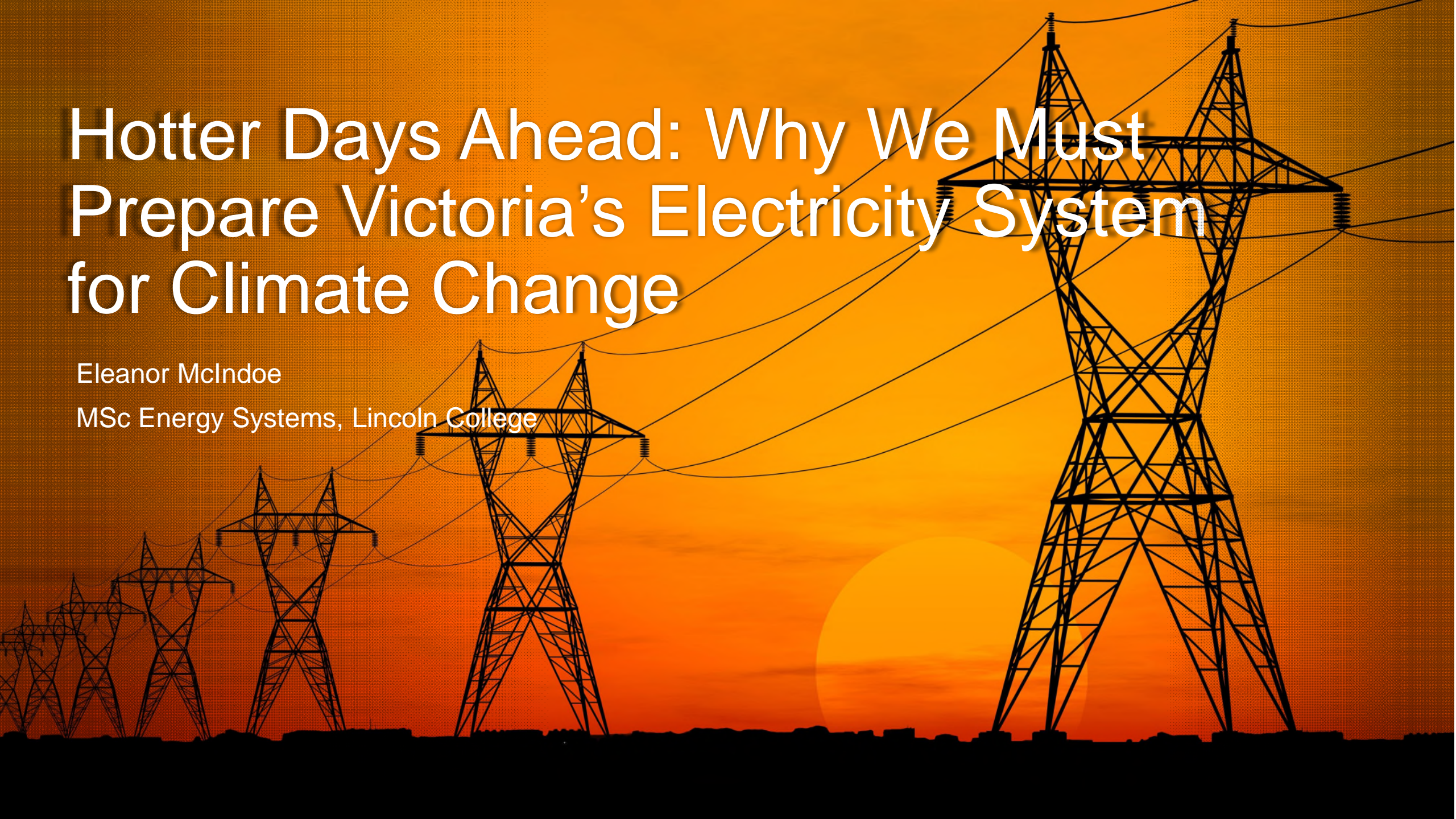


# Hotter Days Ahead: Why We Must Prepare Victoria's Electricity System for Climate Change

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# Agenda

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1. The consequences of power outages caused by heatwaves
2. Current state of climate-resilience planning in Victoria, Australia
3. How elevated temperatures threaten system security
4. Heatwave risks to the electricity system under a 2°C future climate scenario
  - a) Methodology
  - b) Development of generalised event definitions
  - c) Probabilistic assessment of transmission, generation and whole-system risks
5. Conclusion and Questions

# Heatwave-induced power outages in Victoria

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- Victoria has experienced several major state-wide blackout events in recent decades, this risk is set to increase with climate change



## Social Impacts

- Over **500,000** customers lost power (Feb 24, Jan 09)
- Reconnection took **days to weeks** (Feb 09, Feb 24)
- Communications, health, transport disruptions



## Economic Impacts

- Power disruptions contributed to **AUD\$800 million** in losses (Jan 09)
- Total RERT costs of AUD\$34.2 million (Jan 19)



## System Impacts

- **12 load shedding** incidents
- Separation of VIC/NSW systems (Feb 09)
- **Infrastructure damage**
- Breached reliability standards

# Current state of climate-resilience planning

## Systematic weaknesses in climate change resilience

- Current regulations and industry standards do not consider future climate risks
- Difficult to justify investment in climate resilience to shareholders or regulators
- ESCI on AEMO's long-term plans - "likely to result in an overestimation in the reliability of the electricity system"
- Future climate not considered for infrastructure with operational lifetimes of several decades

## Accelerating investment in Net Zero

- **\$3B+** investment in renewables, grid expansion and large battery systems, including 6 REZs

## Increasing system complexity

- 95% renewables target by 2035
- Rapid shutdown of baseload coal and loss of traditional system inertia mechanisms
- 108% increase in demand by 2050

