temperature (averaged over the whole country) reached 40.3 °C on 7 January 2013, setting a new record. This was the hottest day of a national heatwave that was significant for its coverage across the continent.
- The January 2013 national heatwave was also exceptional in duration, spanning more than two weeks. It was the warmest such period on record and included a sequence of seven days where the Australian average temperature exceeded 39 °C. The previous record sequence for national temperatures above 39 °C was four days, and had only occurred once before, in 1972. This heatwave contributed to January being Australia's hottest month on record and December 2012 to February 2013 being the hottest summer on record.
- A significant multi-day heatwave affected south-east Australia in January 2014. Victoria recorded its hottest four-day period on record and Adelaide had a record five consecutive days over 42 °C. The extreme heat experienced in Melbourne between 14 and 17 January 2014 is estimated to have cost businesses approximately \$37 million in lost revenue.<sup>7</sup>



## RECENT AND FUTURE CHANGES IN EXTREME EVENTS

Extreme events have always been a part of our climate and are a basic feature of a chaotic, complex system. However, with a warming climate, the frequency and intensity of these events are likely to change (see Figure 1). There is growing evidence that some aspects of the weather, such as extreme high temperatures, are becoming more common and severe as the planet warms. Warming has also been accompanied by a decrease in cold weather extremes, such as fewer frosts.<sup>1</sup>

In Australia, increases in the frequency, duration and intensity of heatwaves, more frequent fire weather, more frequent and severe storm surges, and increases in extreme rainfall intensity will present significant challenges for future planning across agriculture, health, coastal management and infrastructure.

A challenge for scientists is to provide access to the latest information on how extreme events are likely to vary under a changing climate, within a range of likely future levels of greenhouse gas emissions.

So, what is known about the link between human-induced climate change and individual weather events?

A typical answer to date has been that the frequency and intensity of weather extremes are expected to vary under climate change, but that it is not possible to say that climate change caused a specific event. However, more recently, scientists are attempting to directly tackle this question.<sup>8,9,10</sup>

Researchers can quantify how the probability of an individual, observed extreme weather event occurring has changed due to human influences or other causes.

This emerging area of research—called ‘attribution of climate-related events’—is attracting more attention due to the already observed changes in the frequency and intensity of extremes. New methods have been tested on larger samples of weather events, resulting in more information about the influence of climate change on some types of extremes, including heatwaves and intense rainfall events leading to floods.<sup>11,12</sup>

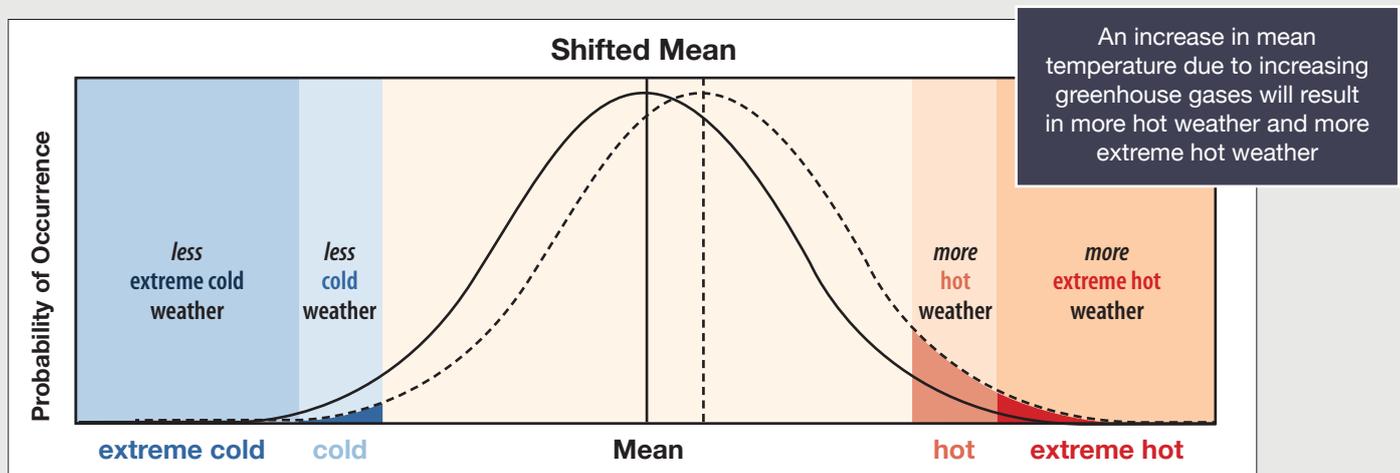


Figure 1: The effects of changes in mean temperature on the occurrence and intensity of extremes (After *Special Report on Managing the Risks of Extreme Events and Disasters to Advance Climate Change Adaptation Summary for Policy Makers*, Figure SPM.3)<sup>13</sup>

