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# Quantifying causal teleconnections to drought and fire risks in Indonesian Borneo

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# Motivation and Objectives

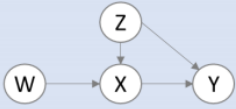
- Identify large-scale ocean-atmosphere causal links leading to droughts and fires
  - Evaluate the likelihood of unprecedented drought and fire risks
  - Unfold possible changes of drought and fire risks and their drivers under a warming climate
- Develop climate risk assessment and resilience building strategies for droughts and peatland fires in Central Kalimantan Province, Indonesian Borneo



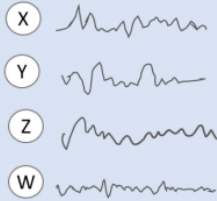
More on  
[kali-project.com](http://kali-project.com)

# Identify causal links leading to droughts and fires

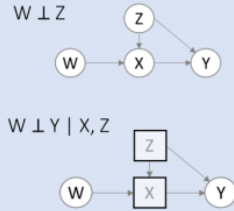
Step 1:  
Set up a causal model



Step 2:  
Collect time-series

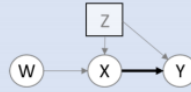


Step 3:  
Test implications on model



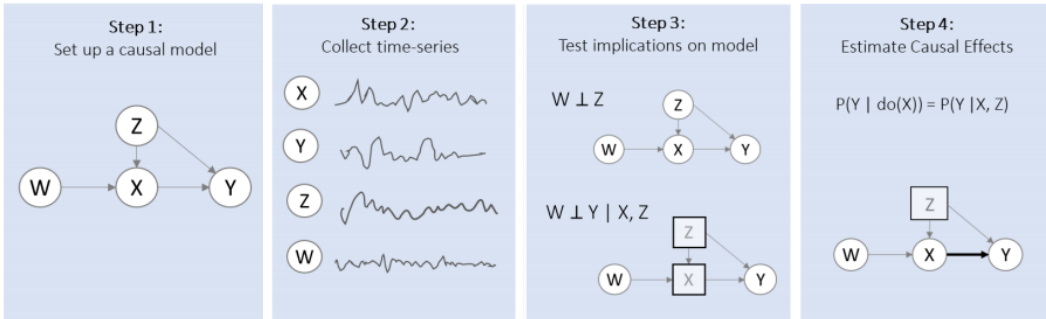
Step 4:  
Estimate Causal Effects

$$P(Y | \text{do}(X)) = P(Y | X, Z)$$



Knowledge-guided Casual Inference (Kretschmer et al. 2021, *BAMS*)

# Identify causal links leading to droughts and fires



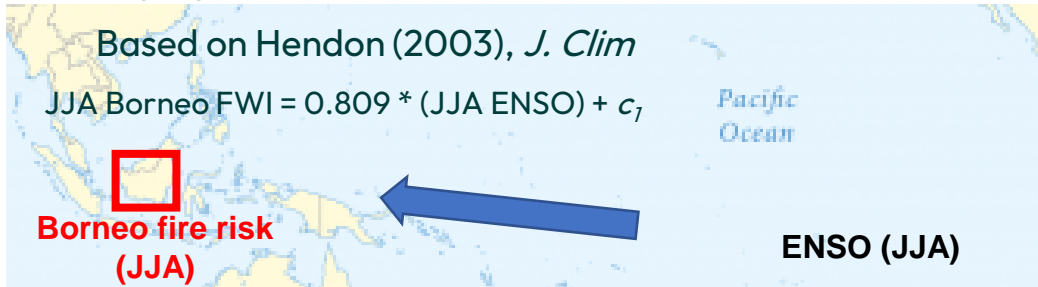
Contingency table of FWI vs. ENSO

	La Niña	Neutral	El Niño	
FWI (JJA)	0%	8.3%	25%	Dry
	12.5%	12.5%	8.3%	Normal
	20.8%	12.5%	0%	Wet
	Niño3.4 SST (JJA)			

Knowledge-guided Casual Inference (Kretschmer et al. 2021, *BAMS*)