# Extreme temperatures and system security

Increased Demand

Lower conductor transfer capacity

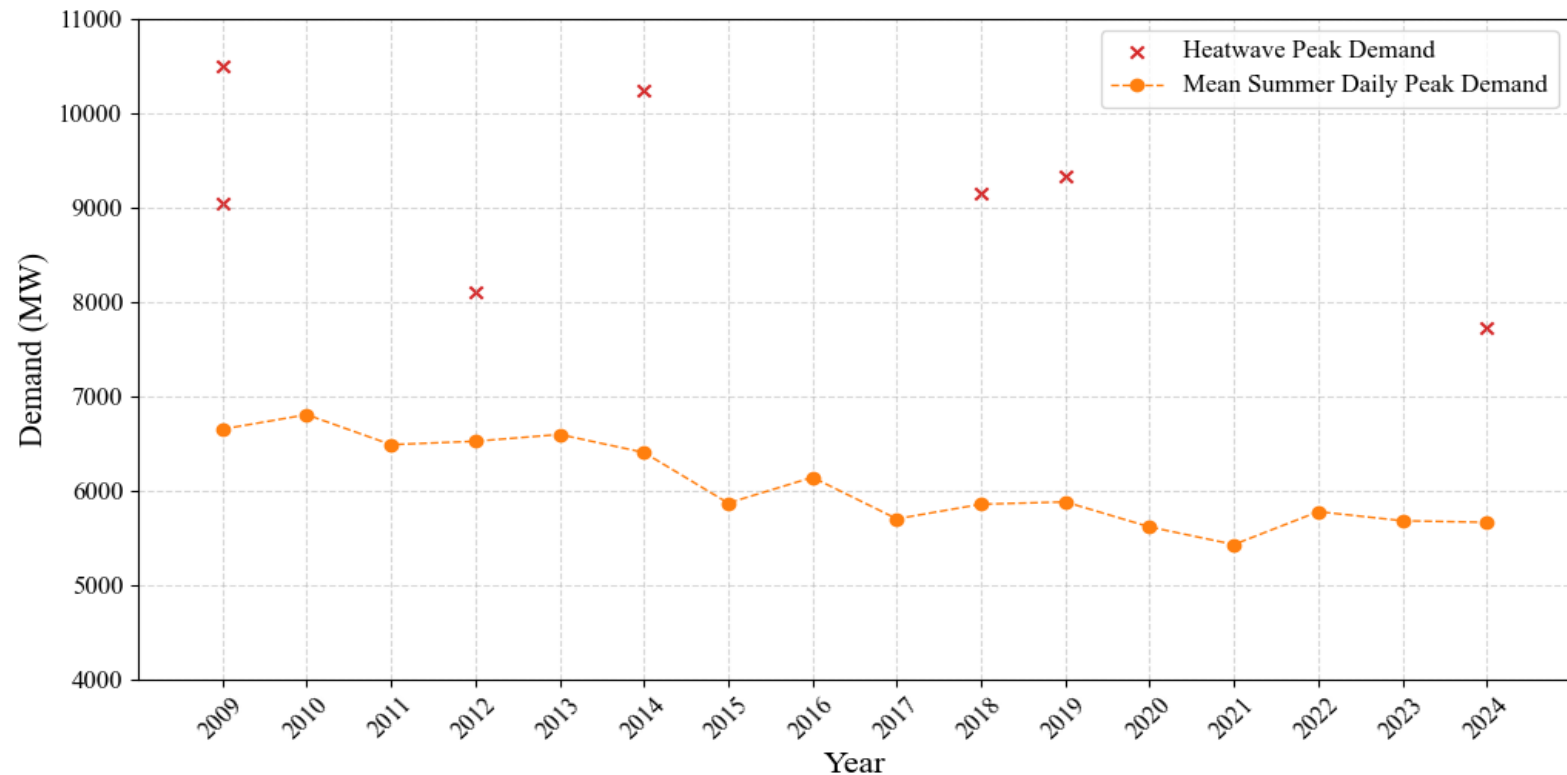
Reduced generation efficiency

Increased system stress

- Increased cooling loads
- Significantly higher peak demand
- Peak shifting later in the afternoon/evening



Mean Summer Daily Peak Demand in Victoria (2009-2024)



Data retrieved from: AEMO

# Extreme temperatures and system security

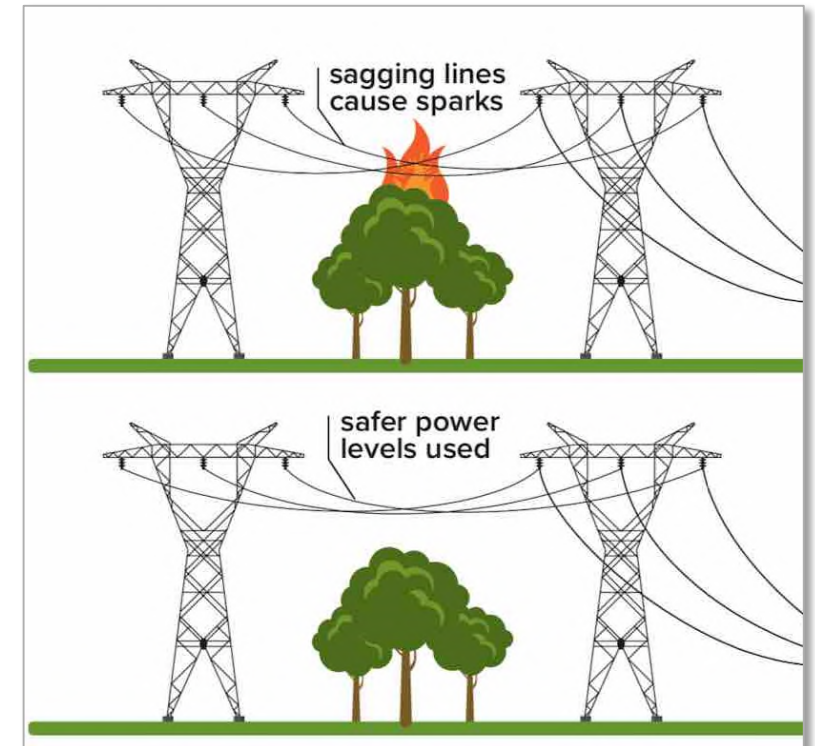
Increased Demand

**Lower conductor transfer capacity**

Reduced generation efficiency

Increased system stress

- High temperatures causes greater conductor sag, increased risk of flashover, and physical equipment damage
- Passing current through a conductor causes it to heat up, so operators reduce power transfer capacity during high temperature events to minimise risks
- Power lines are assigned static or dynamic temperature ratings indicating the maximum allowable current for safe operation