# THE SCIENCE OF ATTRIBUTION

Attribution is the process of evaluating the most likely cause or causes of an observed change, with some defined level of confidence. Climate scientists ‘connect the dots’ to find the most important features of extreme events. They use observational data, climate models, an understanding of physical processes and statistical analysis for these attribution assessments.

## ATTRIBUTION OF EXTREME EVENTS

The attribution of individual extreme events has great potential for furthering our understanding of extreme weather. Extreme event attribution is more challenging than attributing long-term changes. This is because extreme weather events are rare, and the result of complex meteorological influences. Most events are not exclusively due to either human or natural causes but some combination of both. However, with a thorough assessment of the physical factors leading to the extreme event, a quantification of the human contribution can be made.

### Methods

Event attribution studies can be separated into two main streams. One examines how the likelihood or risk of an extreme event occurring has changed as global temperatures have risen. Another looks at the intensity of the current event and attempts to understand its causes.

One method for attributing extreme event likelihood is called Fraction of Attributable Risk (FAR).<sup>17,18,19</sup> This method is also used in medical research, where the risks of health problems are attributed to various factors through statistical analysis of medical records. For example, early studies using population samples determined that smokers were fifty times more likely to contract lung cancer than non-smokers.

In the climate context, the population samples are replaced with climate model simulations of a world with and without increases in greenhouse gas concentrations due to human activity. The risk of a particular extreme weather or climatic event occurring in each of these two worlds is quantified, with the FAR indicating the change in risk under climate change. For example, a FAR value of 0.5 indicates that 50% of the increased risk is due to climate change or, in other words, the extreme is twice as likely to occur now compared to pre-industrial times.

This approach can also be used to determine the influence of natural climate variability on the risk of extreme events. For example, the FAR can be used to assess the change in risk of extreme events associated with El Niño events, which typically bring drier and warmer conditions to much of Australia.

Not all extreme events can be attributed using the same methods or as easily (see Figure 2). Successful attribution is affected by how well we can both observe and model an individual extreme event. The rarer the event, the more

Attribution has been used extensively to measure the contribution of human activities to observed, long-term mean changes in the climate system over the past century.<sup>14</sup> This includes attribution of changes in the frequency of extreme events. Recent attribution studies find that the increase in greenhouse gases due to human activities is likely to have more than doubled the probability of occurrence of heatwaves in some locations since the mid-20th century.<sup>13</sup> In Australia, days of extreme heat have increased markedly over the 20th century.<sup>15,16</sup>

difficult it is to identify the causes of any changes, as there are fewer cases to evaluate (e.g. tropical cyclones). Similarly, the smaller and more localised the event (e.g. extreme rainfall events), the more difficult the analysis, as small events are difficult to observe and model clearly. For small-scale and shorter-duration events, the effect of natural variability is more significant relative to the climate change influence.

The large natural range of extreme events also causes difficulties for attribution in a climate change context. Considering the extent of global warming that we have experienced to date, changes in the frequency or likelihood of extreme events—rather than their intensity or magnitude—are more readily attributed to climate change. For example, analyses of the Russian heatwave in 2010 determined that while the risk of the heatwave occurring had increased three-fold due to climate change, the intensity of the heatwave was still consistent with extreme natural climate variability. However, as further warming is very likely, there is a high probability that the intensity of extreme events will increase over time, becoming more easily distinguished from the natural variations of climate.

