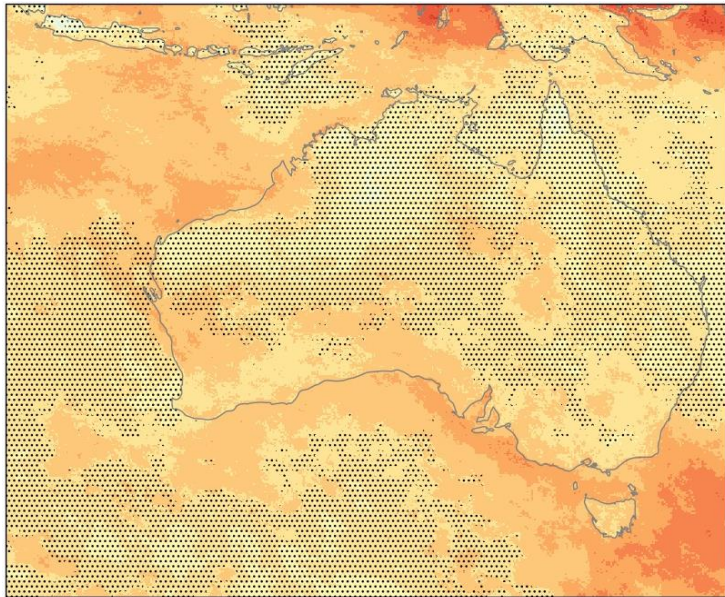




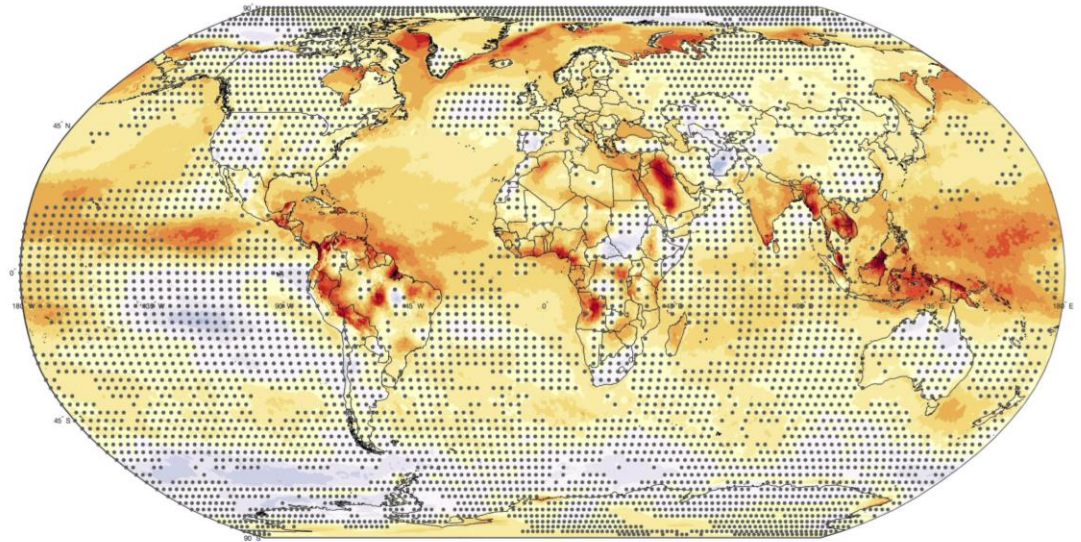
Compound heat events – Extreme, impactful, and unknown

Cass Rogers, Climate Scientist, cassandra.rogers@bom.gov.au

Humid-heat trends



Humid-heat trends



Stand alone heat events → well-understood

Extreme heat is well-researched

- Heatwaves hotter, longer, more frequent
(Perkins-Kirkpatrick & Lewis, 2020)
- Mean temperatures increasing
- Extreme temperatures increasing

Perkins-Kirkpatrick, S.E. and Lewis, S.C., 2020. Increasing trends in regional heatwaves. *Nature communications*, 11(1), pp.1-8.



Stand alone heat events → well-understood

Extreme heat is well-researched

- Heatwaves hotter, longer, more frequent

(Perkins-Kirkpatrick & Lewis, 2020)

- Mean temperatures increasing
- Extreme temperatures increasing

Typically examine dry-bulb temperature

Perkins-Kirkpatrick, S.E. and Lewis, S.C., 2020. Increasing trends in regional heatwaves. *Nature communications*, 11(1), pp.1-8.



Stand alone heat events → well-understood

Extreme heat is well-researched

- Heatwaves hotter, longer, more frequent

(Perkins-Kirkpatrick & Lewis, 2020)

- Mean temperatures increasing
- Extreme temperatures increasing

Typically examine dry-bulb temperature

However, we have a limited understanding of compound extreme heat events and their impacts



Compound events

A combination of multiple drivers and/or hazards that contribute to societal or environmental risk

Zscheischler, J., Martius, O., Westra, S., Bevacqua, E., Raymond, C., Horton, R.M., van den Hurk, B., AghaKouchak, A., Jézéquel, A., Mahecha, M.D. and Maraun, D., 2020. A typology of compound weather and climate events. *Nature reviews earth & environment*, 1(7), pp.333-347.



Compound events

A combination of multiple drivers and/or hazards that contribute to societal or environmental risk

Four categories:

1. Preconditioned
2. Multivariate
3. Temporally compounding
4. Spatially compounding

Zscheischler, J., Martius, O., Westra, S., Bevacqua, E., Raymond, C., Horton, R.M., van den Hurk, B., AghaKouchak, A., Jézéquel, A., Mahecha, M.D. and Maraun, D., 2020. A typology of compound weather and climate events. *Nature reviews earth & environment*, 1(7), pp.333-347.

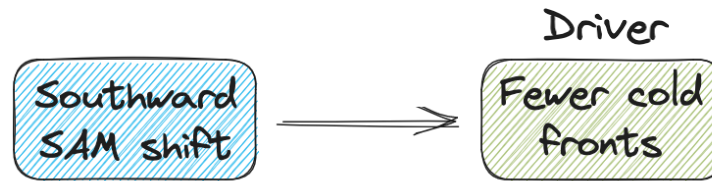


Multivariate compound events

Extreme events with multiple hazards and/or multiple drivers

➔ Same time, same place

Example 1
Multiple hazards
Single driver



Lim et al. 2016. Interaction of the recent 50 year SST trend and La Niña 2010: amplification of the Southern Annular Mode and Australian springtime rainfall. *Climate dynamics*, 47, pp.2273-2291.
Salinger et al. 2019. The unprecedented coupled ocean-atmosphere summer heatwave in the New Zealand region 2017/18: drivers, mechanisms and impacts. *Environmental Research Letters*, 14(4), p.044023.
Rogers et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.

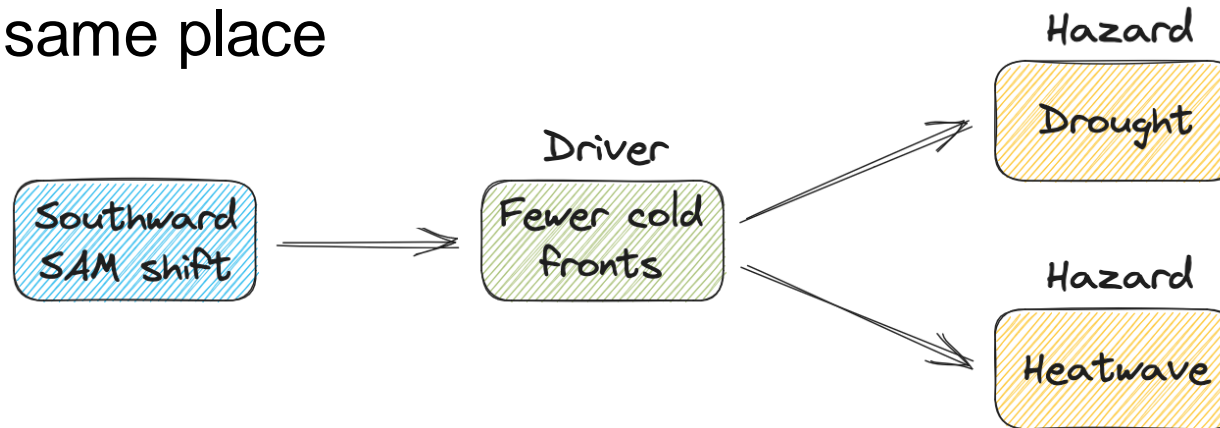


Multivariate compound events

Extreme events with multiple hazards and/or multiple drivers

➔ Same time, same place

Example 1
Multiple hazards
Single driver



Lim et al. 2016. Interaction of the recent 50 year SST trend and La Niña 2010: amplification of the Southern Annular Mode and Australian springtime rainfall. *Climate dynamics*, 47, pp.2273-2291.

Salinger et al. 2019. The unprecedented coupled ocean-atmosphere summer heatwave in the New Zealand region 2017/18: drivers, mechanisms and impacts. *Environmental Research Letters*, 14(4), p.044023.

Rogers et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.

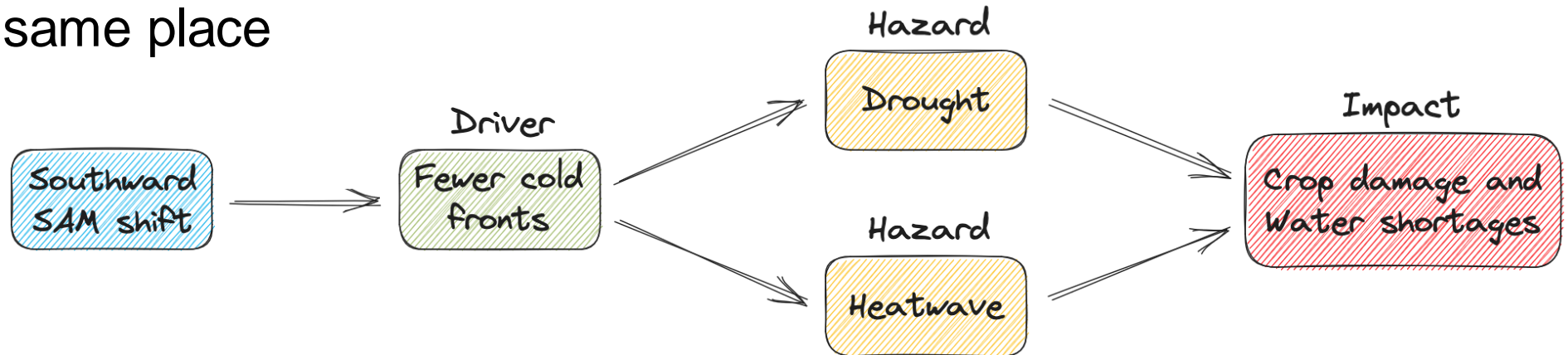


Multivariate compound events

Extreme events with multiple hazards and/or multiple drivers

➔ Same time, same place

Example 1
Multiple hazards
Single driver



Lim et al. 2016. Interaction of the recent 50 year SST trend and La Niña 2010: amplification of the Southern Annular Mode and Australian springtime rainfall. *Climate dynamics*, 47, pp.2273-2291.

Salinger et al. 2019. The unprecedented coupled ocean-atmosphere summer heatwave in the New Zealand region 2017/18: drivers, mechanisms and impacts. *Environmental Research Letters*, 14(4), p.044023.

Rogers et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.

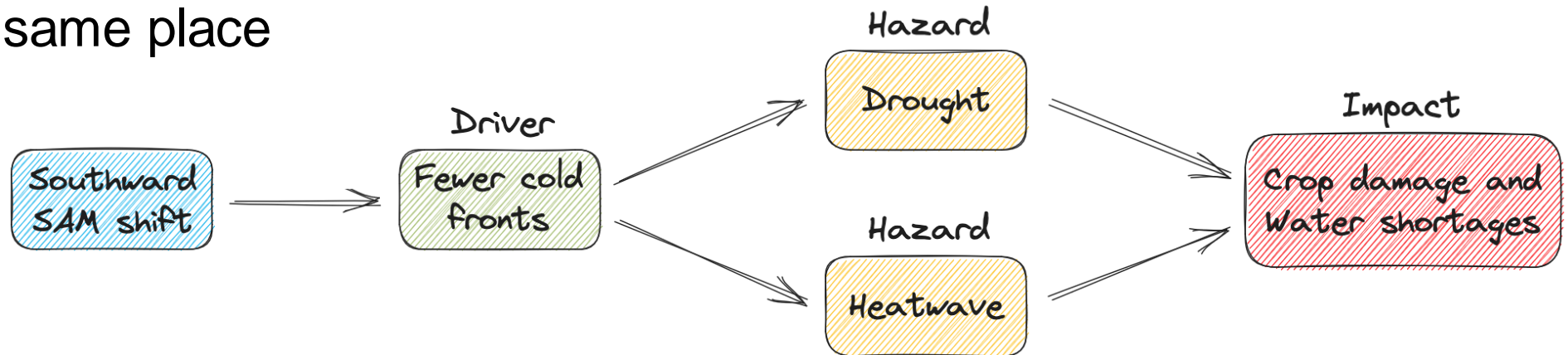


Multivariate compound events

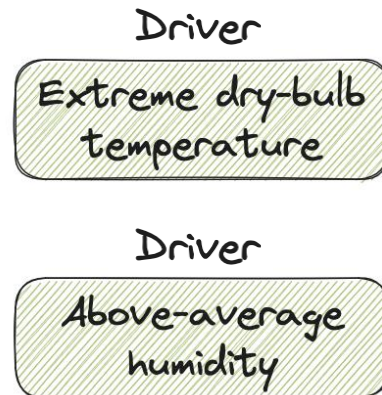
Extreme events with multiple hazards and/or multiple drivers

➔ Same time, same place

Example 1
Multiple hazards
Single driver



Example 2
Multiple drivers
Single hazard



Lim et al. 2016. Interaction of the recent 50 year SST trend and La Niña 2010: amplification of the Southern Annular Mode and Australian springtime rainfall. *Climate dynamics*, 47, pp.2273-2291.

Salinger et al. 2019. The unprecedented coupled ocean-atmosphere summer heatwave in the New Zealand region 2017/18: drivers, mechanisms and impacts. *Environmental Research Letters*, 14(4), p.044023.

Rogers et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.