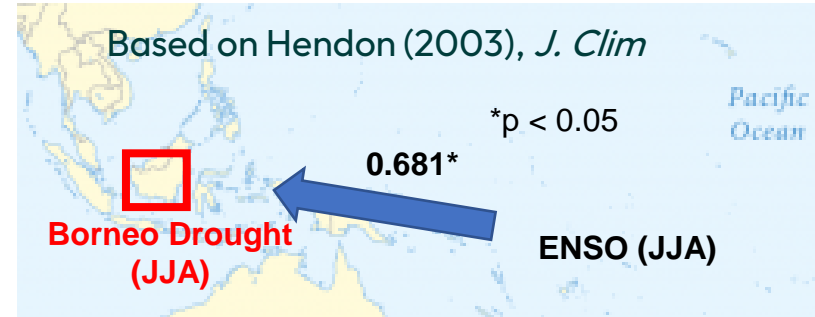
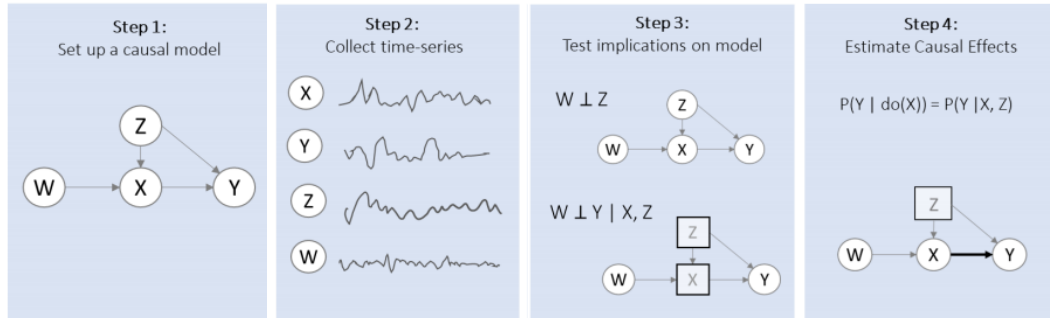
Based on Hendon (2003), *J. Clim*

$$JJA \text{ Borneo FWI} = 0.809 * (JJA \text{ ENSO}) + c_7$$



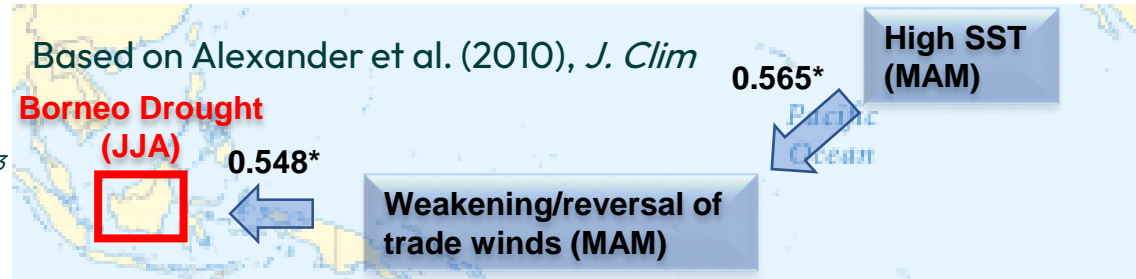
- Based on standardised and detrended data from ERA5 and Niño 3.4 SST from NOAA

# Identify causal links leading to droughts and fires



Knowledge-guided Casual Inference (Kretschmer et al. 2021, *BAMS*)

$$\begin{aligned} \text{JJA Borneo Drought} &= 0.681^* (\text{JJA ENSO}) + c_1 \\ \text{MAM Zonal Wind} &= 0.565^* (\text{MAM SST}) + c_2 \\ \text{JJA Borneo Drought} &= 0.548^* (\text{MAM Zonal Wind}) + c_3 \\ \text{JJA Borneo Drought} &= 0.209 (\text{MAM SST}) + c_4 \end{aligned}$$



- Based on standardised and detrended CHIRPS precipitation, HadISST, and ERA5 wind data