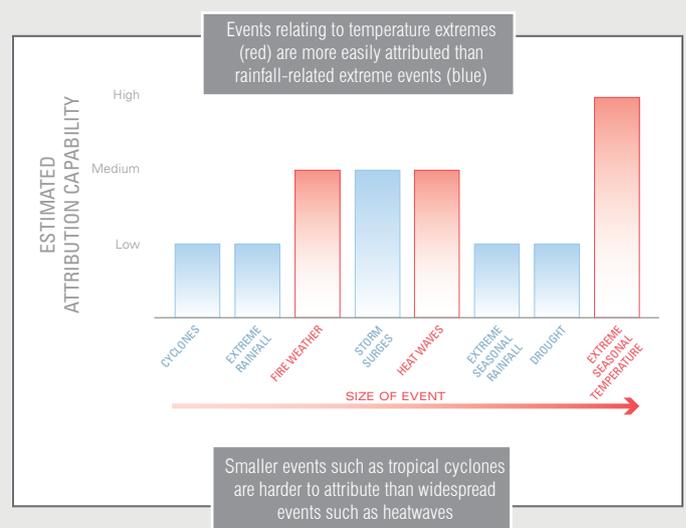
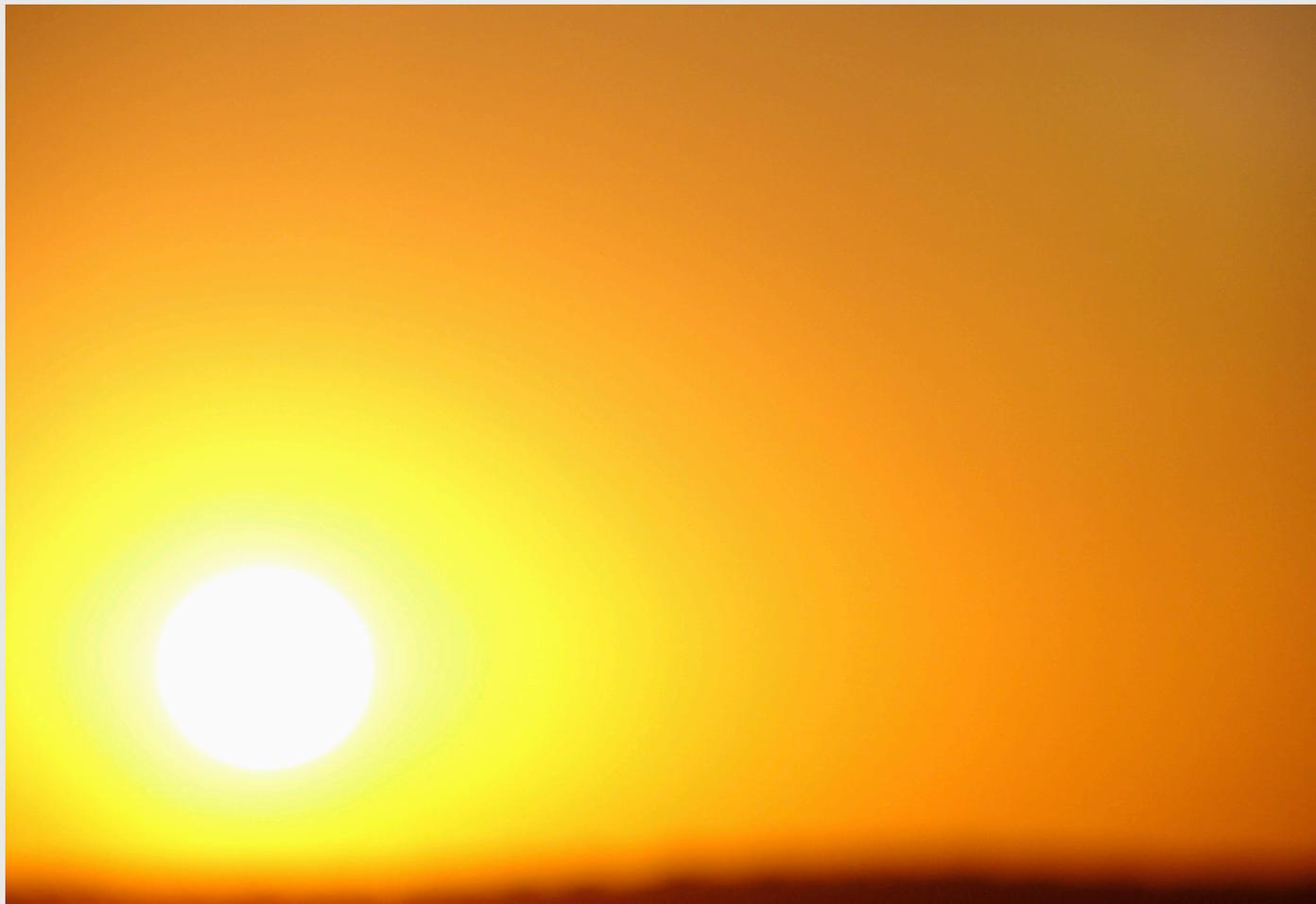


Figure 2: Estimate of attribution capability for different extreme events. Capability is classified as low, medium or high based on current research. The arrow indicates that the spatial scale (size) of the events increases from left to right. Predominantly temperature-based extreme events are shaded in red and rainfall-based events in blue.