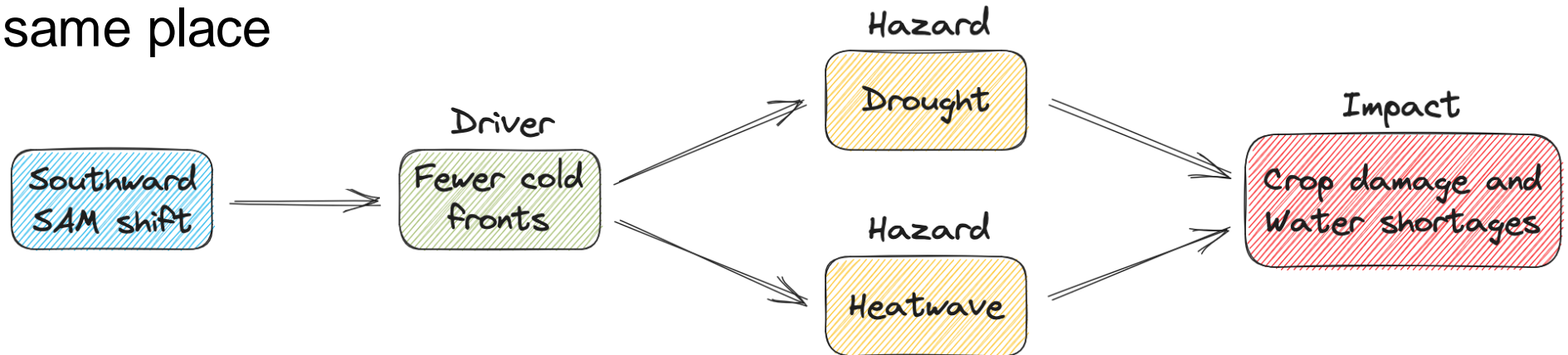


Multivariate compound events

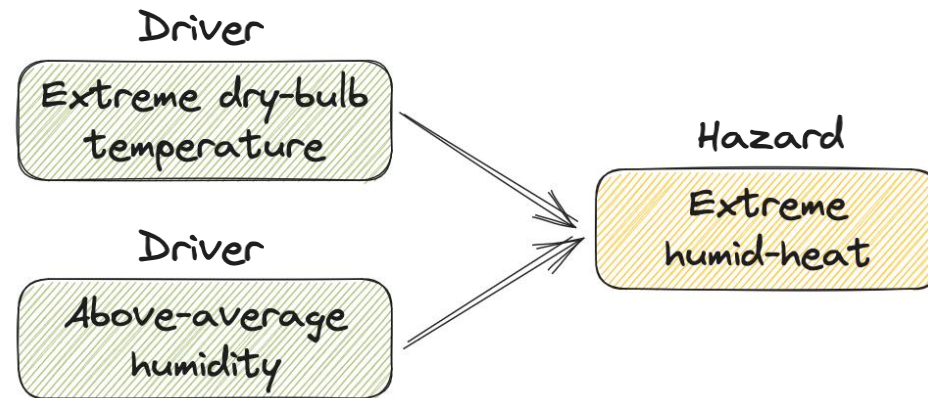
Extreme events with multiple hazards and/or multiple drivers

➔ Same time, same place

Example 1
Multiple hazards
Single driver



Example 2
Multiple drivers
Single hazard



Lim et al. 2016. Interaction of the recent 50 year SST trend and La Niña 2010: amplification of the Southern Annular Mode and Australian springtime rainfall. *Climate dynamics*, 47, pp.2273-2291.

Salinger et al. 2019. The unprecedented coupled ocean-atmosphere summer heatwave in the New Zealand region 2017/18: drivers, mechanisms and impacts. *Environmental Research Letters*, 14(4), p.044023.

Rogers et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.

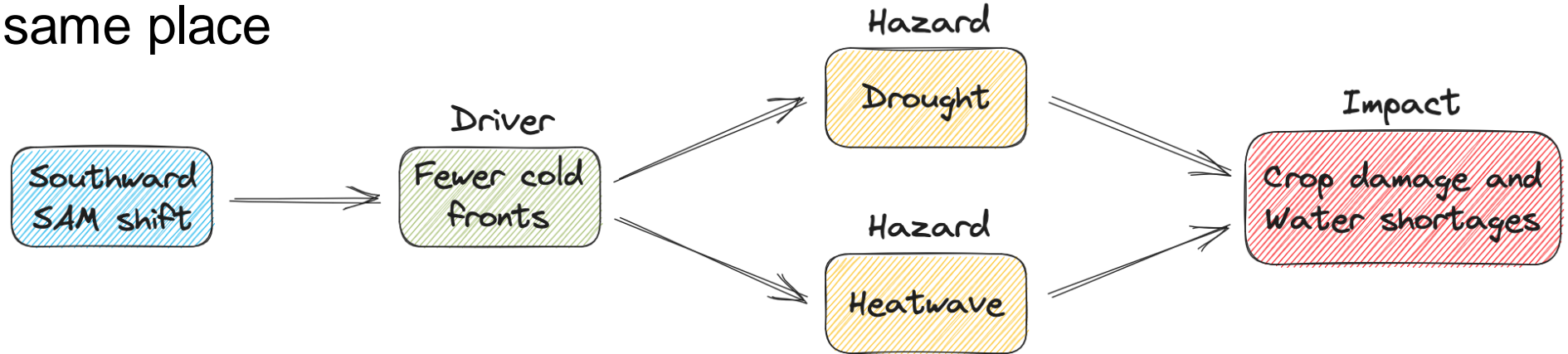


Multivariate compound events

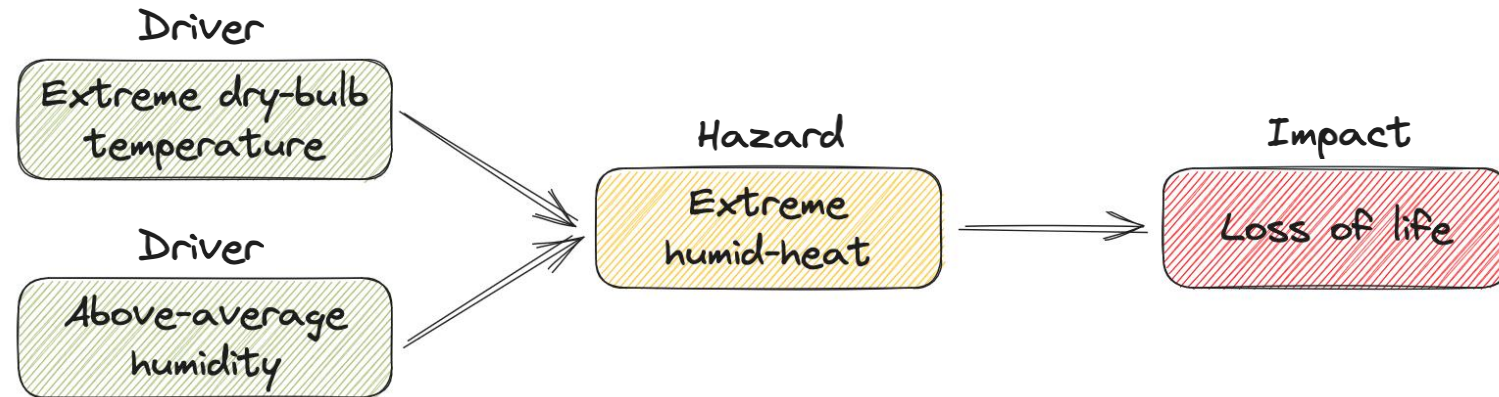
Extreme events with multiple hazards and/or multiple drivers

➔ Same time, same place

Example 1
Multiple hazards
Single driver



Example 2
Multiple drivers
Single hazard



Lim et al. 2016. Interaction of the recent 50 year SST trend and La Niña 2010: amplification of the Southern Annular Mode and Australian springtime rainfall. *Climate dynamics*, 47, pp.2273-2291.

Salinger et al. 2019. The unprecedented coupled ocean-atmosphere summer heatwave in the New Zealand region 2017/18: drivers, mechanisms and impacts. *Environmental Research Letters*, 14(4), p.044023.

Rogers et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.



Why should compound events research be a priority?

If we only consider isolated extremes, we risk *underestimating* highly impactful and unprecedented future extremes

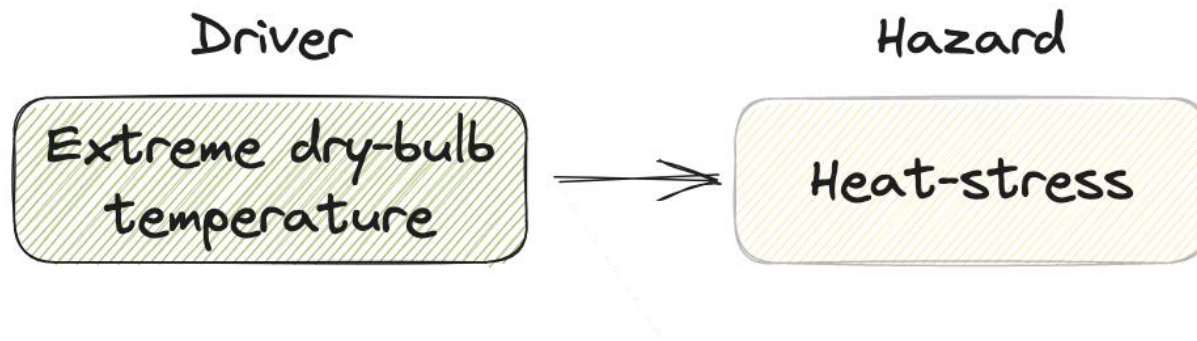
Driver

Extreme dry-bulb
temperature



Why should compound events research be a priority?

If we only consider isolated extremes, we risk *underestimating* highly impactful and unprecedented future extremes



Why should compound events research be a priority?

If we only consider isolated extremes, we risk *underestimating* highly impactful and unprecedented future extremes



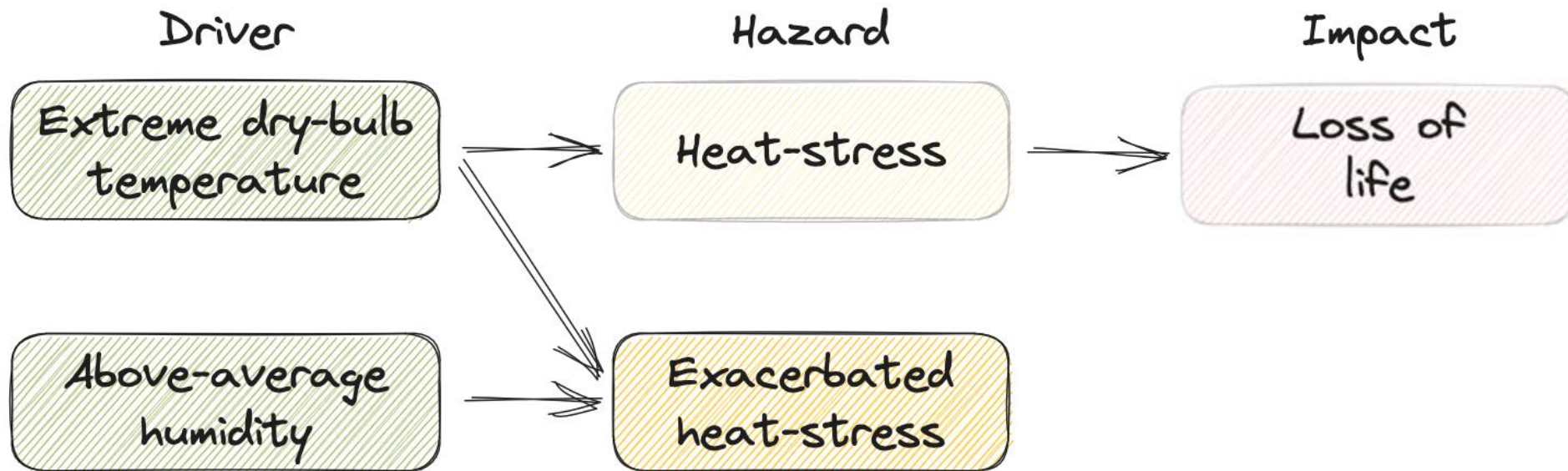
Why should compound events research be a priority?

If we only consider isolated extremes, we risk *underestimating* highly impactful and unprecedented future extremes



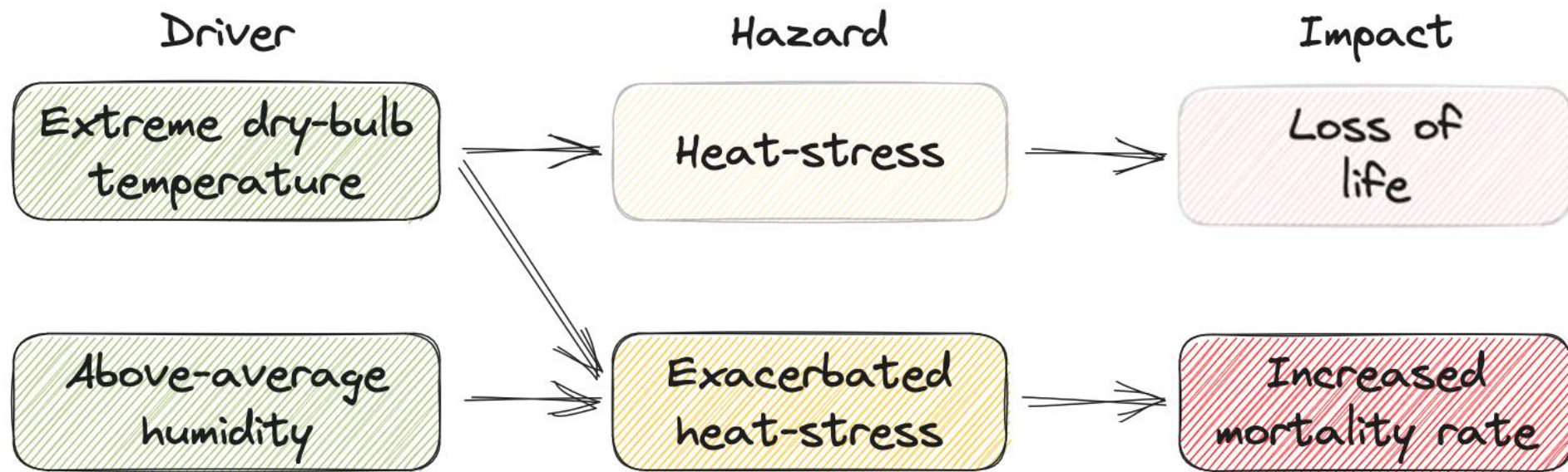
Why should compound events research be a priority?