# Evaluate present and future drought and fire risks

Risk at present

Risk in the future

## Data Collection

Met Office GloSea6 seasonal forecasting – historical

CMIP6 projections – historical & future

## Model Evaluation

Compare modelled and observed data distribution

Compare historical simulations with observations

## Risk Analysis

Chance of exceeding historical fire events

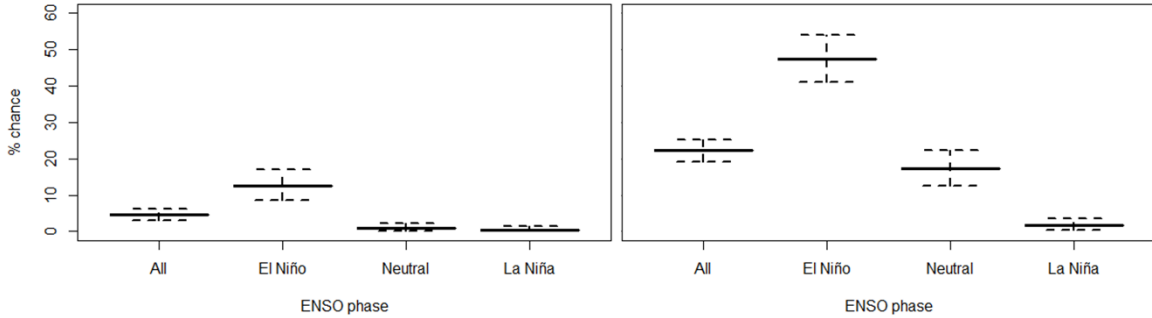
Overall future trend



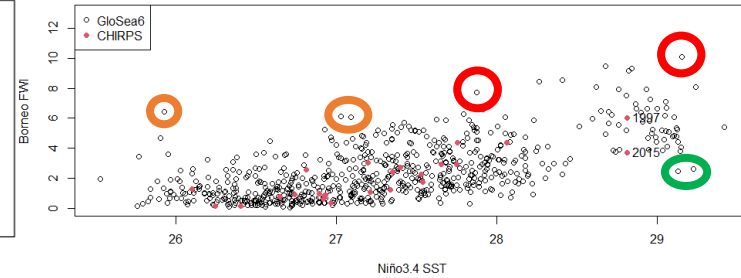
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# Likelihood of unprecedented drought and fire risks

Chance of FWI exceeding 1997, conditioned on ENSO phase    Chance of FWI exceeding 2015, conditioned on ENSO phase



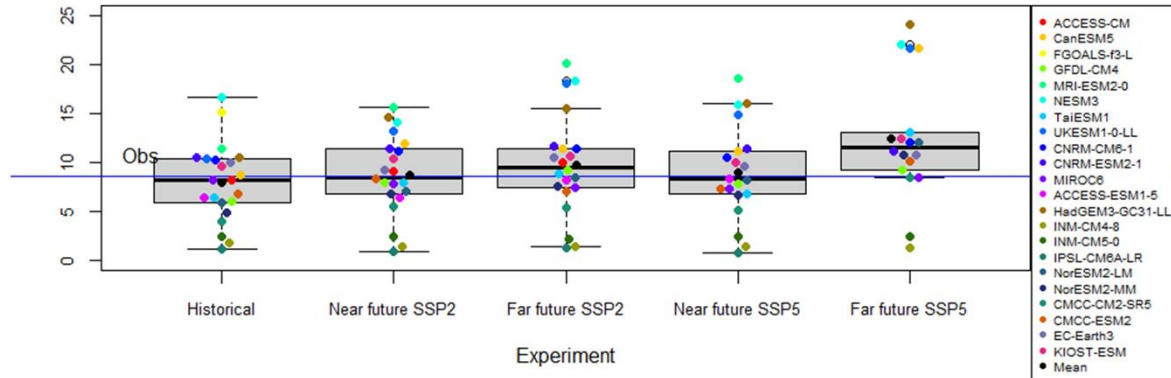
Borneo FWI vs ENSO



- Based on GloSea6 seasonal hindcast ensemble runs from 1993 – 2016
- Under an El Niño, there is about a 50% chance that Fire Weather Index (FWI) exceeds that in 2015, which is approximately 2 times and 25 times greater than under neutral ENSO and La Niña conditions, respectively.
- FWI during historical fires may still be exceeded under neutral ENSO and La Niña conditions, associated with Indian Ocean Dipole (IOD), East Asian Summer Monsoon, or extratropical drivers.