# Extreme temperatures and system security

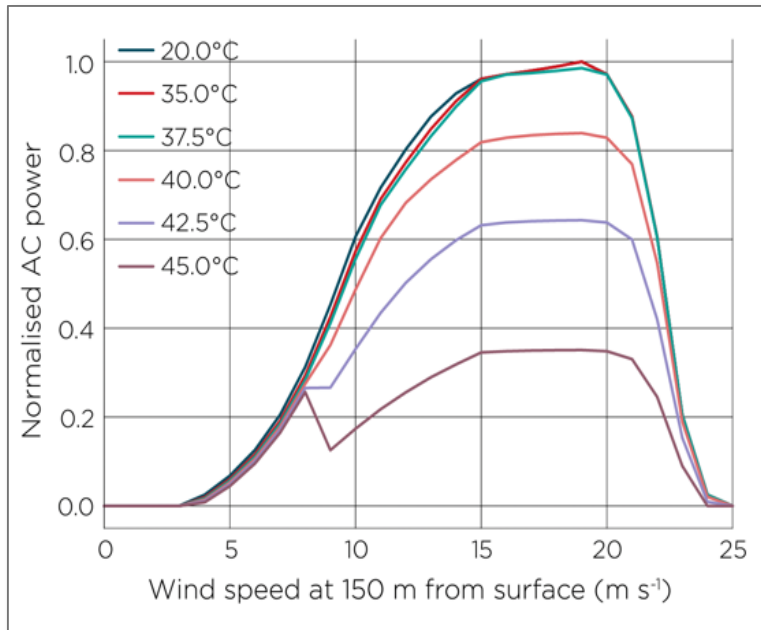
Increased Demand

Lower conductor transfer capacity

Reduced generation efficiency

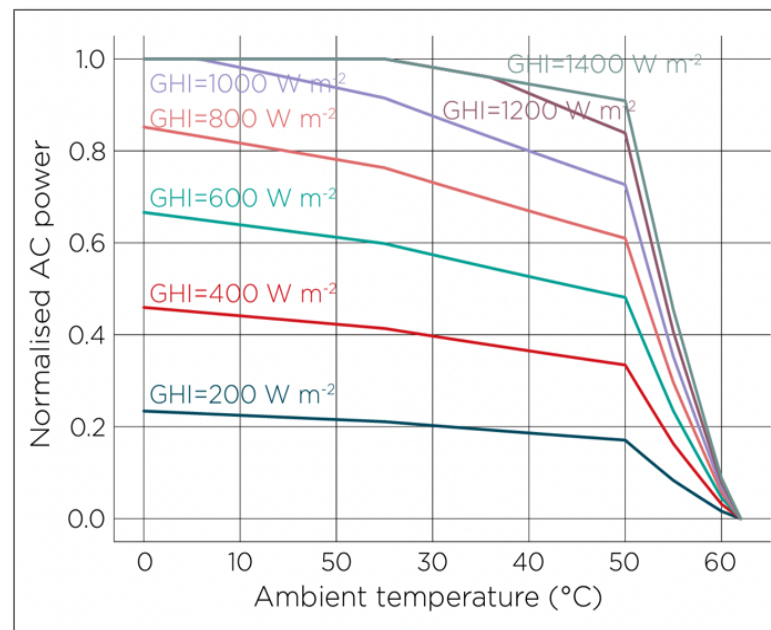
Increased system stress

Power temperature curve for **wind generation** in the NEM



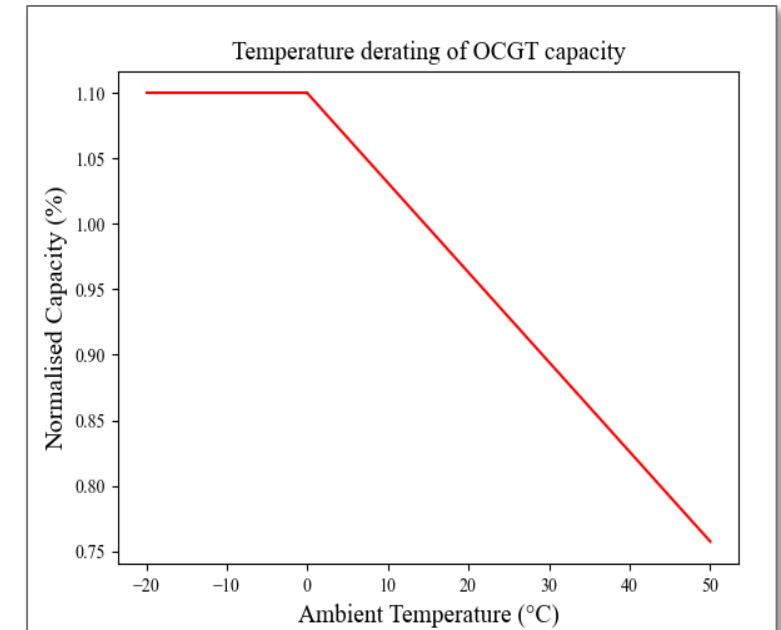
Source: ESCI

Power temperature curve for **solar generation** in the NEM



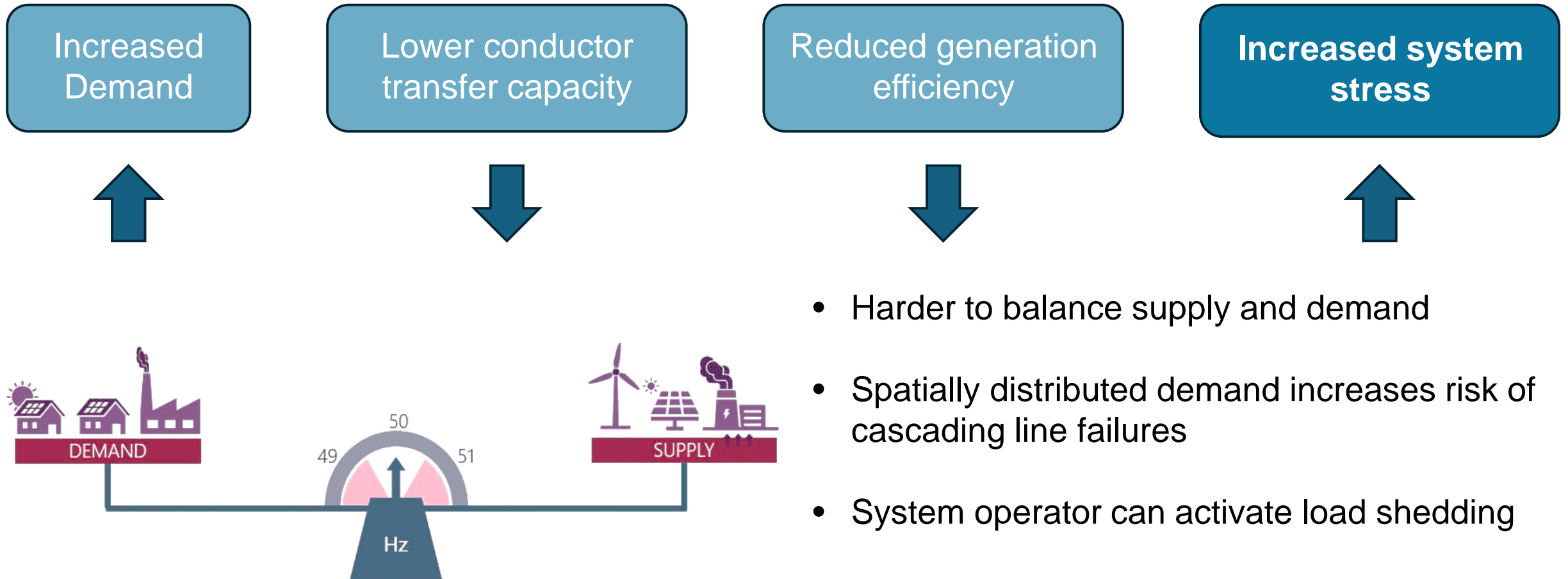
Source: ESCI

Temperature derating of open-cycle gas turbines (OCGT)



Source: X. Ke et al. (2016)

# Extreme temperatures and system security



- Harder to balance supply and demand
- Spatially distributed demand increases risk of cascading line failures
- System operator can activate load shedding
- Overloading and equipment faults can cause localised outages at the distribution level



# Overview of methodology

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Adapted from climate attribution studies to determine the change in likelihood of an extreme event under current climactic conditions compared to a future 2°C scenario

1. Analysis of seven historic heatwave-outages in Victoria to understand the physical heatwave conditions, system dynamics and event impacts
  - AEMO reports, NEM market reports, newspaper articles
  - ERA5 Climate Reanalysis temperature data
  - Outage data from 4 DNOs
2. Event definition:
  - Physical, spatial and temporal components, identifiable in historic meteorological data and climate model outputs
  - Defined in relation to system impact, generalised to represent class of similar events

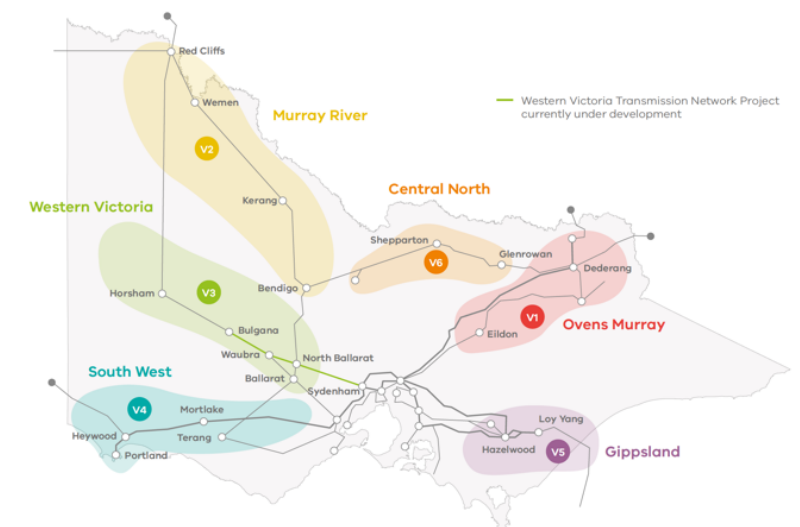
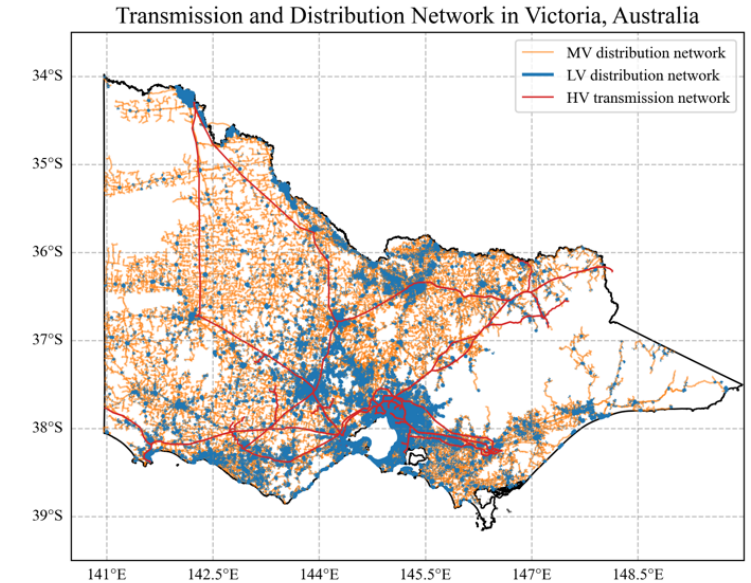
# Overview of methodology