If we only consider isolated extremes, we risk *underestimating* highly impactful and unprecedented future extremes



Why should compound events research be a priority?

If we only consider isolated extremes, we risk *underestimating* highly impactful and unprecedented future extremes



Compound extreme humid-heat is more hazardous than dry-heat

➔ Reduced ability to cool via sweating

Sherwood, S.C. and Huber, M., 2010. An adaptability limit to climate change due to heat stress. *Proceedings of the National Academy of Sciences*, 107(21), pp.9552-9555.

Sherwood & Huber (2010)



Why should compound events research be a priority?

We also risk *underpreparing* for extreme events



Why should compound events research be a priority?

We also risk *underpreparing* for extreme events

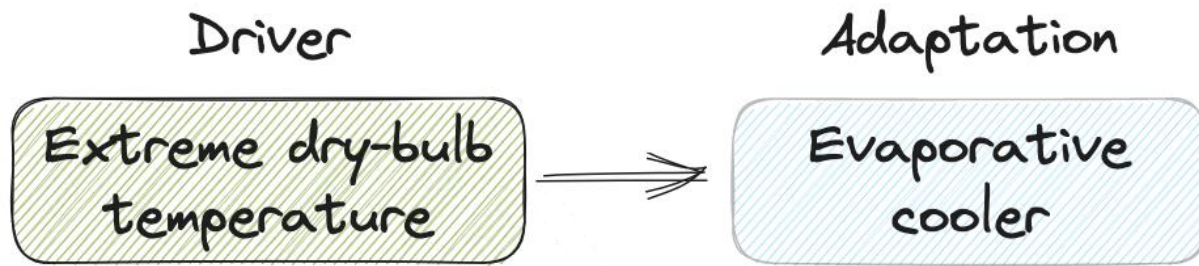
Driver

Extreme dry-bulb
temperature



Why should compound events research be a priority?

We also risk *underpreparing* for extreme events



Why should compound events research be a priority?

We also risk *underpreparing* for extreme events

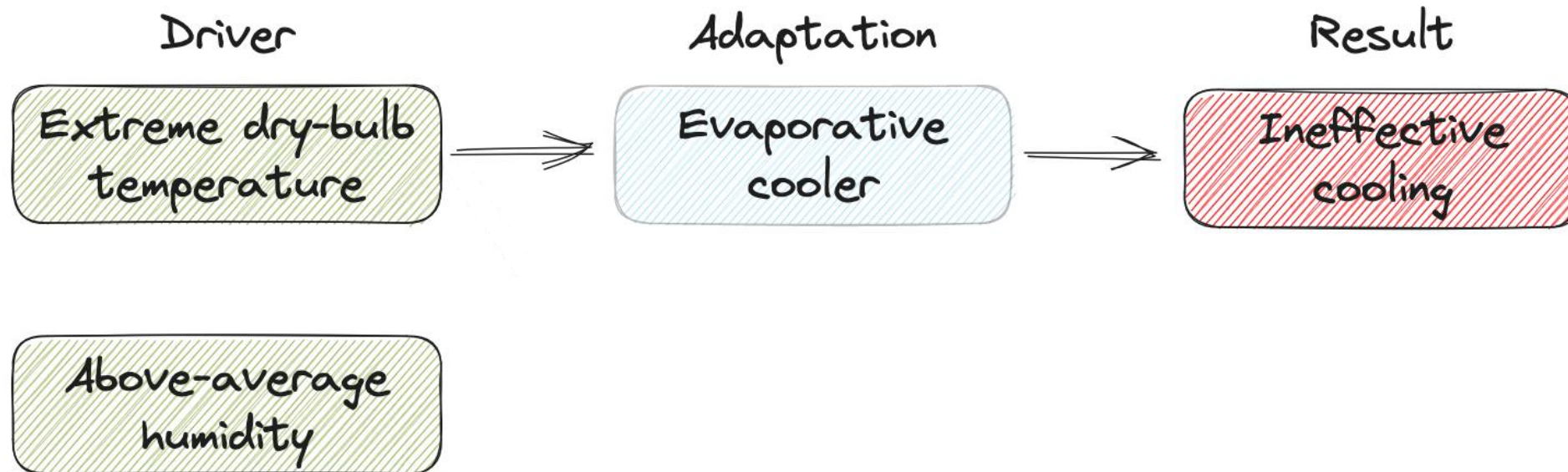


Evaporative coolers depend on latent cooling to reduce air temperature
→ Less effective latent cooling with high humidity



Why should compound events research be a priority?

We also risk *underpreparing* for extreme events

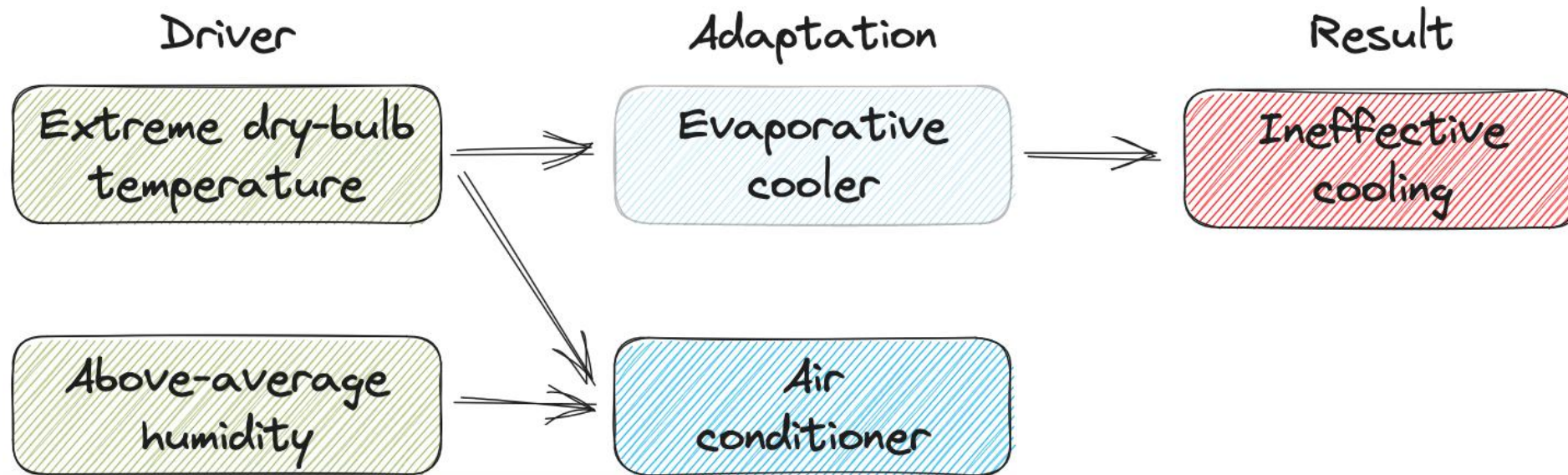


Evaporative coolers depend on latent cooling to reduce air temperature
→ Less effective latent cooling with high humidity



Why should compound events research be a priority?

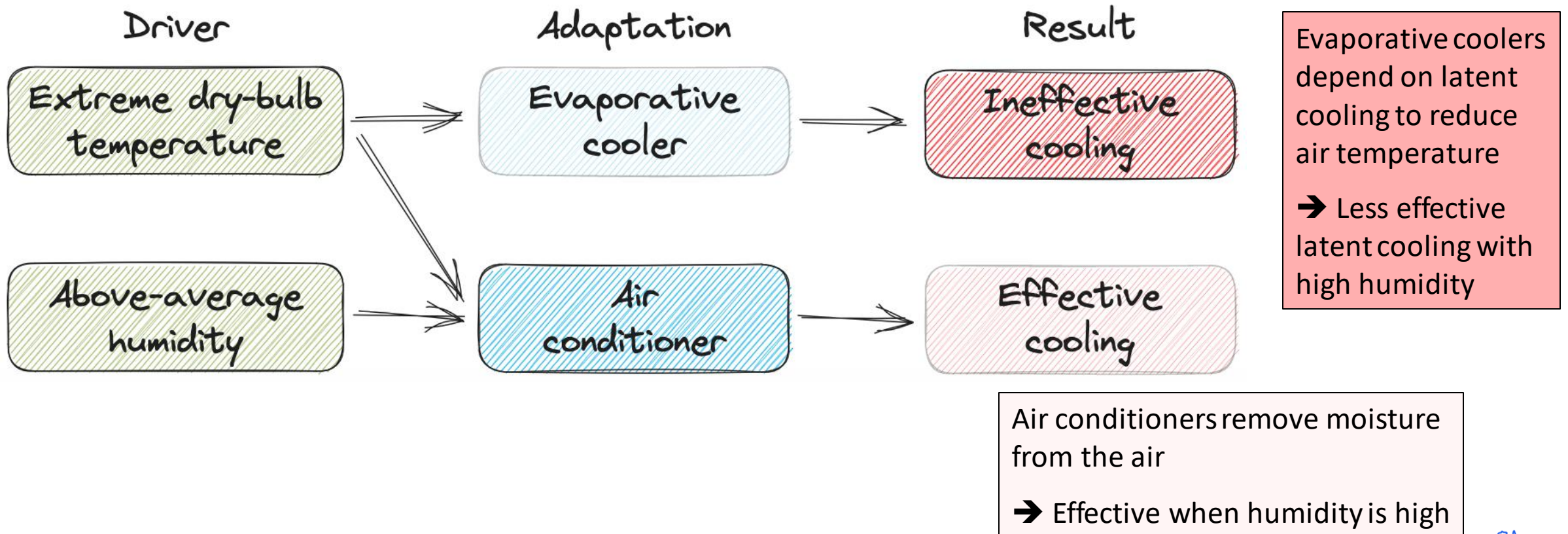
We also risk *underpreparing* for extreme events



Evaporative coolers depend on latent cooling to reduce air temperature
➔ Less effective latent cooling with high humidity

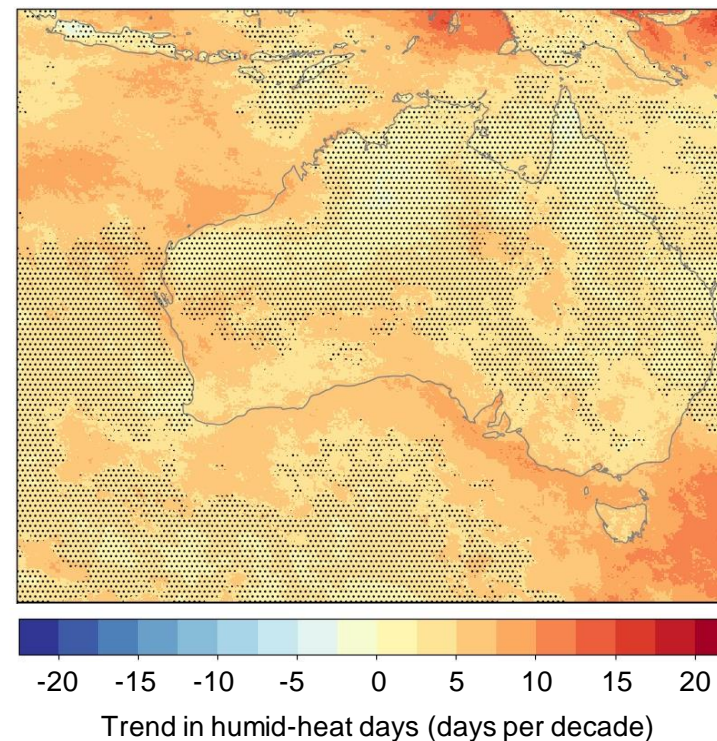
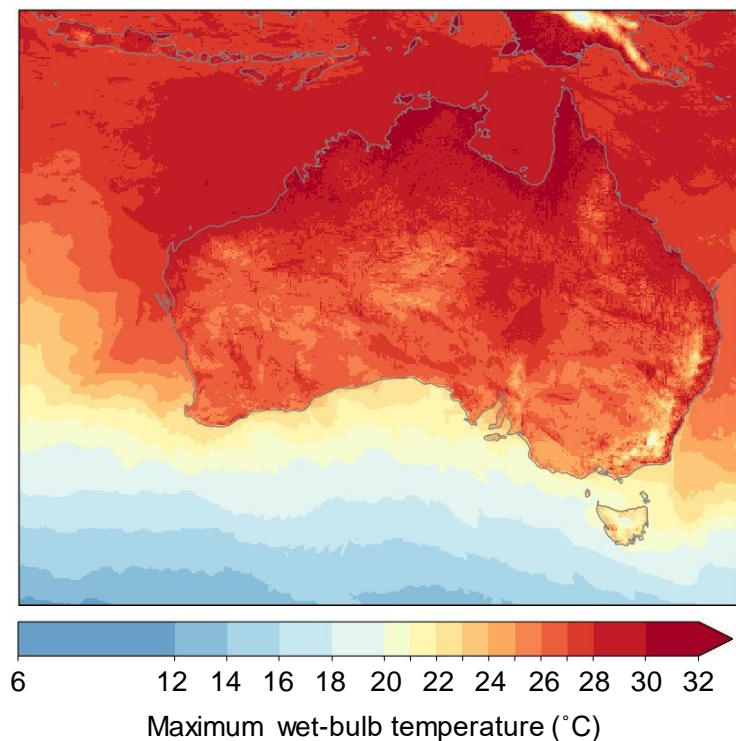
Why should compound events research be a priority?

We also risk *underpreparing* for extreme events



Understanding extreme humid-heat trends over Australia

Collaborators: Mitch Black and Rob Warren



Stippling = no significant trend



How has dry- and humid-heat changed?

Dry-heat

Heatwaves hotter, longer, more frequent
(Perkins-Kirkpatrick & Lewis, 2020)

Mean temperatures increasing

Extreme temperatures increasing



Changes are generally well understood

Perkins-Kirkpatrick, S.E. and Lewis, S.C., 2020. Increasing trends in regional heatwaves. *Nature communications*, 11(1), pp.1-8.