# Future drought and fire risks

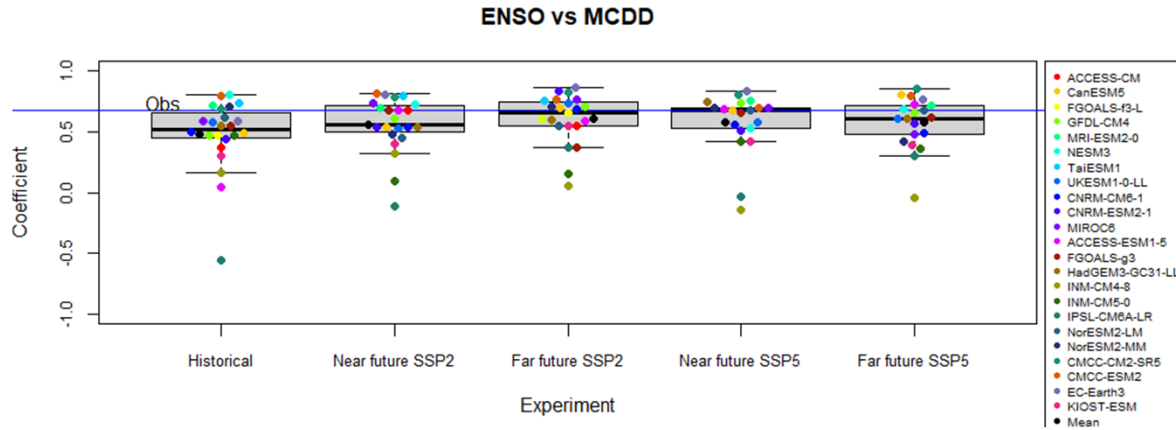
Maximum Consecutive Dry Days



- Under SSP585 scenario, maximum number of consecutive dry days will increase significantly ( $p = 0.016$ ) in the far future (2061 – 2100) compared with historical baseline (1981 – 2014).

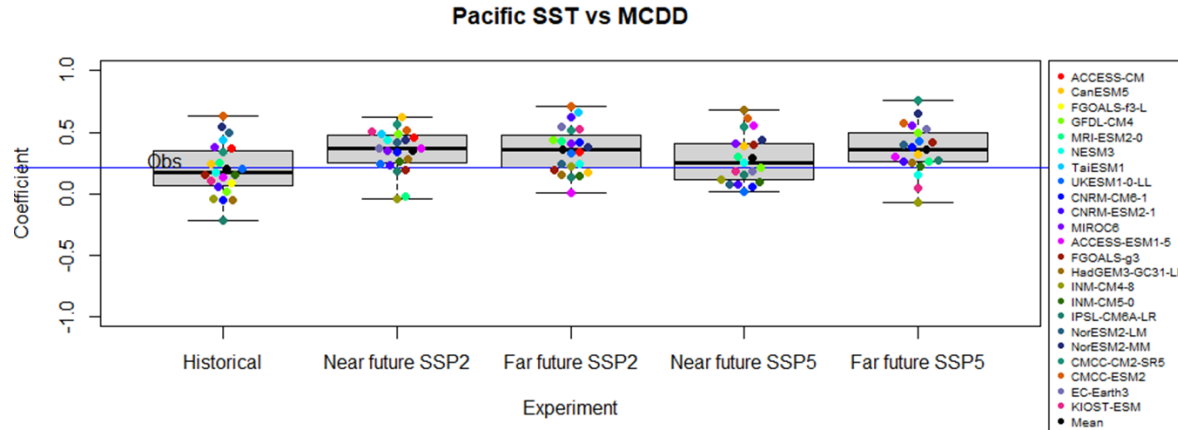


# Future drivers of drought and fire risks



- There is no clear trend of relationship between ENSO and Borneo drought towards the future.

# Future drivers of drought and fire risks



- Under SSP5, Pacific SST as a driver of maximum number of consecutive dry days will strengthen significantly ( $p = 0.026$ ) in the far future (2061 – 2100) compared with historical baseline (1981 – 2014).

# Conclusions

Using a causal framework to quantify teleconnections, we find that:

- Strong associations are observed between boreal summer droughts in Indonesian Borneo, El Niño conditions, and elevated SSTs over eastern North Pacific in the preceding boreal spring.
- An El Niño event substantially elevates the risk of unprecedented fires, but they are still possible under other ENSO phases.
- Droughts in Indonesian Borneo may worsen in the future, which could be attributed to the strengthening of wind-evaporation-SST feedback as evidenced by enhanced relationship between Borneo drought and SST over eastern North Pacific in the preceding boreal spring.