## 3. Model Evaluation of HADAM4 outputs

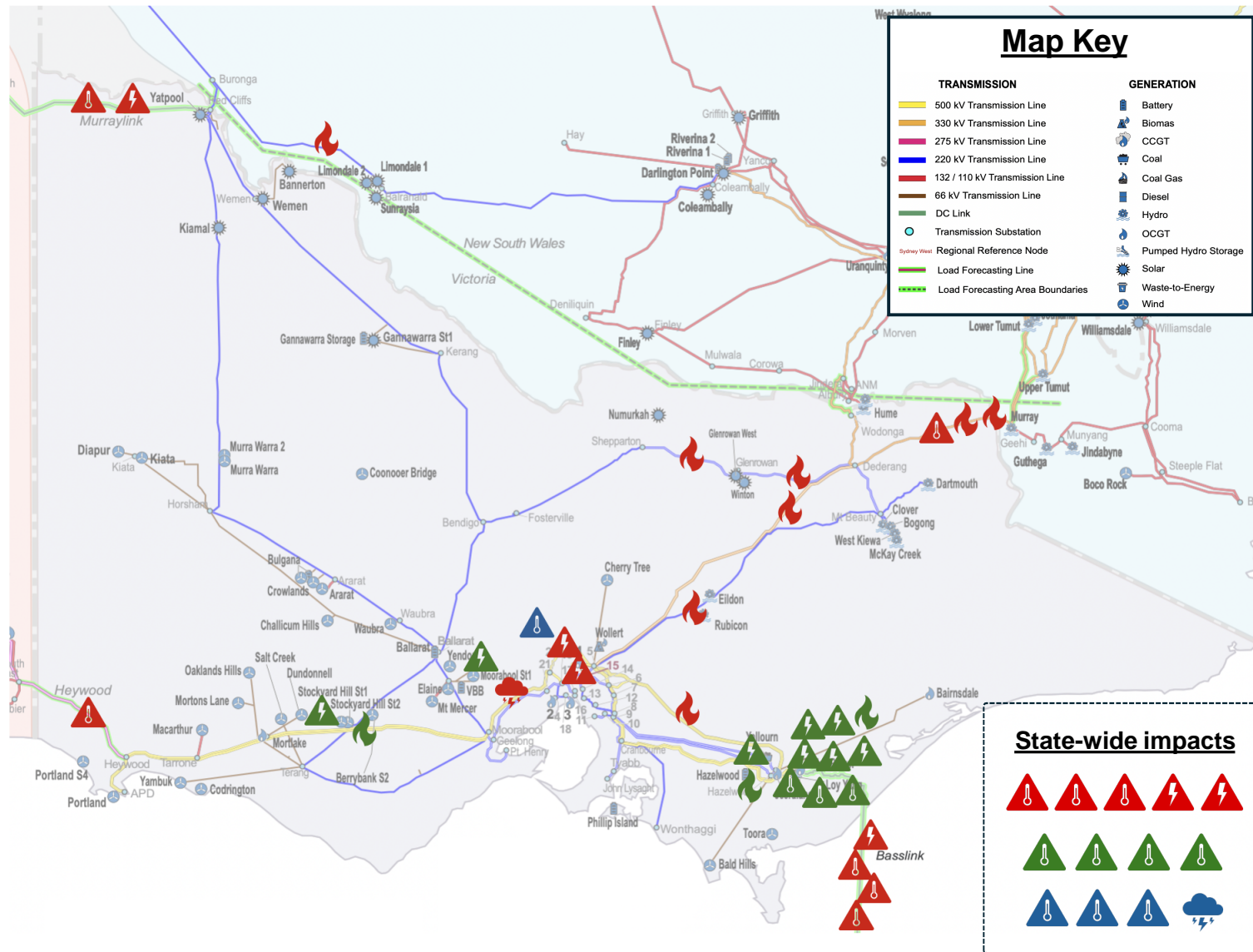
- ERA5 Data, Q-Q plot, Overlap Percentage

## 4. Estimation of the changes in event risk

- Mean temperatures calculated across spatial scopes for 1,380 simulated periods
- Empirical cumulative distribution function (ECDF) to calculate event likelihoods and probability ratios
- Non-parametric bootstrap approach to determine 5<sup>th</sup> and 95<sup>th</sup> percentile confidence intervals



# Event Definition: Whole System



## Causes of the seven large-scale heatwave-outage events

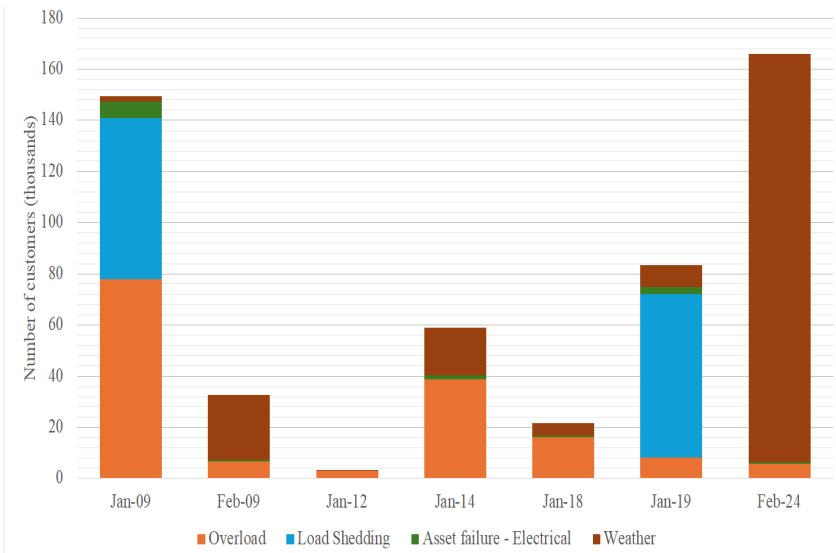
### System Events Key

	Thermal constraint	Equipment fault/failure	Bushfire/Grassfire	Storm damage
Transmission Network				
Generation Assets				
Distribution Network				

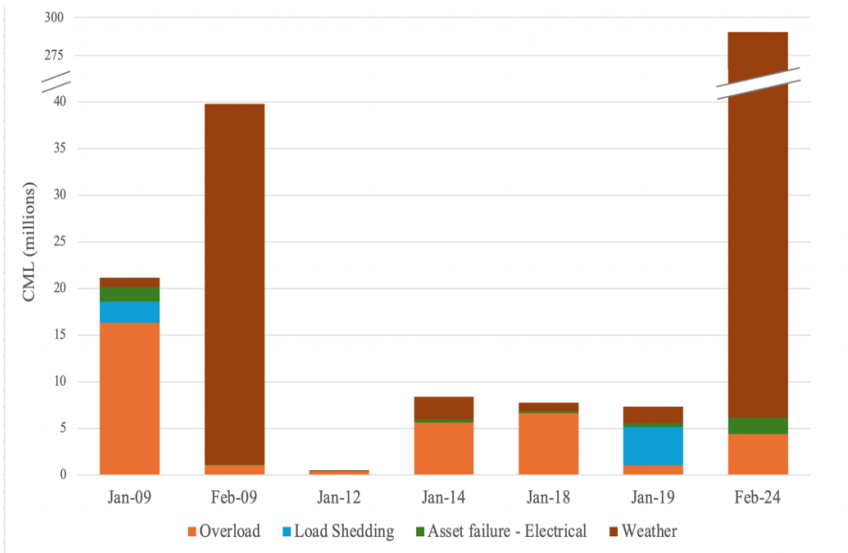
- Twelve separate incidences of load shedding
- Two incidents over 1GW, ~18% of average peak daily summer load

# Event Definition: Whole System

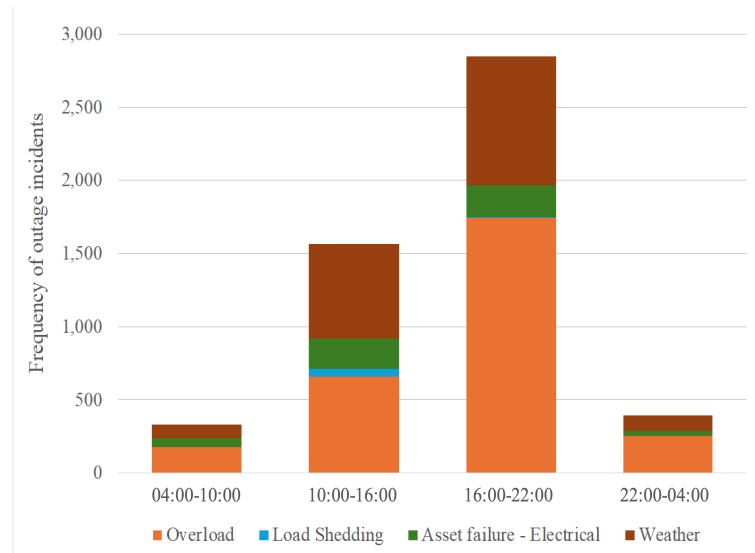
Number of customers affected by outage cause