Raymond, C., Matthews, T. and Horton, R.M., 2020. The emergence of heat and humidity too severe for human tolerance. *Science Advances*, 6(19), p.eaaw1838.

Rogers, C.D., Ting, M., et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.



How has dry- and humid-heat changed?

Dry-heat

Heatwaves hotter, longer, more frequent
(Perkins-Kirkpatrick & Lewis, 2020)

Mean temperatures increasing

Extreme temperatures increasing



Changes are generally well understood

Humid-heat

Wet-bulb temperature extremes have increased in many locations

- Station analyses (Raymond et al., 2020)
- Gridded analyses (Rogers et al., 2021)

Perkins-Kirkpatrick, S.E. and Lewis, S.C., 2020. Increasing trends in regional heatwaves. *Nature communications*, 11(1), pp.1-8.

Raymond, C., Matthews, T. and Horton, R.M., 2020. The emergence of heat and humidity too severe for human tolerance. *Science Advances*, 6(19), p.eaaw1838.

Rogers, C.D., Ting, M., et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.



How has dry- and humid-heat changed?

Dry-heat

Heatwaves hotter, longer, more frequent
(Perkins-Kirkpatrick & Lewis, 2020)

Mean temperatures increasing

Extreme temperatures increasing



Changes are generally well understood

Humid-heat

Wet-bulb temperature extremes have increased in many locations

- Station analyses (Raymond et al., 2020)
- Gridded analyses (Rogers et al., 2021)



Changes comparatively poorly understood

Perkins-Kirkpatrick, S.E. and Lewis, S.C., 2020. Increasing trends in regional heatwaves. *Nature communications*, 11(1), pp.1-8.

Raymond, C., Matthews, T. and Horton, R.M., 2020. The emergence of heat and humidity too severe for human tolerance. *Science Advances*, 6(19), p.eaaw1838.

Rogers, C.D., Ting, M., et al. 2021. Recent increases in exposure to extreme humid-heat events disproportionately affect populated regions. *Geophysical Research Letters*, 48(19), p.e2021GL094183.



Extreme heat frequency trends

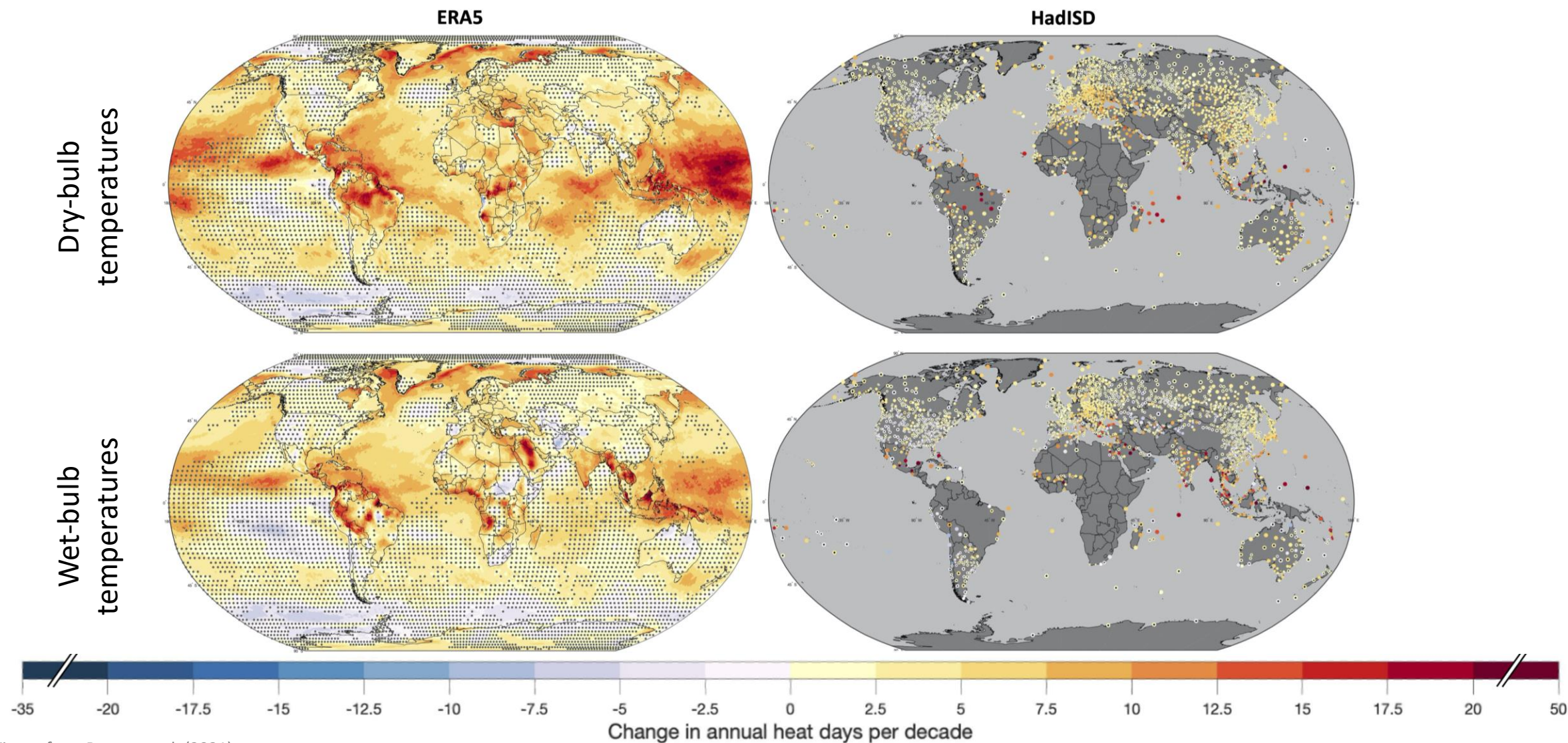
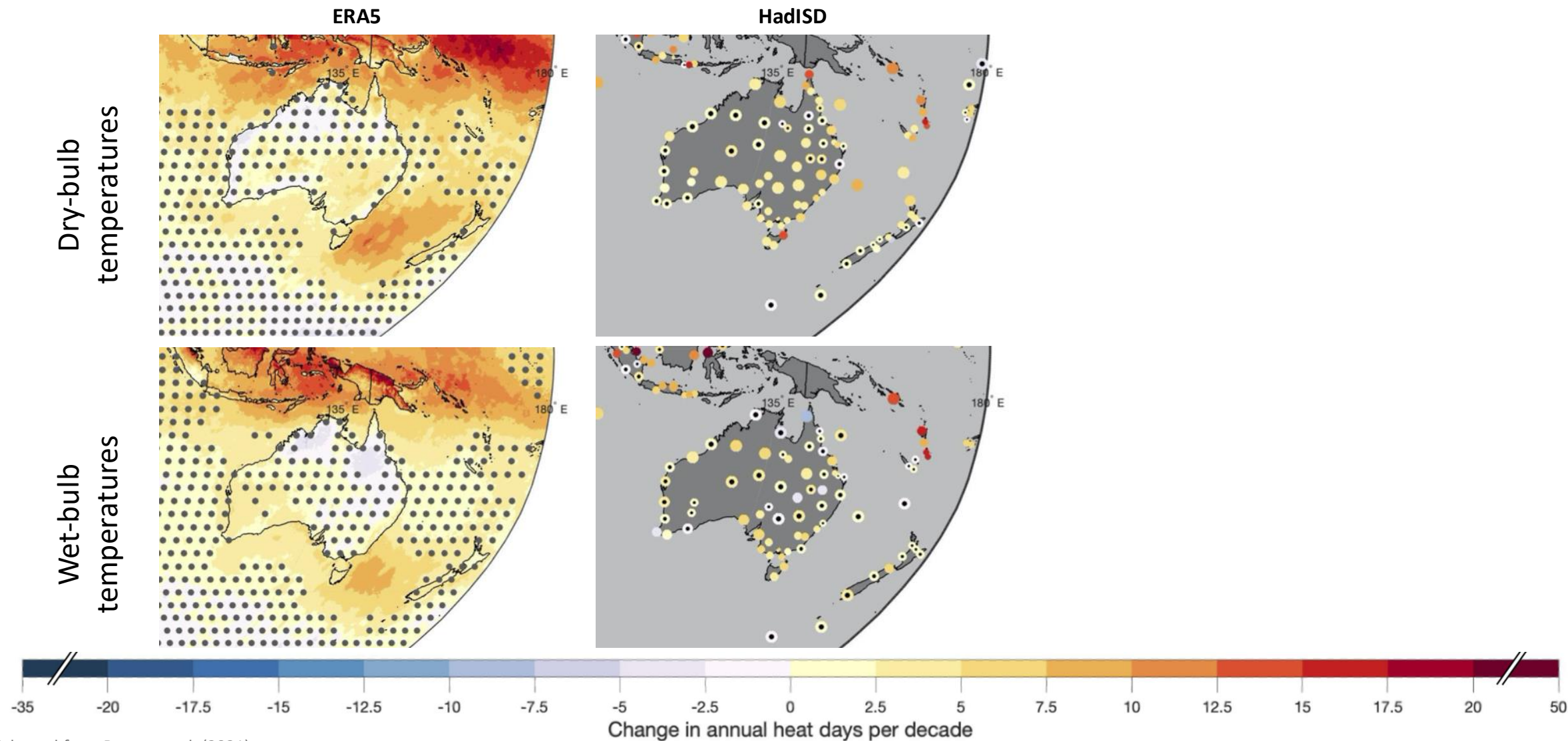


Figure from Rogers et al. (2021)

Stippling = no significant trend



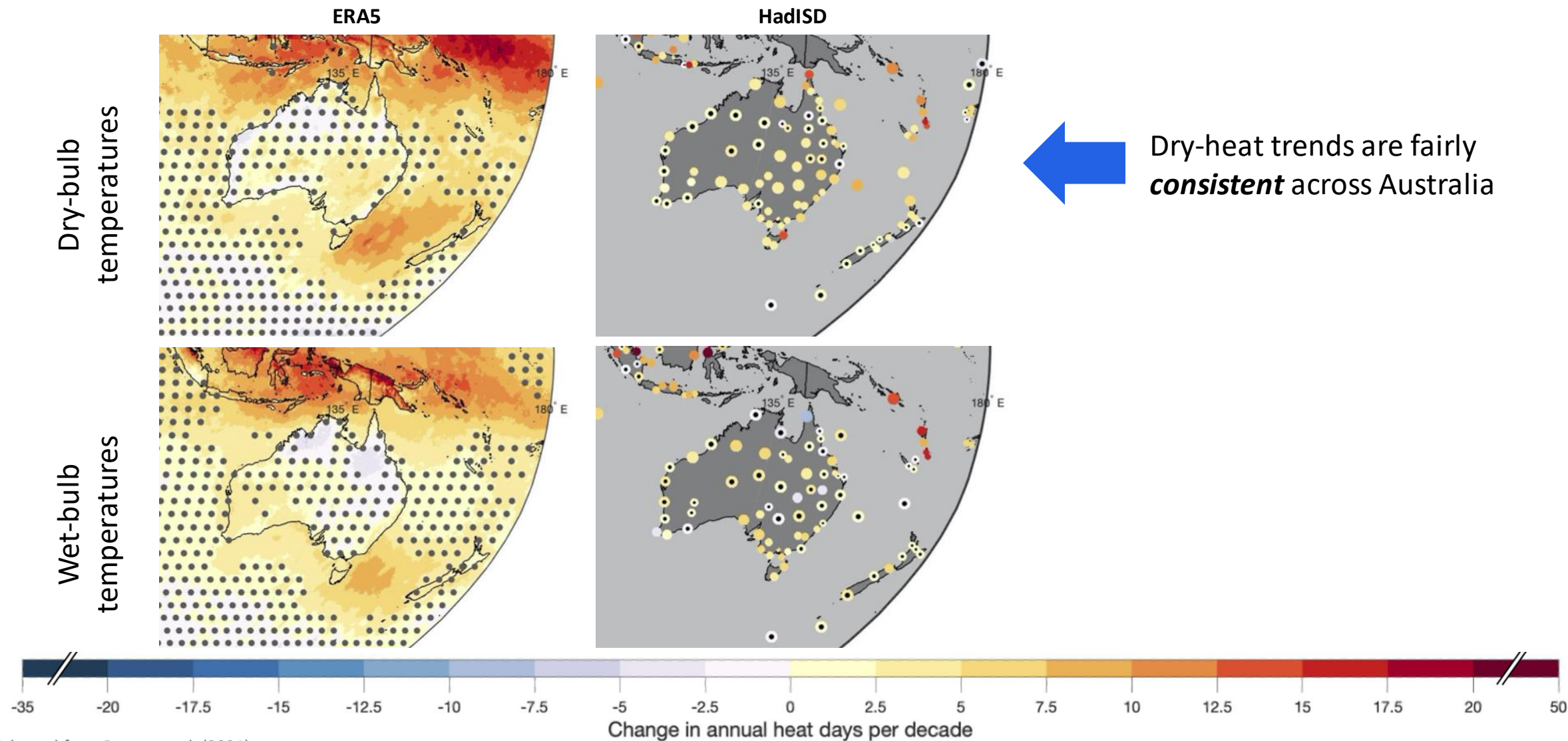
Extreme heat frequency trends over Australia



Adapted from Rogers et al. (2021)