## WHAT CAN WE NOW SAY ABOUT THE LINK BETWEEN CLIMATE CHANGE AND EXTREME EVENTS?

The Australian Climate Change Science Programme has been investigating extreme events to improve understanding of their nature and consequences. Collectively, scientists at the Bureau of Meteorology, CSIRO and Australian universities, including the ARC Centre of Excellence for Climate System Science, are examining changes in, and the causes of, individual extreme events in Australia and other parts of the world. Reflecting the increased interest in extreme weather attribution, the *Bulletin of the American Meteorological Society* now publishes an annual collection of research articles explaining the significant extremes of the previous year.<sup>11,12,20</sup>

### Temperature

An increasing number of studies have attributed periods of extreme heat around the world to increasing greenhouse gases. Studies on the European heatwave of 2003<sup>8</sup>, the Russian heatwave of 2010<sup>21,22,23</sup> and record temperatures in the USA during 2011<sup>24,25</sup> demonstrate a much higher risk of such temperatures occurring due to human-induced warming. In Australia, the record hot summer of 2012–13 was examined using the FAR method. The odds of this event occurring were found to have increased five-fold due to human influences.<sup>26</sup> 2013 also saw record-breaking September and spring temperatures and was the warmest calendar year on record. Using the FAR method, it was found to be virtually impossible to achieve the 2013 calendar year

Australian-average temperatures without the presence of human influences on the climate.<sup>27</sup> Additional studies, using various methods, also found that human influences have increased the likelihood and strength of the Australian heat events in 2013.<sup>15,28,29,30</sup>

### Rainfall

Rainfall extremes are harder to attribute than temperature extremes due to the relatively small scale of the events and the large range of natural variability (see Figure 2). A number of attribution studies investigated the cause of the heavy rainfall events in eastern Australia from 2010–11 through various methods.<sup>31,32,33,34</sup>

Australia experienced its wettest spring on record in 2010 leading to extensive flooding in eastern Australia the following summer. The spring and summer of the following year (2011–12) also had above-normal rainfall. These exceptionally wet periods coincided with two consecutive La Niña phases of the El Niño-Southern Oscillation (ENSO), which are typically associated with cool, wet summers in eastern Australia.

The October 2011–March 2012 extreme rainfall over south-east Australia was studied using various attribution methods in separate studies. These found that the record rainfall was most likely attributable to natural variability associated with La Niña<sup>32</sup>, with a small contribution from human influences on the climate system.<sup>33,34</sup>

## WHAT DOES THIS MEAN FOR FUTURE EVENTS?

Climate model projections indicate an additional warming of between 1 and 5°C for Australia by the end of this century, depending on the emissions scenario.<sup>11,31</sup> As a result, high temperature extremes will increase in frequency, duration and intensity in the future.

The projections also show that the record heat observed during 2013 is likely to become the norm by the mid-21st century, following a mid-range greenhouse gas emissions

scenario. For rainfall extremes, projections for 2100 show longer dry spells interspersed with periods of increased extreme rainfall over much of Australia. Extreme fire weather will become more frequent and intense in the south and east, with a shorter period for controlled fuel-reduction burning. Droughts will be more frequent in the south. Tropical cyclones will occur less often but with a greater proportion of high intensity storms.<sup>31</sup>

## HOW CAN WE USE THIS INFORMATION?

An understanding of how climate change may have influenced extreme or severe weather has the potential to help planners provide for a variety of adaptation activities throughout Australia, and across sectors including local government, emergency services, tourism, finance and infrastructure. Such research could also lead to increased skill in the prediction of extreme events for improved prevention, preparedness, response and recovery.

The attribution of climate-related events is a rapidly evolving area of research and new methods and applications continue to be developed. As this research grows, so too will our understanding of the capability of, and challenges involved in, event attribution for our region.



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