Total customer minutes lost by outage cause



Frequency of outages by 6-hour period and cause



Overload Load Shedding Asset failure - Electrical Weather

*Data retrieved from: PowerCor, CitiPower, UnitedEnergy, Ausnet*

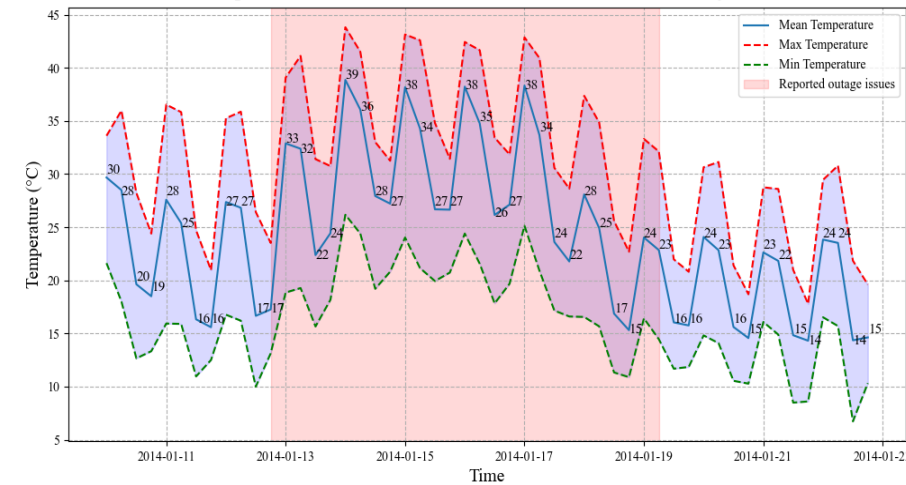
- Overloading and extreme weather were primary drivers of outages and outage severity
- The presence of concurrent extreme weather during heatwaves greatly exacerbates the severity of outages



# Event Definition: Whole System

## Temporal Temperature Variation

Temperature variation across Victoria 10th to 22nd January 2014

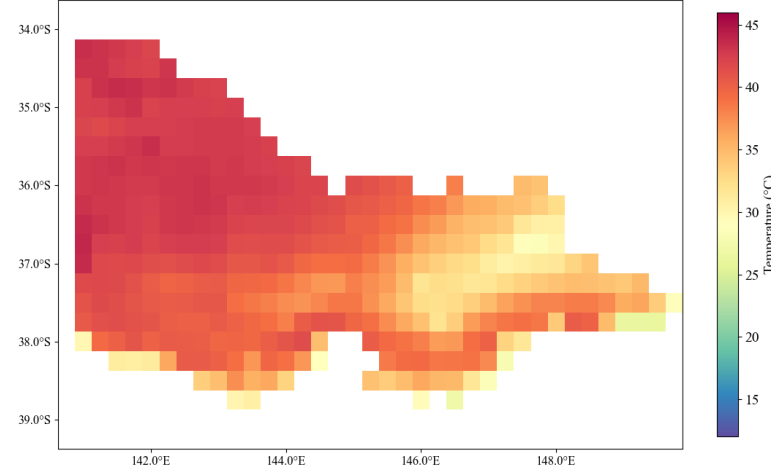


### ERA5 climate reanalysis temperature data shows:

- High state maximum and minimum temperatures ( $0.25^\circ \times 0.25^\circ$  resolution)
- Mean state temperature close to maximum temperature
- Outages correlated with high temperatures

## Spatial Temperature Variation

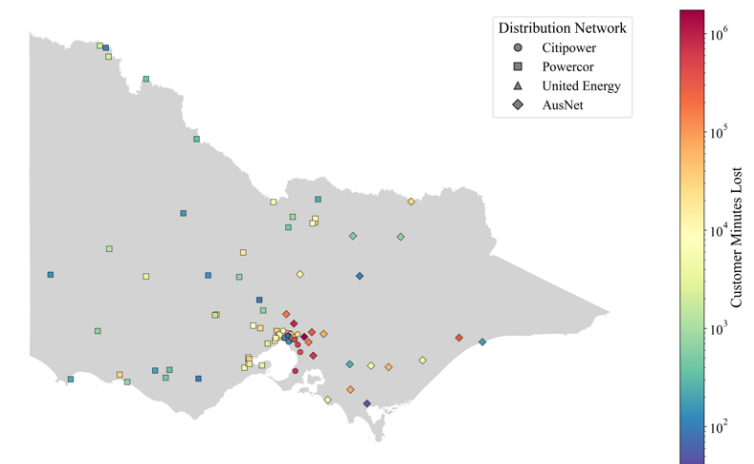
Mean temperatures across Victoria between 10am and 4pm on 14th January 2014



- Lower standard deviation of gridded 6-hour mean temperatures compared to non-heatwave days
- High temperatures across state

## Spatial Distribution of Outage Severity

Customer minutes lost 13th-19th January 2014 by location and DNO



### DNO outage data shows:

- Correlation between outage location and ambient temperature
- No strong correlation between consecutive heatwave days and CML

# Event Definition: Whole System

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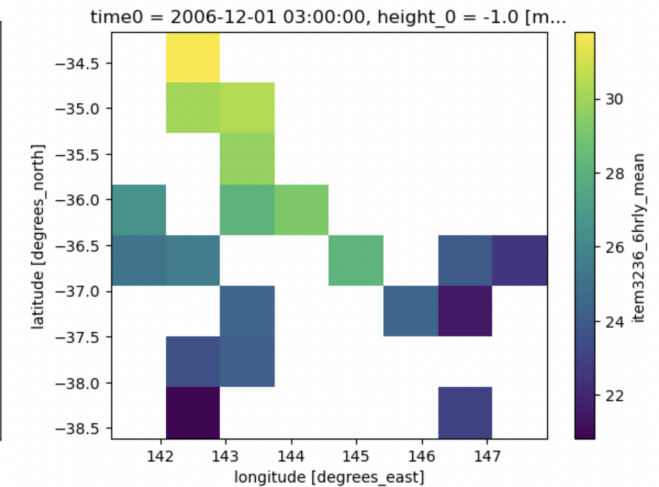
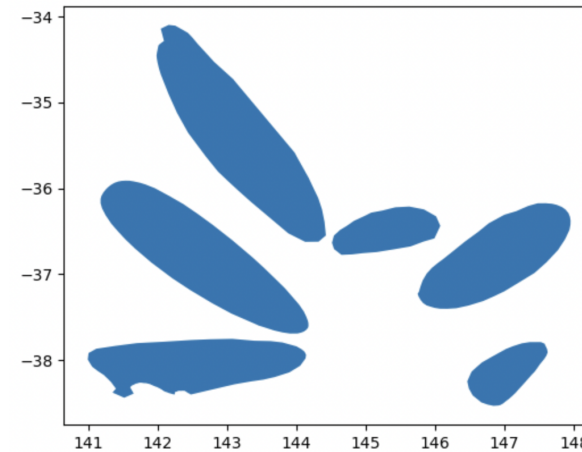
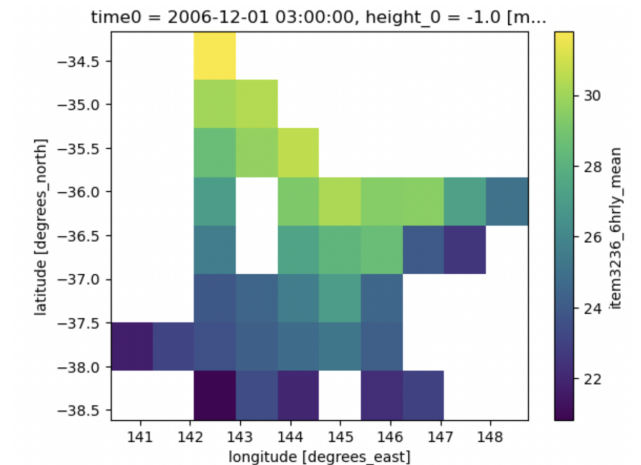
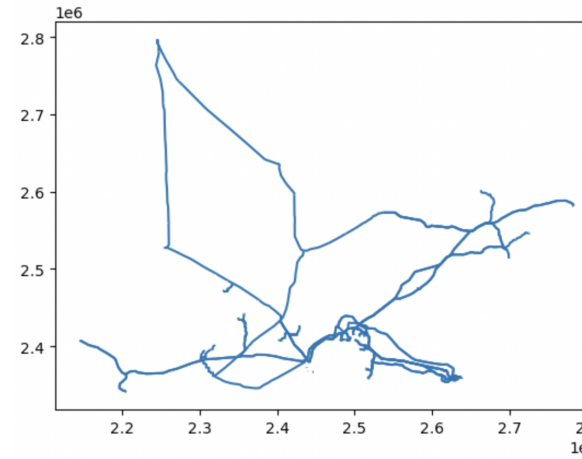
Event Definition	Physical, Spatial and Temporal Components	Event severity thresholds
Whole system	Mean 6-hourly ambient temperature averaged over Victorian state boundaries	100% failure rate: 39°C 70% failure rate: 38°C 41.18% failure rate: 37°C 31.25% failure rate: 35°C