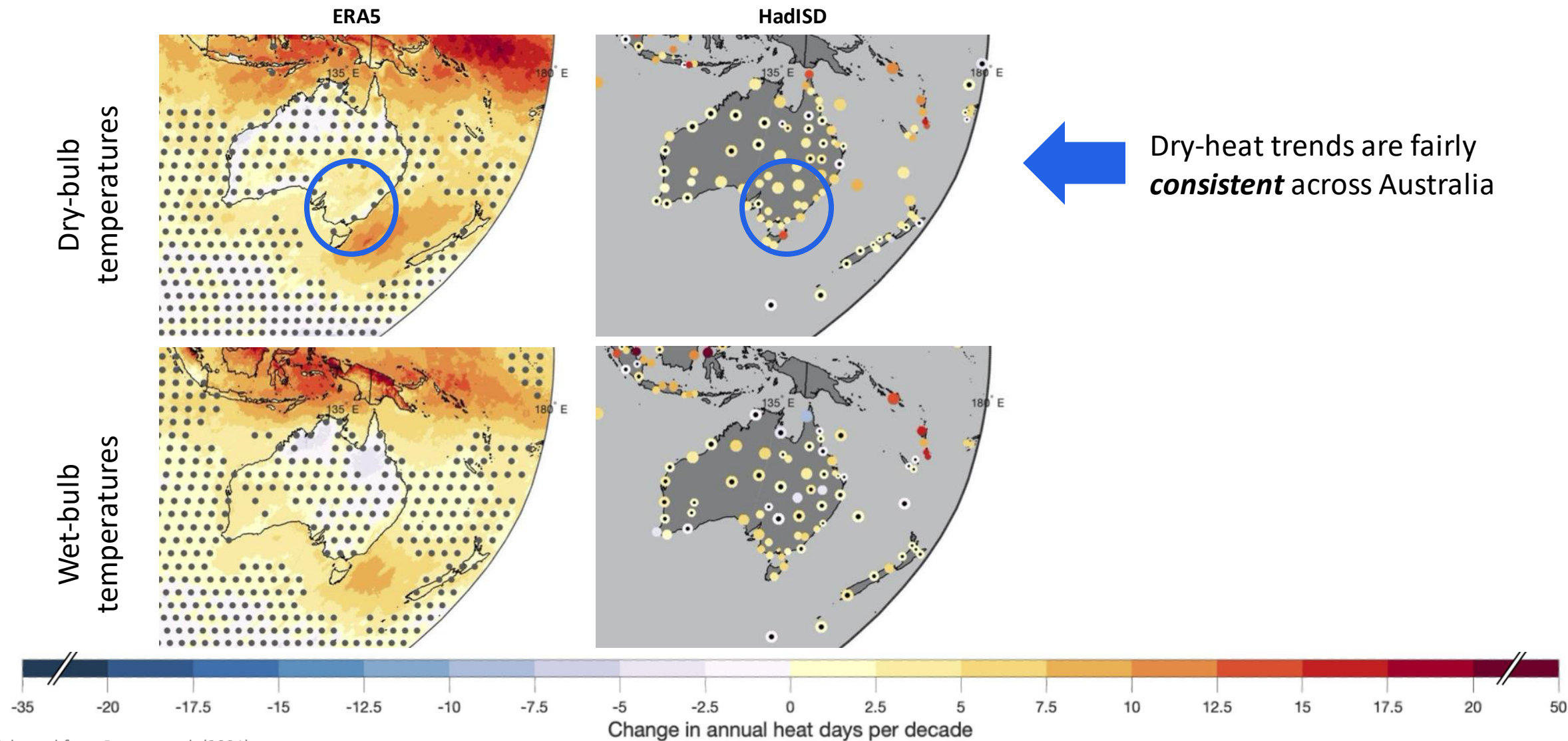
Extreme heat frequency trends over Australia



Adapted from Rogers et al. (2021)



Extreme heat frequency trends over Australia

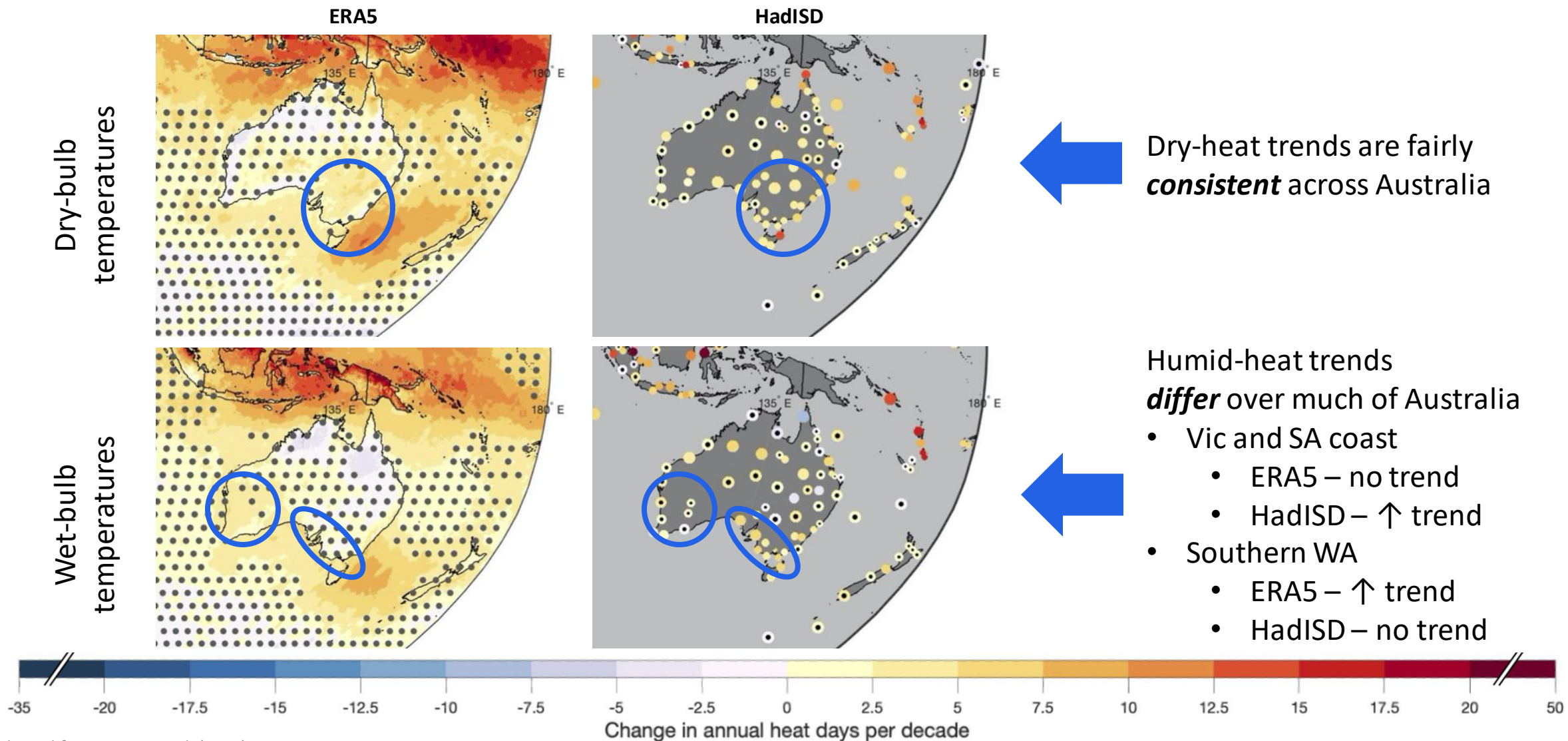


Adapted from Rogers et al. (2021)

Stippling = no significant trend



Extreme heat frequency trends over Australia



Adapted from Rogers et al. (2021)



Aim: How has humid-heat changed over Australia?

Calculation of wet-bulb temperature

- Dry-bulb temperature
- Pressure
- A humidity metric (specific humidity, relative humidity, or dew-point temperature)



Aim: How has humid-heat changed over Australia?

Calculation of wet-bulb temperature

- Dry-bulb temperature
- Pressure
- A humidity metric (specific humidity, relative humidity, or dew-point temperature)

Examination of wet-bulb temperature trends over Australia using multiple datasets

- ERA5
 - Global data
- BARRA1
 - Higher resolution than ERA5
 - Data only available over Australia and surrounding regions
- The Bureau's automatic weather station data
 - Including some actual (not derived) wet-bulb temperature observations



Calculating wet-bulb temperature – our new fast and accurate method

Commonly used methods in the literature

- Davies-Jones (2008)
 - A highly-accurate iterative method
 - Slow and computationally intensive to run
- Stull (2011)
 - Fast to run
 - Large errors for extremely hot temperatures ($>1^{\circ}\text{C}$)

Davies-Jones, R., 2008. An efficient and accurate method for computing the wet-bulb temperature along pseudoadiabats. *Monthly Weather Review*, 136(7), pp.2764-2785.

Stull, R., 2011. Wet-bulb temperature from relative humidity and air temperature. *Journal of applied meteorology and climatology*, 50(11), pp.2267-2269.

Moisseeva, N. and Stull, R., 2017. A noniterative approach to modelling moist thermodynamics. *Atmospheric Chemistry and Physics*, 17(24), pp.15037-15043.

Romps, D.M., 2017. Exact expression for the lifting condensation level. *Journal of the Atmospheric Sciences*, 74(12), pp.3891-3900.



Calculating wet-bulb temperature – our new fast and accurate method

Commonly used methods in the literature

- Davies-Jones (2008)
 - A highly-accurate iterative method
 - Slow and computationally intensive to run
- Stull (2011)
 - Fast to run
 - Large errors for extremely hot temperatures ($>1^{\circ}\text{C}$)

We are developing a new method to calculate wet-bulb temperature

- NEWT – The Noniterative Evaluation of Wet-bulb Temperature method
- We implement equations from Romps (2017) and Moisseeva and Stull (2017)
- Our method should produce highly accurate data (similar to Davies-Jones, 2008), but much faster

Davies-Jones, R., 2008. An efficient and accurate method for computing the wet-bulb temperature along pseudoadiabats. *Monthly Weather Review*, 136(7), pp.2764-2785.

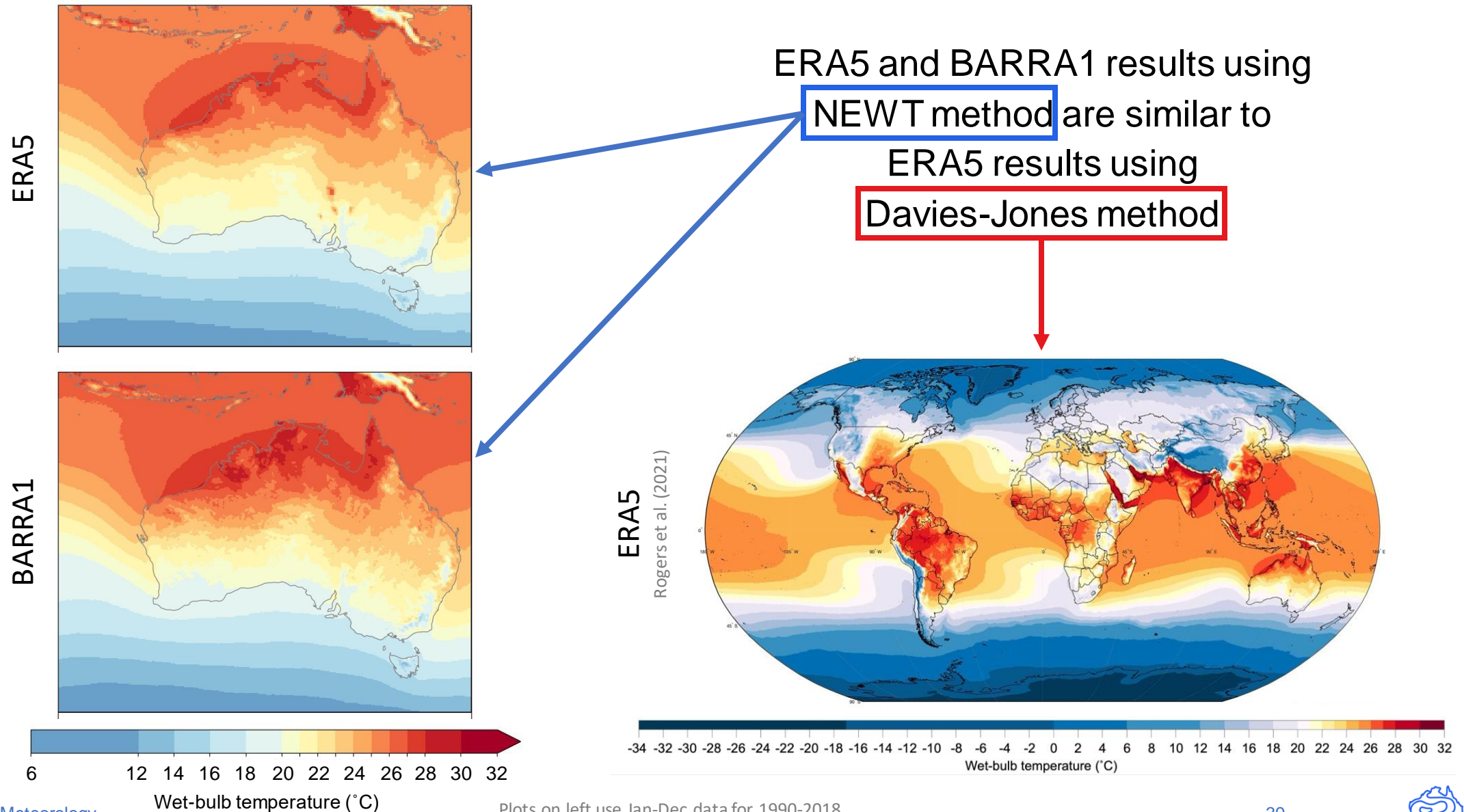
Stull, R., 2011. Wet-bulb temperature from relative humidity and air temperature. *Journal of applied meteorology and climatology*, 50(11), pp.2267-2269.

Moisseeva, N. and Stull, R., 2017. A noniterative approach to modelling moist thermodynamics. *Atmospheric Chemistry and Physics*, 17(24), pp.15037-15043.

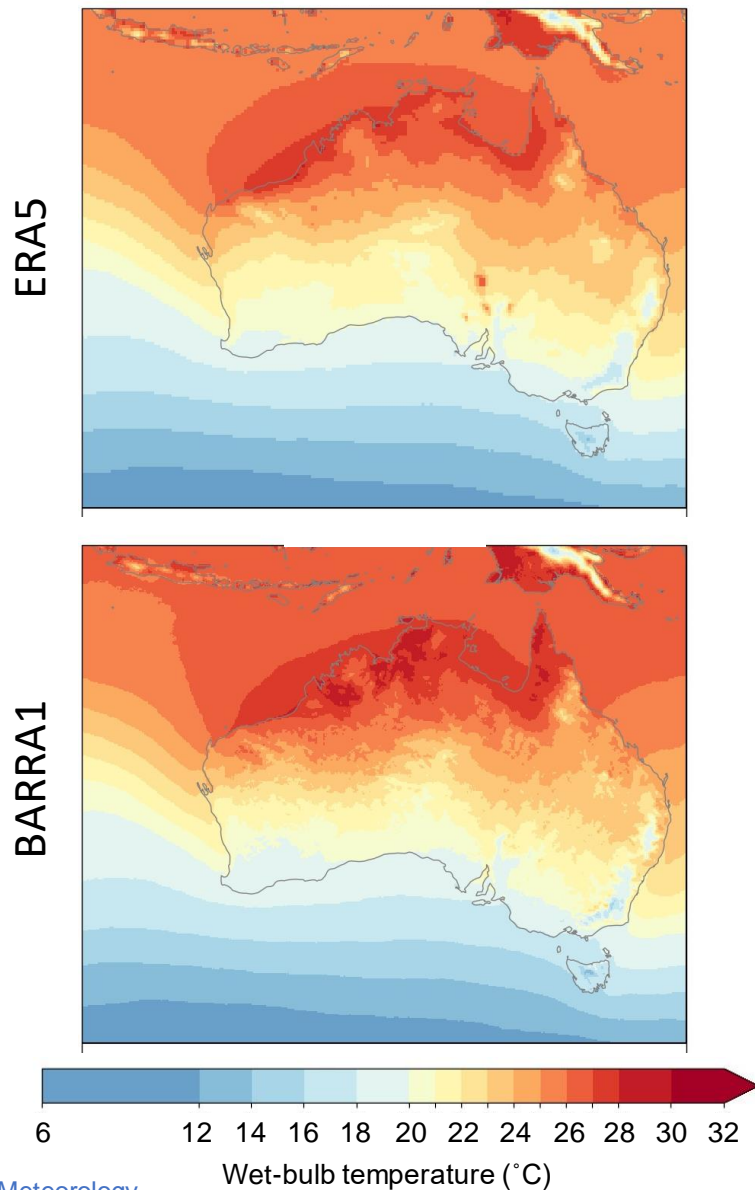
Romps, D.M., 2017. Exact expression for the lifting condensation level. *Journal of the Atmospheric Sciences*, 74(12), pp.3891-3900.



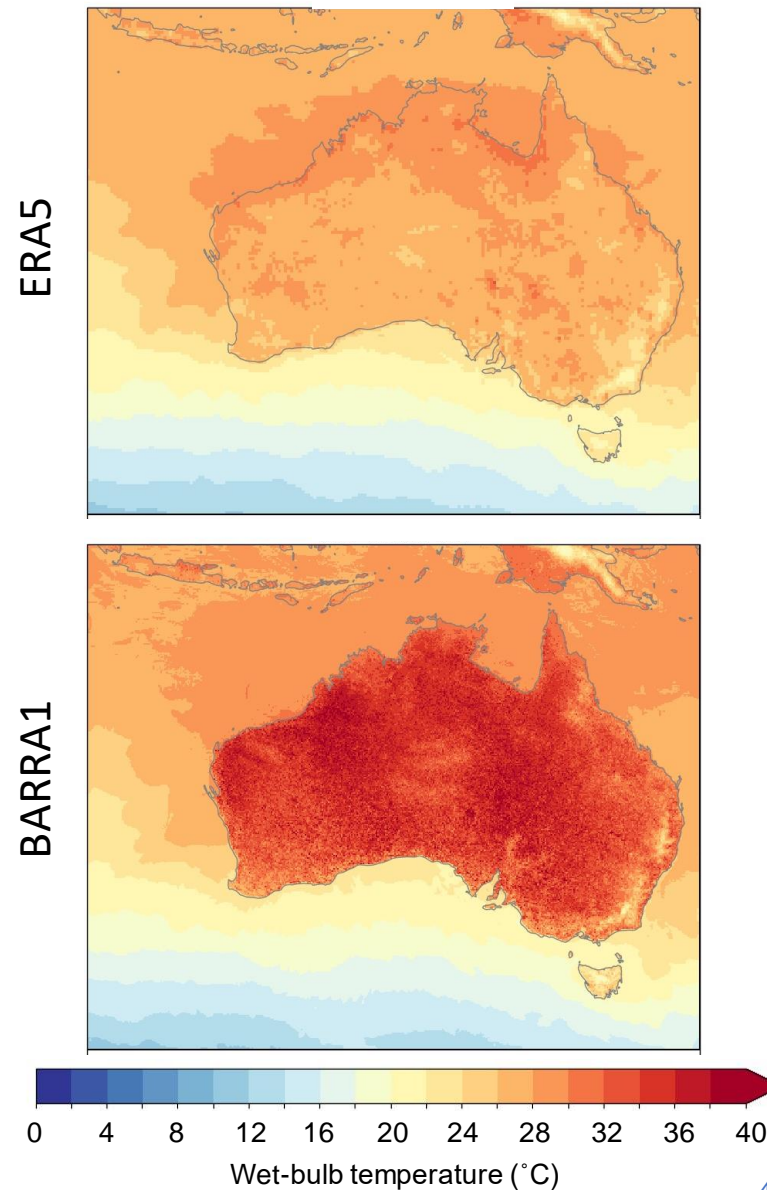
95th percentile of maximum daily wet-bulb temperature (Jan-Dec)



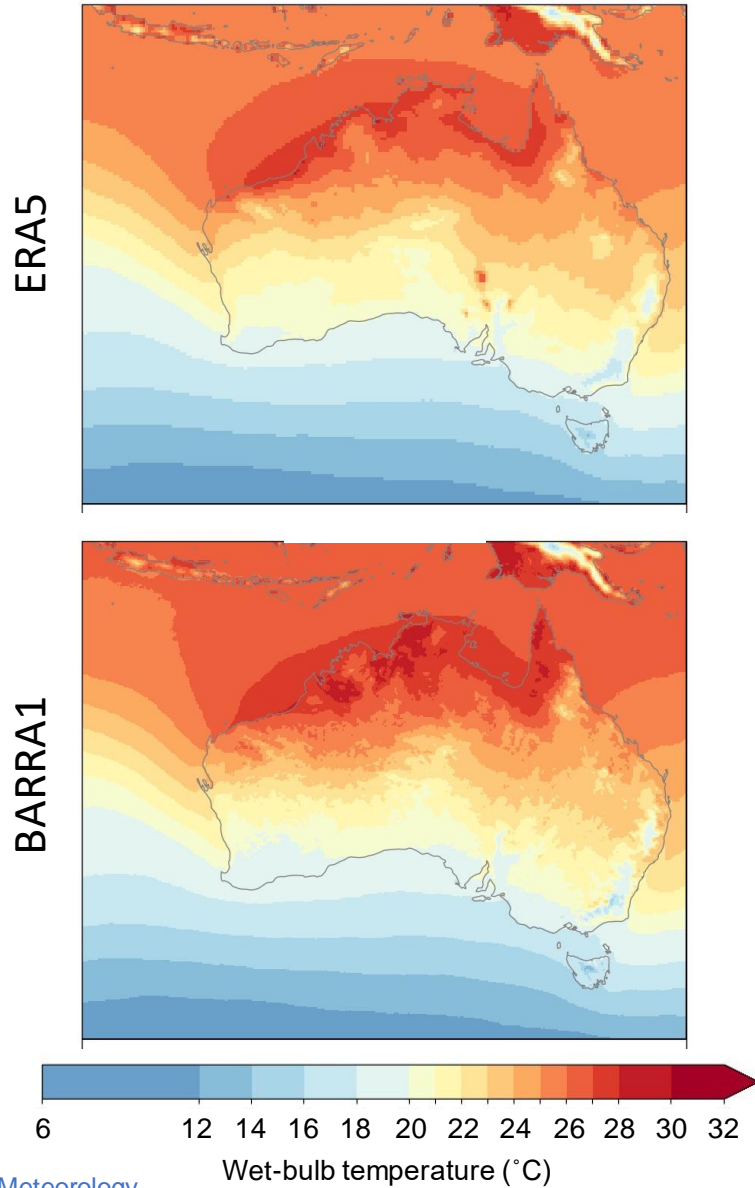
95th percentile of maximum daily wet-bulb temperature



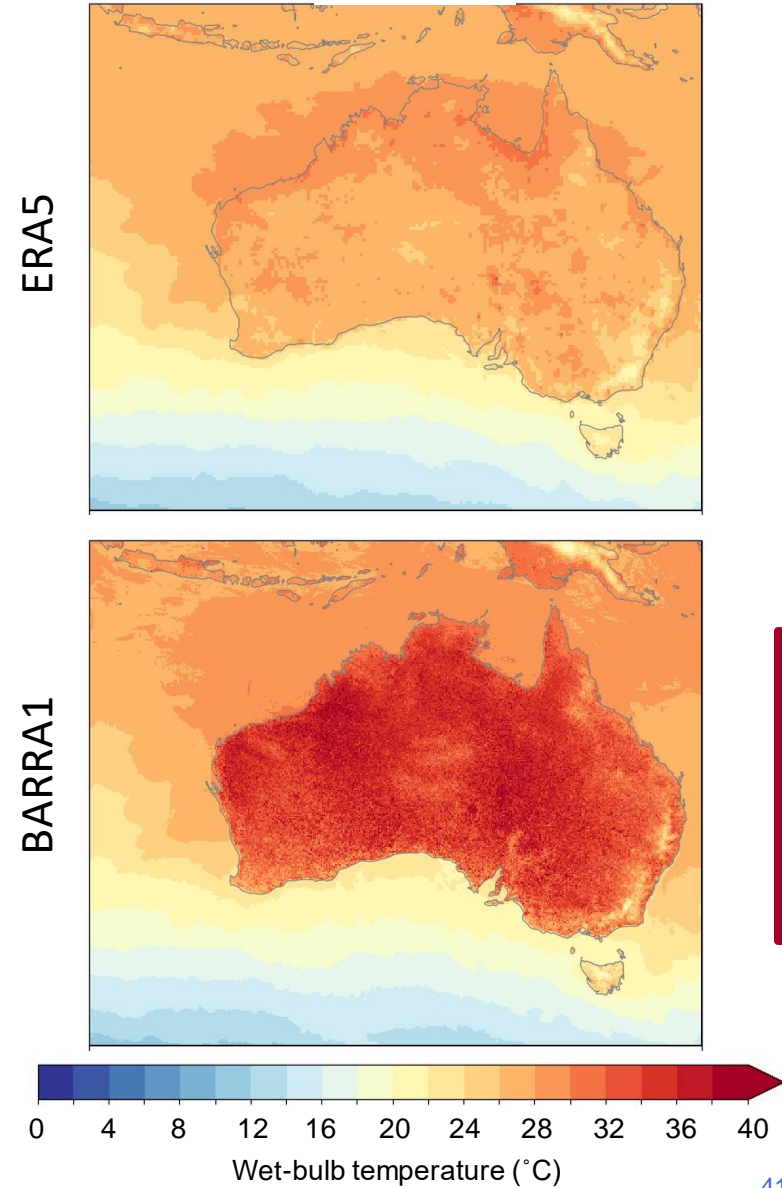
Maximum daily wet-bulb temperature



95th percentile of maximum daily wet-bulb temperature



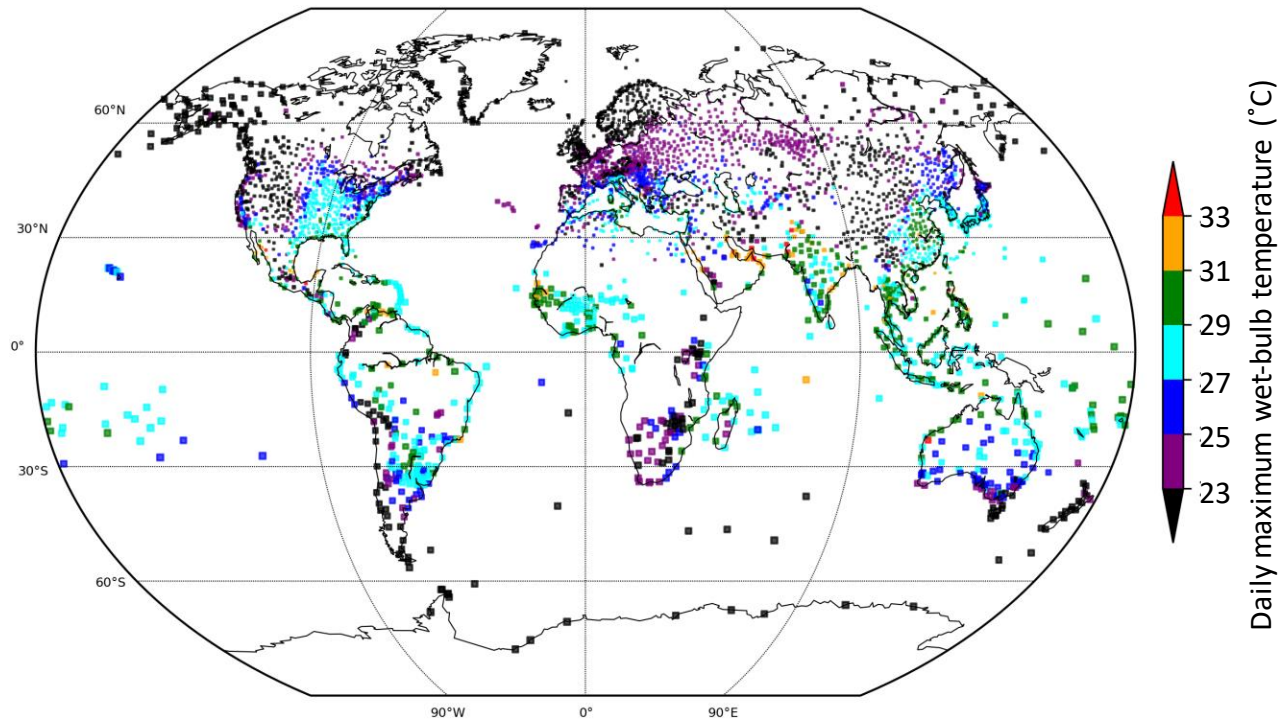
Maximum daily wet-bulb temperature



Maximum wet-bulb temperatures are too high in BARRA1

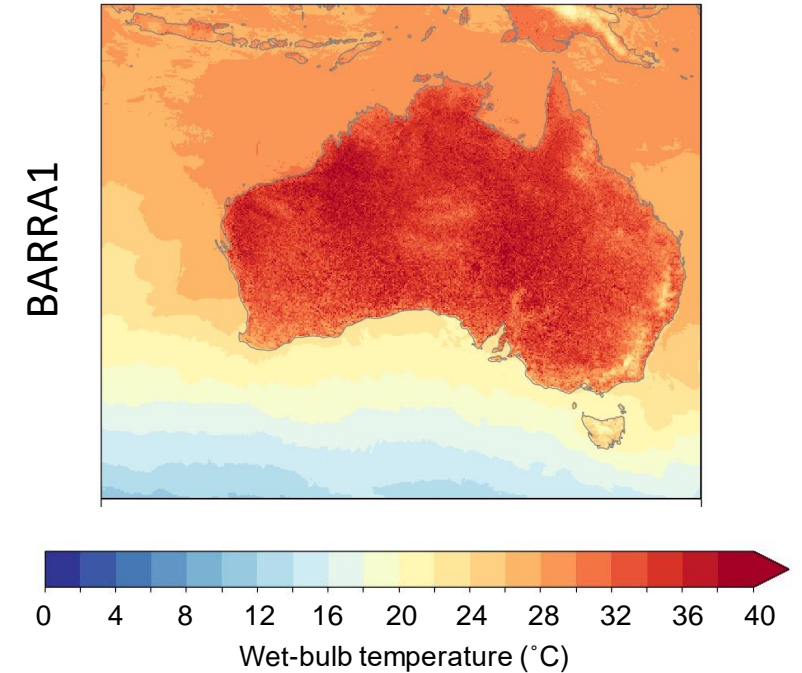


BARRA1 wet-bulb temperature is much greater than in other studies



99.9th percentile of maximum daily wet-bulb temperature

99.9th percentile of maximum daily wet-bulb temperature



Raymond et al. (2020)

“While our analysis of weather stations indicates that [wet-bulb temperature] has already been reported as having exceeded 35°C in limited areas for short periods, this has not yet occurred at the regional scale represented by reanalysis data”

Left figure from Raymond et al. (2020)

Raymond, C., Matthews, T. and Horton, R.M., 2020. The emergence of heat and humidity too severe for human tolerance. *Science Advances*, 6(19), p.eaaw1838.