The *percentage failure rate* indicates the proportion of 6-hour periods between December 2008 and March 2024 when exceeding a temperature threshold resulted in significant state-wide load shedding or power outages

Mean 6-hourly state temperatures above 39°C only occurred three times, all of which resulted in severe state-wide power outages

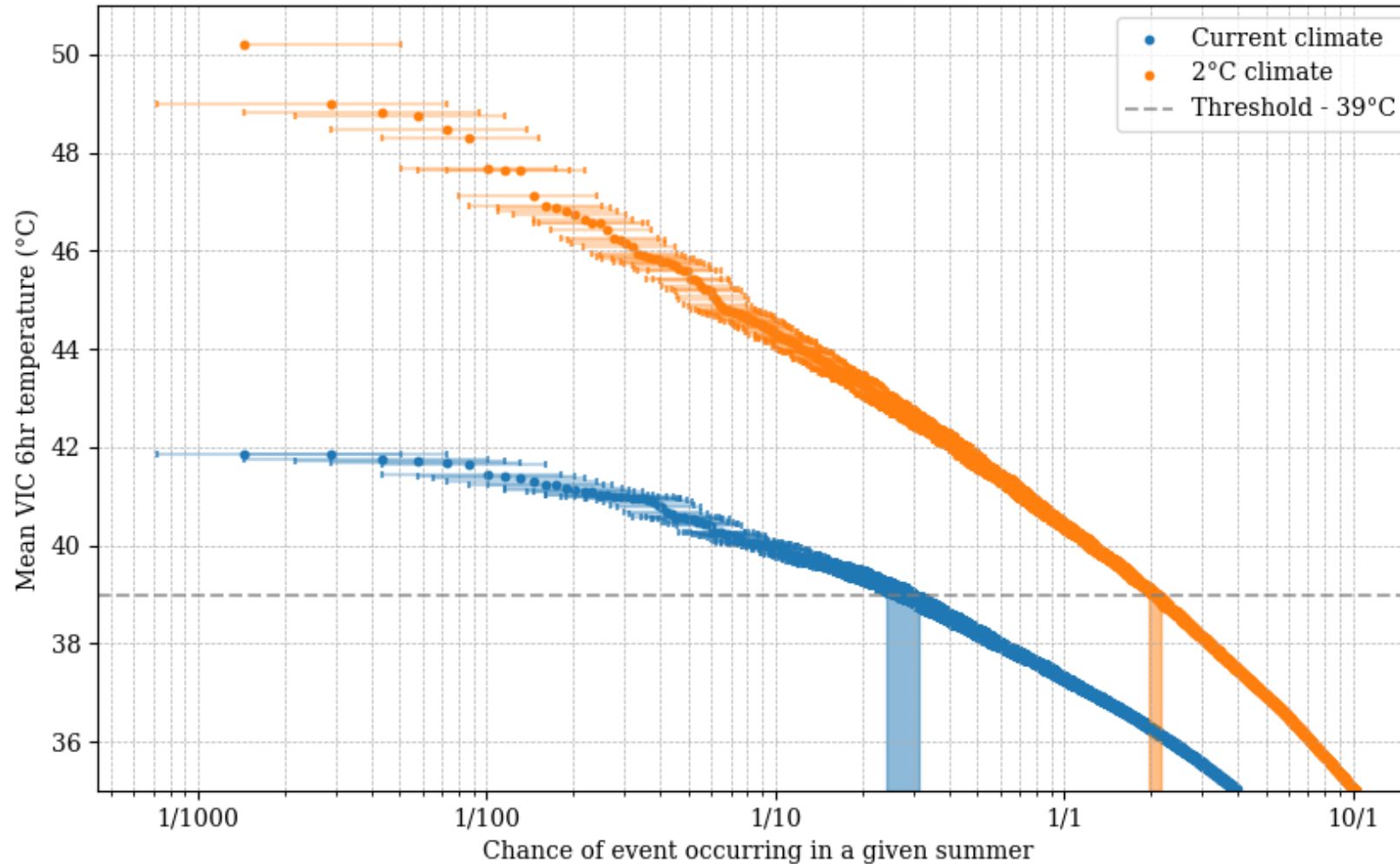
# Event Definitions: Transmission and Generation

Event Definition	Event scale	Event severity thresholds
Transmission	Mean 6-hourly ambient temperature averaged over area covered by transmission network	Static ratings: 35°C and 40°C Dynamic ratings: 28°C and 24°C
Generation	Mean 6-hourly ambient temperature averaged over area covered by REZs	Wind: 40°C and 45°C Solar: 40°C and 50°C BSS and gas power plants: 35°C



# Results: Whole system risks

Chance of Exceeding Temperature Thresholds in Victoria



## Exceedance Likelihood of 39°C

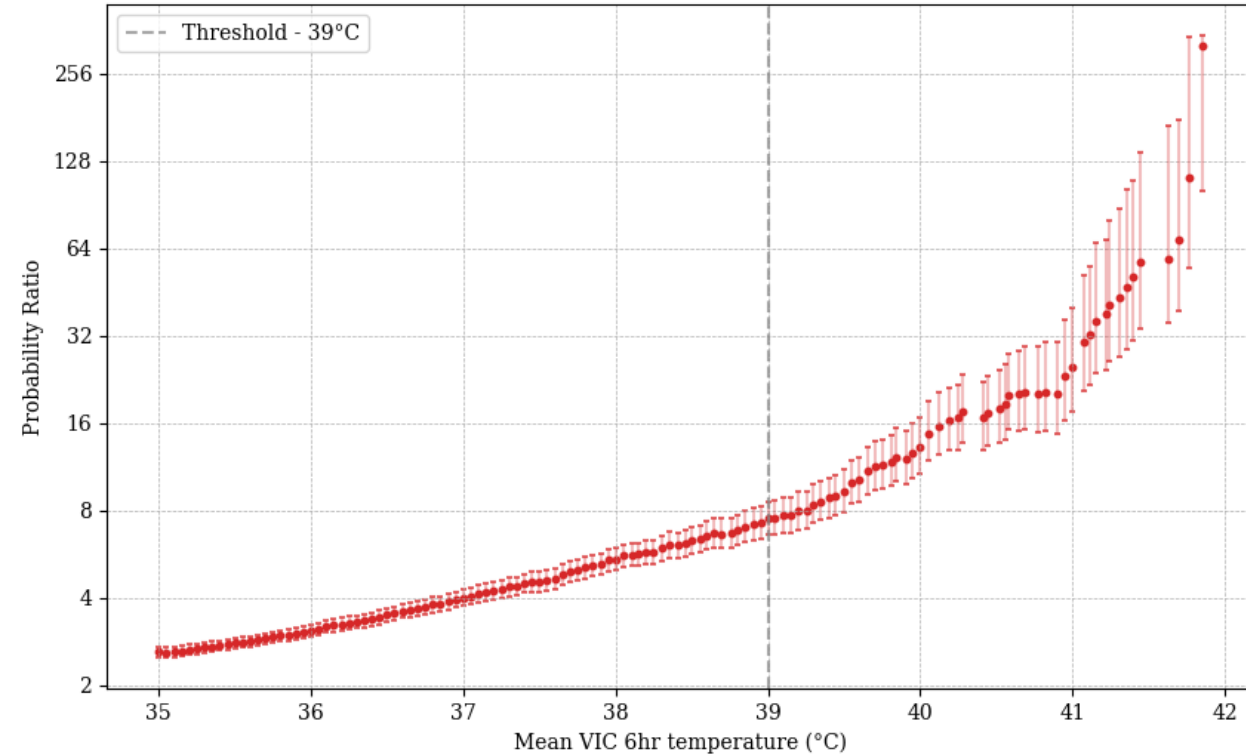
28% (+4%/-3%) ➡ 206% (+9%/-9%)