Calculating wet-bulb temperature using BARRA1

- Wet-bulb temperature is too high in BARRA1
- Known high bias in screen level specific humidity
- Common solution is to replace screen level moisture with lowest model level moisture

ERA5

- Pressure (surface)
- Dry-bulb temperature (screen level)
- Dew-point temperature (screen level)

BARRA1 – screen level

- Pressure (surface)
- Dry-bulb temperature (screen level)
- Dew-point temperature (screen level)



Calculating wet-bulb temperature using BARRA1

- Wet-bulb temperature is too high in BARRA1
- Known high bias in screen level specific humidity
- Common solution is to replace screen level moisture with lowest model level moisture

ERA5

- Pressure (surface)
- Dry-bulb temperature (screen level)
- Dew-point temperature (screen level)

BARRA1 – screen level

- Pressure (surface)
- Dry-bulb temperature (screen level)
- Dew-point temperature (screen level)

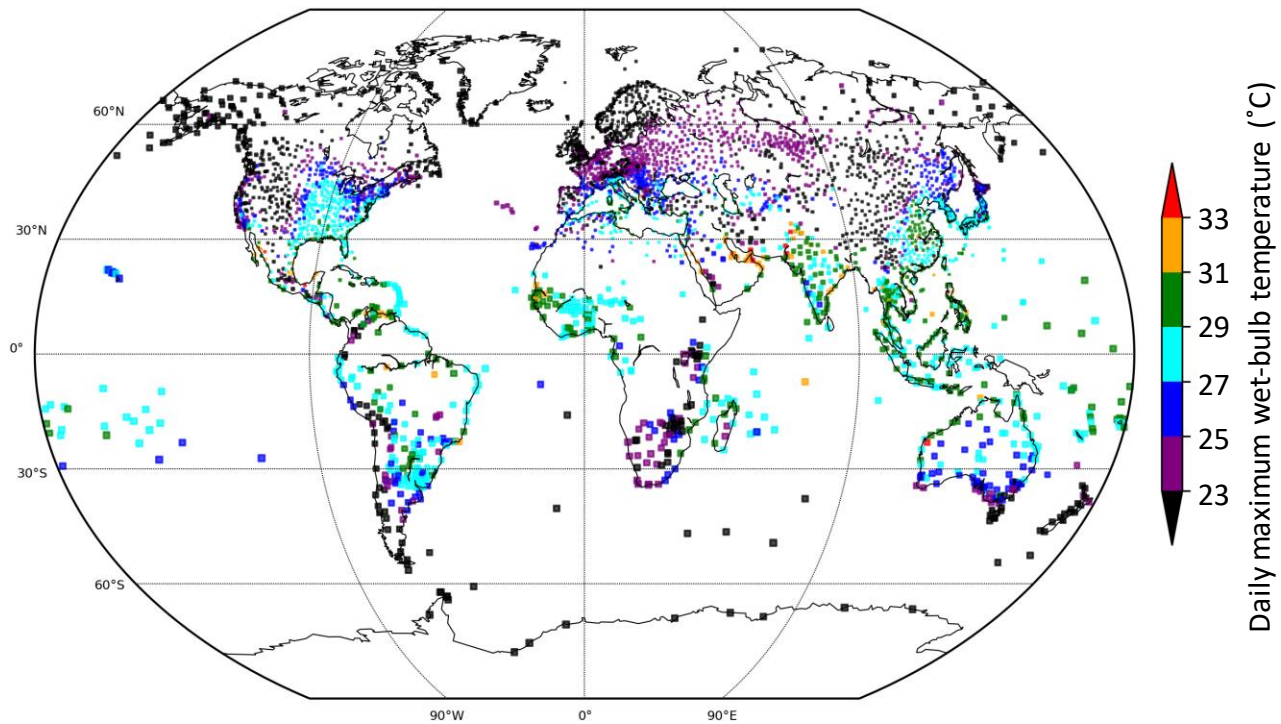


BARRA1 – lowest model level

- Pressure (surface)
- Dry-bulb temperature (screen level)
- Specific humidity (lowest model level)



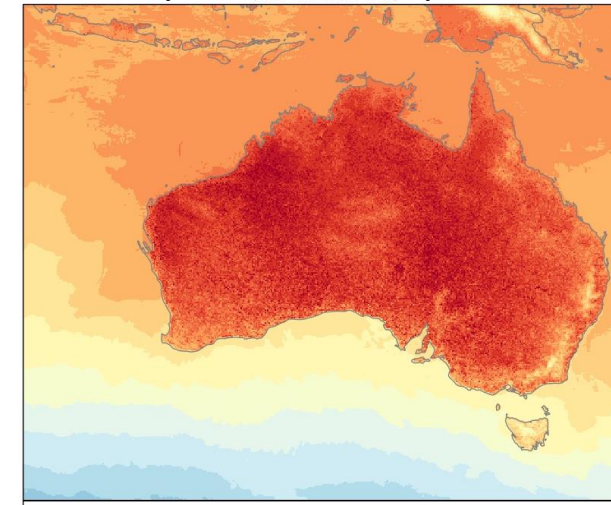
Lowest model level moisture produces more realistic wet-bulb temperature than screen level moisture



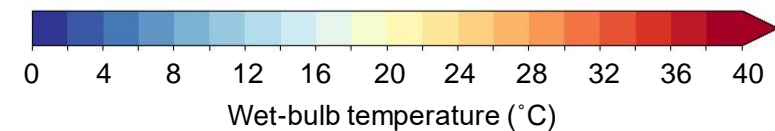
99.9th percentile of maximum daily wet-bulb temperature

BARRA1
screen level

99.9th percentile of maximum
daily wet-bulb temperature



Before



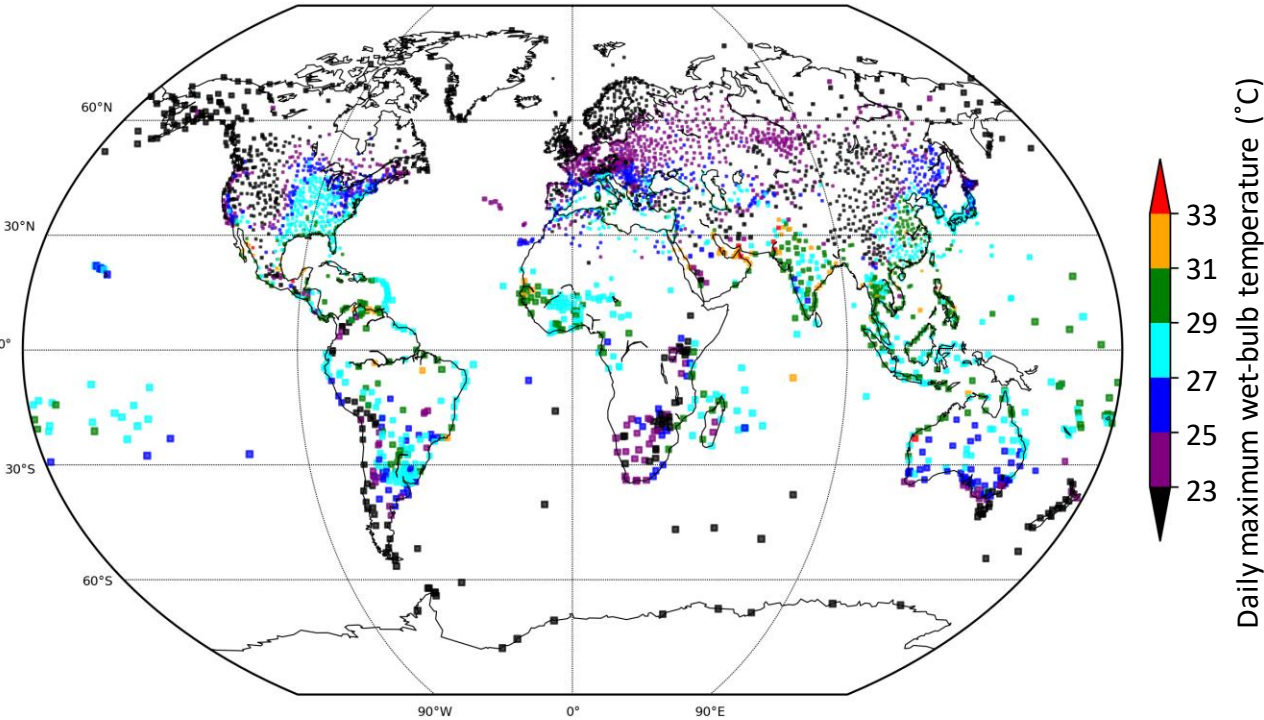
Left figure from Raymond et al. (2020)

Raymond, C., Matthews, T. and Horton, R.M., 2020. The emergence of heat and humidity too severe for human tolerance. *Science Advances*, 6(19), p.eaaw1838.

The Bureau of Meteorology



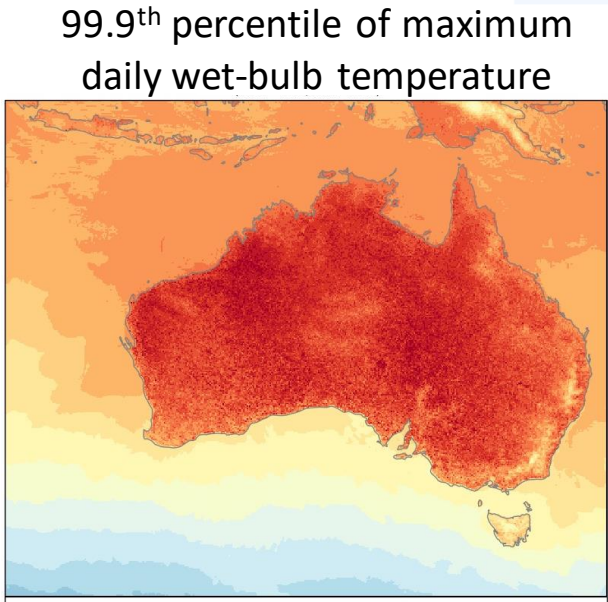
Lowest model level moisture produces more realistic wet-bulb temperature than screen level moisture



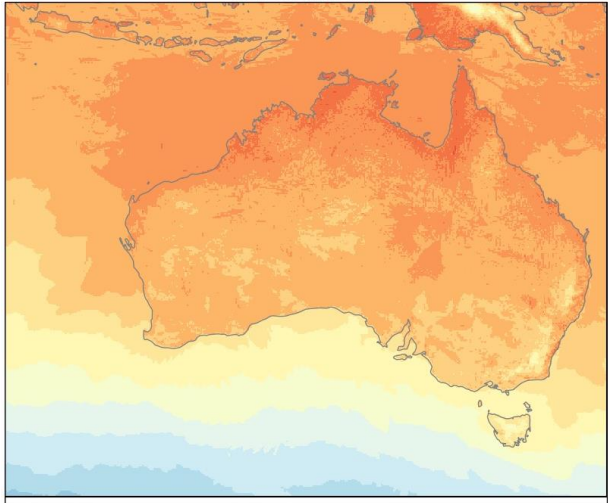
99.9th percentile of maximum daily wet-bulb temperature

BARRA1
screen level

BARRA1
lowest model level

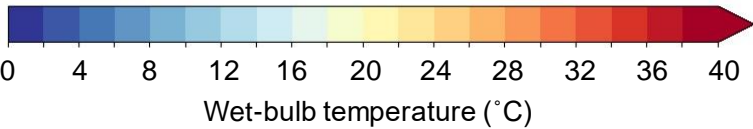


Before



Lowest model level humidity produces realistic results

After



Left figure from Raymond et al. (2020)
Raymond, C., Matthews, T. and Horton, R.M., 2020. The emergence of heat and humidity too severe for human tolerance. *Science Advances*, 6(19), p.eaaw1838.



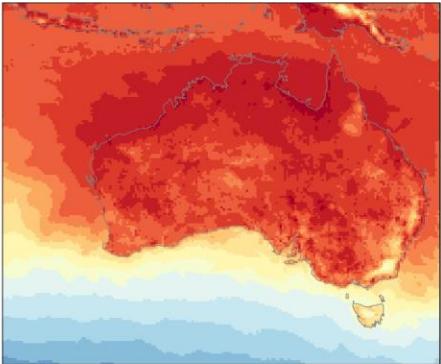
ERA5 vs BARRA1 (lowest model level)



Stippling = no significant trend

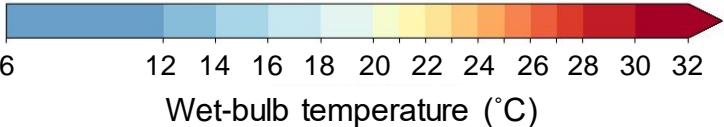
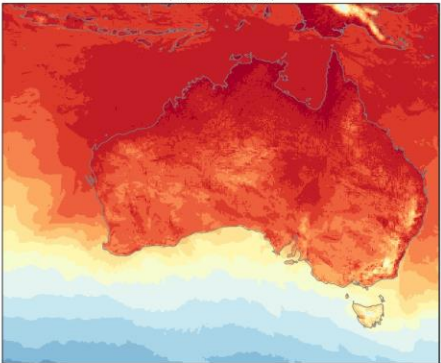
Maximum daily
wet-bulb temperature

ERA5



The hottest humid-heat events for
ERA5 and BARRA1 are similar

BARRA1



ERA5 vs BARRA1 (lowest model level)

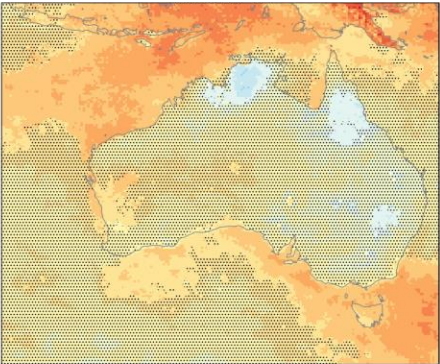
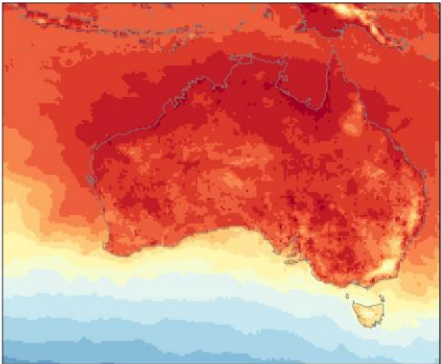


Stippling = no significant trend

Maximum daily
wet-bulb temperature

Trend in humid-heat days

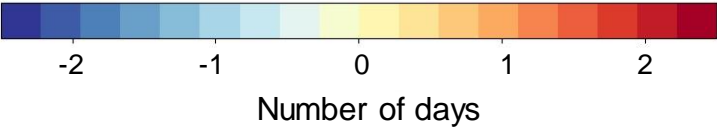
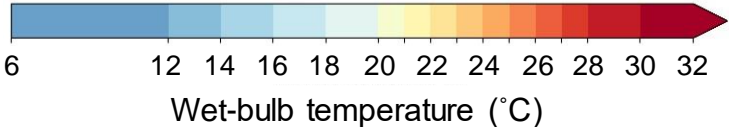
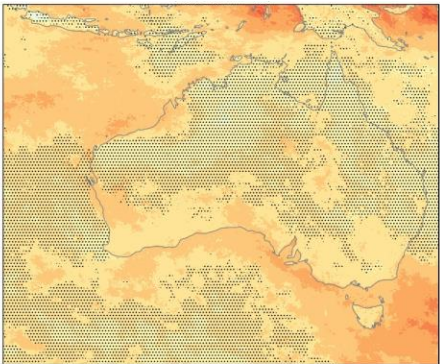
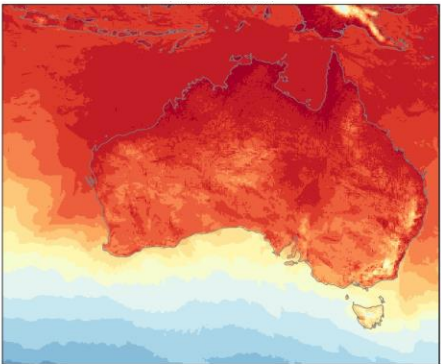
ERA5



The hottest humid-heat events for
ERA5 and BARRA1 are similar

Trends in humid-heat frequencies for
ERA5 and BARRA1 are *inconsistent*

BARRA1



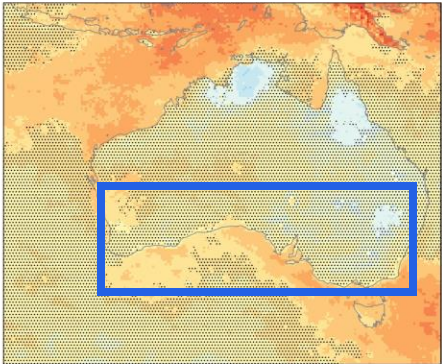
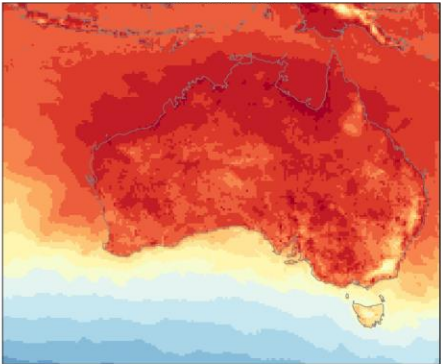
ERA5 vs BARRA1 (lowest model level)

Stippling = no significant trend

Maximum daily
wet-bulb temperature

Trend in humid-heat days

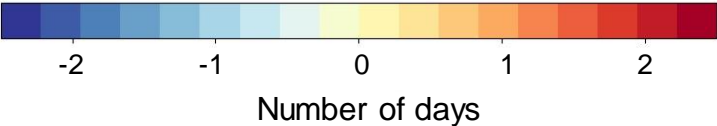
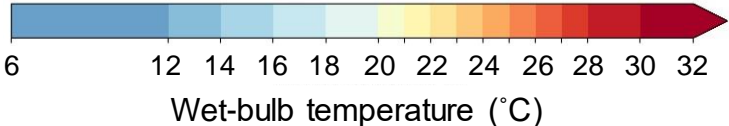
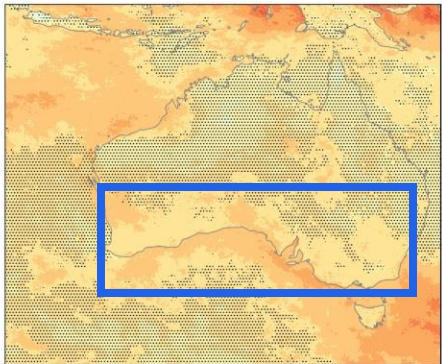
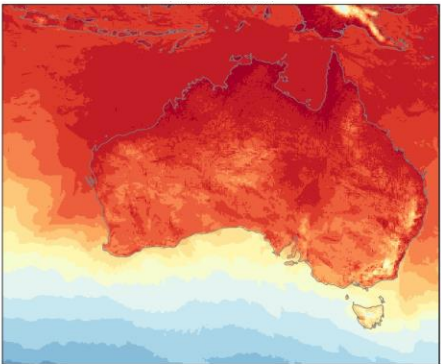
ERA5



The hottest humid-heat events for ERA5 and BARRA1 are similar

Trends in humid-heat frequencies for ERA5 and BARRA1 are *inconsistent*

BARRA1



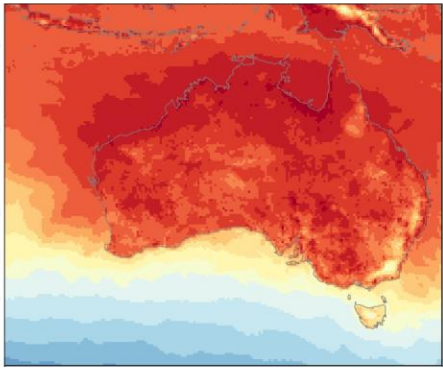
ERA5 vs BARRA1 (lowest model level)



Stippling = no significant trend

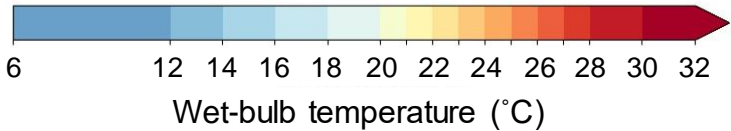
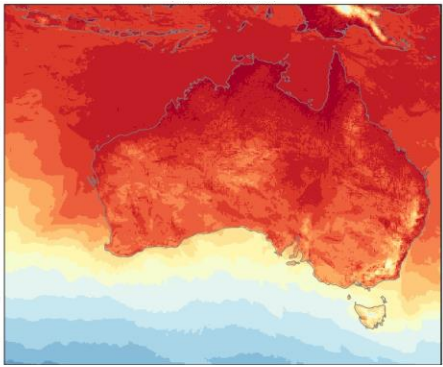
Maximum daily
wet-bulb temperature

ERA5

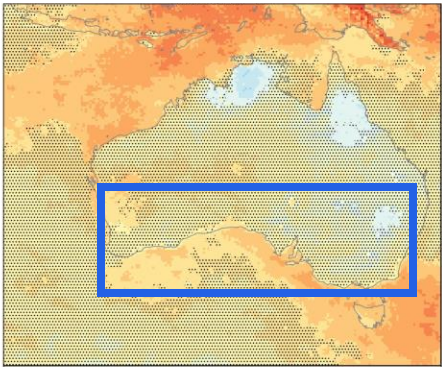


The hottest humid-heat events for ERA5 and BARRA1 are similar

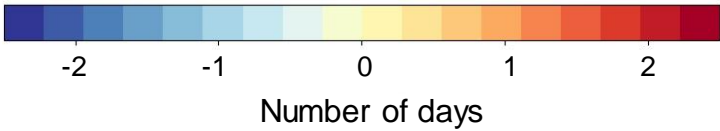
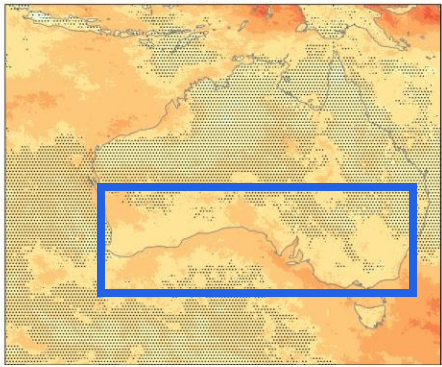
BARRA1



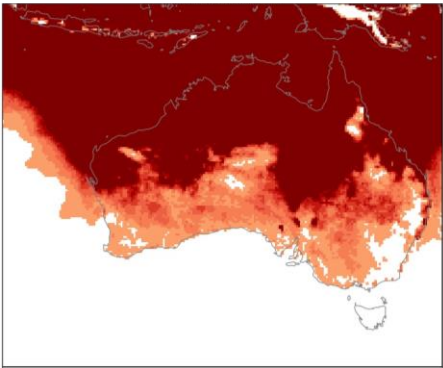
Trend in humid-heat days



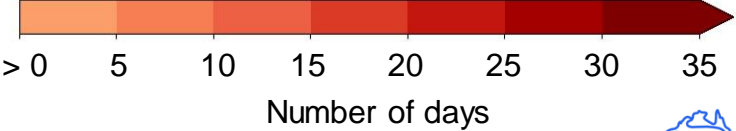
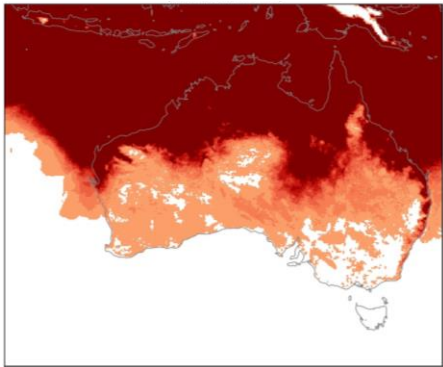
Trends in humid-heat frequencies for ERA5 and BARRA1 are *inconsistent*



Number of days with
wet-bulb temperatures > 26°C



“Dangerous” humid-heat events occur over most of the mainland



Summary

1. Compound events increase the threat posed by extremes
2. Without considering compound events, we risk underestimating extreme event impacts or underpreparing for these events
3. Humid-heat trends differ between datasets in some regions
4. Our new methodology has the potential to quickly produce highly accurate wet-bulb temperature data



Summary

1. Compound events increase the threat posed by extremes
2. Without considering compound events, we risk underestimating extreme event impacts or underpreparing for these events
3. Humid-heat trends differ between datasets in some regions
4. Our new methodology has the potential to quickly produce highly accurate wet-bulb temperature data

Future research

- Add *more* reanalysis datasets (MERRA2)
- Compare reanalysis datasets to Bureau automatic weather station data
- Determine which datasets are suitable for humid-heat analysis
- Future projections
- Health impact of dry- and humid-heat ➔ which is most dangerous? (ABS)

Summary

1. Compound events increase the threat posed by extremes
2. Without considering compound events, we risk underestimating extreme event impacts or underpreparing for these events
3. Humid-heat trends differ between datasets in some regions
4. Our new methodology has the potential to quickly produce highly accurate wet-bulb temperature data

Future research

- Add *more* reanalysis datasets (MERRA2)
- Compare reanalysis datasets to Bureau automatic weather station data
- Determine which datasets are suitable for humid-heat analysis
- Future projections
- Health impact of dry- and humid-heat → which is most dangerous? (ABS)

Check out the Risk KAN compound events website for:

- Upcoming webinars and events
- View past webinars
- Sign up to our mailing list!
- Newsletters

Want to know more about compound events research?

<https://www.risk-kan.org/working-group-compound-events-and-impacts/>



Summary

1. Compound events increase the threat posed by extremes
2. Without considering compound events, we risk underestimating extreme event impacts or underpreparing for these events
3. Humid-heat trends differ between datasets in some regions
4. Our new methodology has the potential to quickly produce highly accurate wet-bulb temperature data

Thank you!

Future research

- Add *more* reanalysis datasets (MERRA2)
- Compare reanalysis datasets to Bureau automatic weather station data
- Determine which datasets are suitable for humid-heat analysis
- Future projections
- Health impact of dry- and humid-heat → which is most dangerous? (ABS)

Check out the Risk KAN compound events website for:

- Upcoming webinars and events
- View past webinars
- Sign up to our mailing list!
- Newsletters

Want to know more about compound events research?

<https://www.risk-kan.org/working-group-compound-events-and-impacts/>