Corresponding to 100% failure rate assuming the current level of system resilience



# Results: Whole system risks

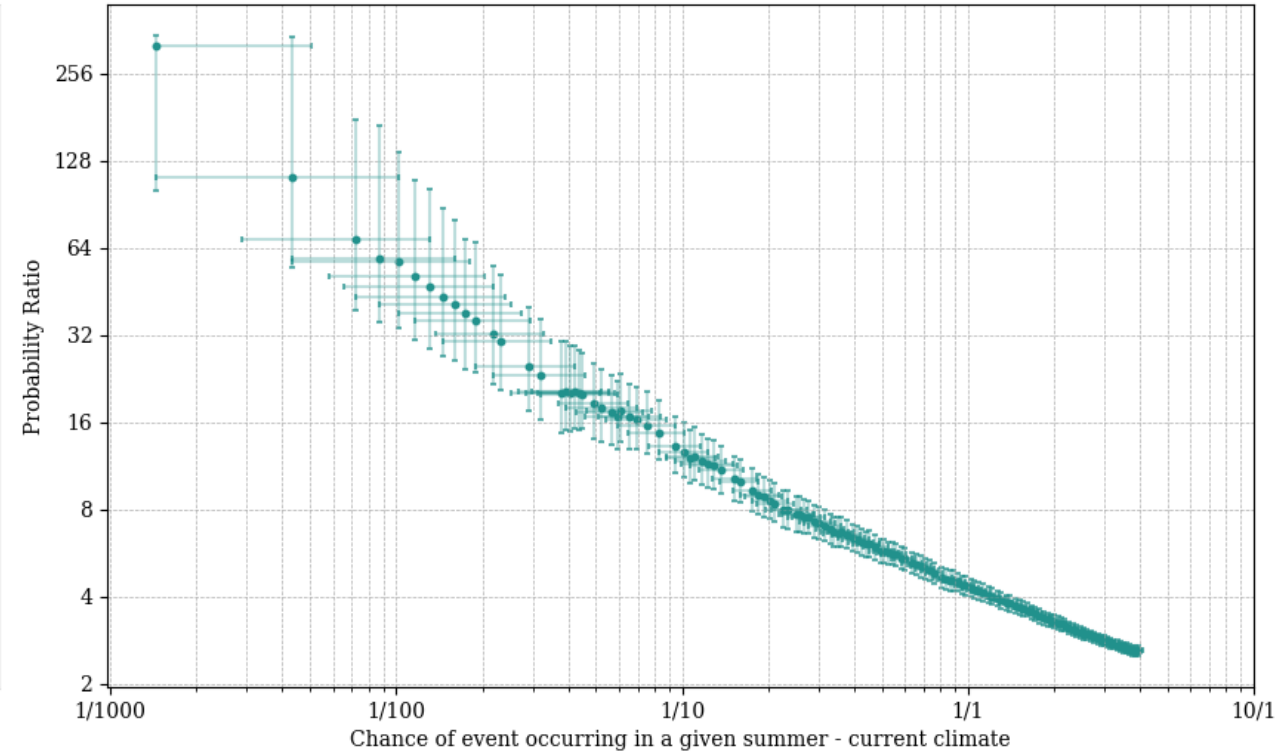
Probability Ratios of Exceeding Temperature Thresholds in Victoria under 2°C Climate



**Probability Ratio of 39°C**

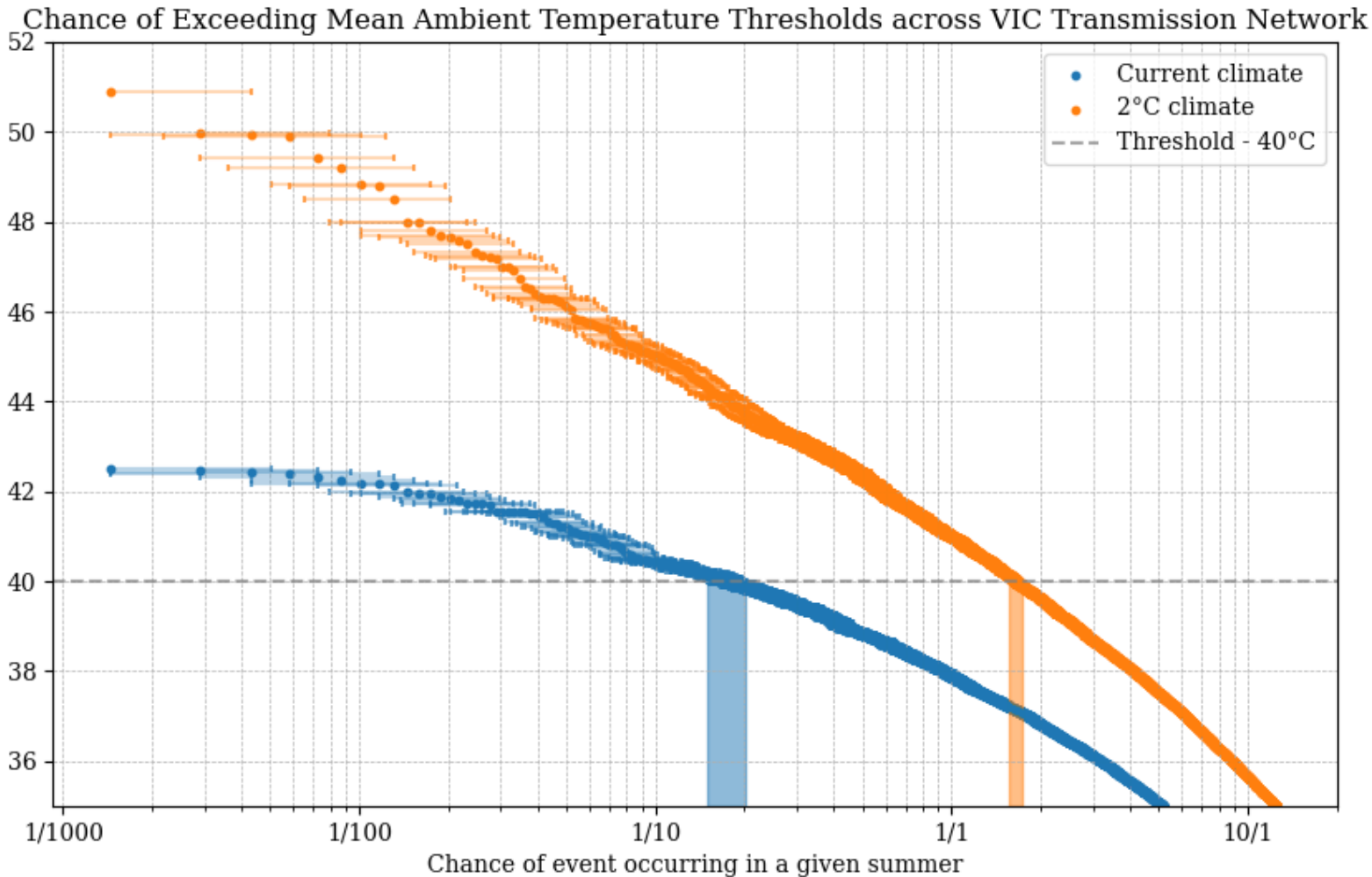
7.48 (+1.07/-0.92)

Probability Ratios of Extreme Temperature Events in Victoria - 2°C Climate vs. Current Climate



Increased probability of extreme events –  
Increasing challenge to meet infrastructure  
resilience standards

# Results: Transmission risks



## Exceedance Likelihood - 40°C

18% (+2%/-3%) ➡ 165% (+8%/-8%)

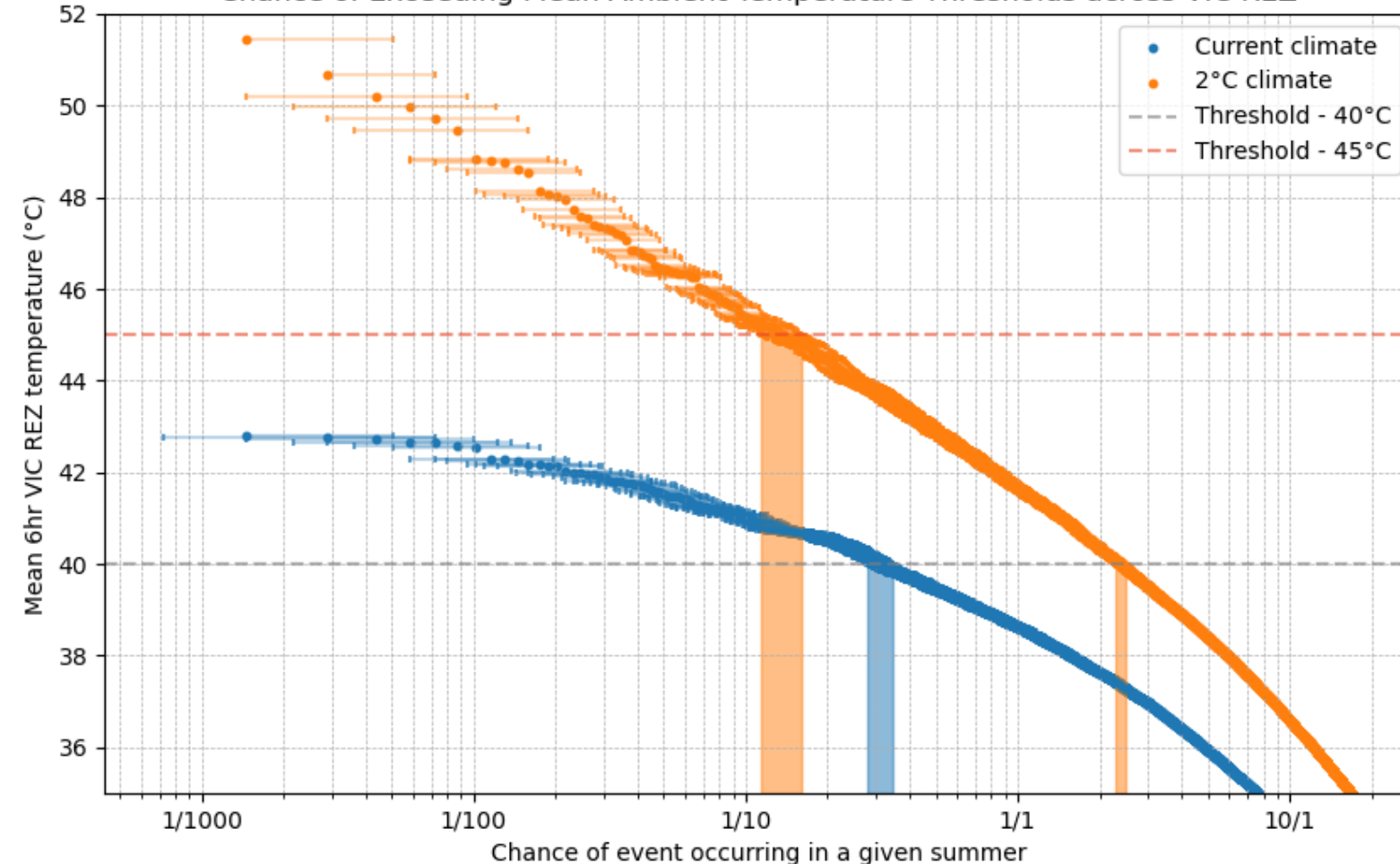
## Probability Ratio

9.45 (+1.95/-1.38)

Corresponding to maximum static and dynamic temperature ratings in Victoria

# Results: Generation risks REZs

Chance of Exceeding Mean Ambient Temperature Thresholds across VIC REZ



~20% reduction in wind and solar - 40°C

**Exceedance Likelihood**

31% (+4%/-3%) ➡ 239% (+10%/-10%)

**Probability Ratio**

7.62 (+0.90/-0.83)

~65% reduction in wind - 45°C

**Exceedance Likelihood**

Not simulated ➡ 14% (+2%/-3%)

# Results: Generation risks REZs

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Description	Temperature Threshold (°C)	Likelihood of Exceeding Threshold Under the Current Climate (%)	Likelihood of Exceeding Threshold Under the 2 Degree Warming Scenario (%)	Probability Ratio
Drop in gas power plant and BSS efficiency	35	762 (+16/-16)	1686 (+24/-28)	2.21 (+0.06/-0.05)
Significant drop in solar PV production	50	Was not simulated	0.6 (+0.6/-0.4)	N/A



# Conclusion

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- Heatwaves are expected to intensify with future climate change, posing a risk to the security of Victoria's electricity system
- Lack of regulations and industry standards to adequately assess and mitigate future climate risks
- Probabilistic approach shows significantly increased likelihood of exceeding critical whole system, transmission and generation temperature thresholds under a 2°C warming scenario
- Results demonstrate the need to incorporate climate-resilience into energy security planning to ensure system security at least cost

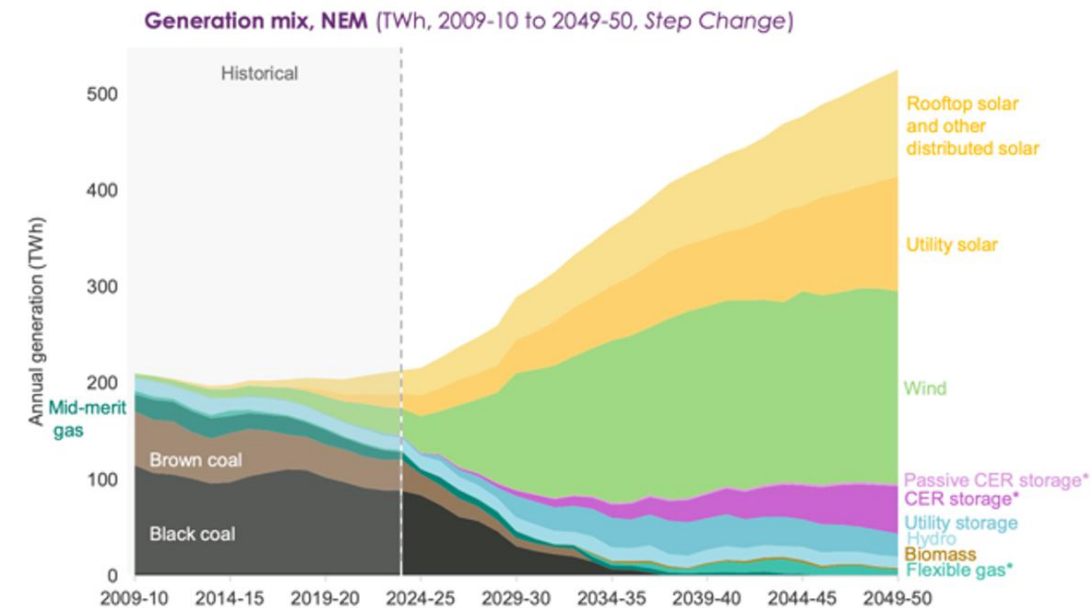
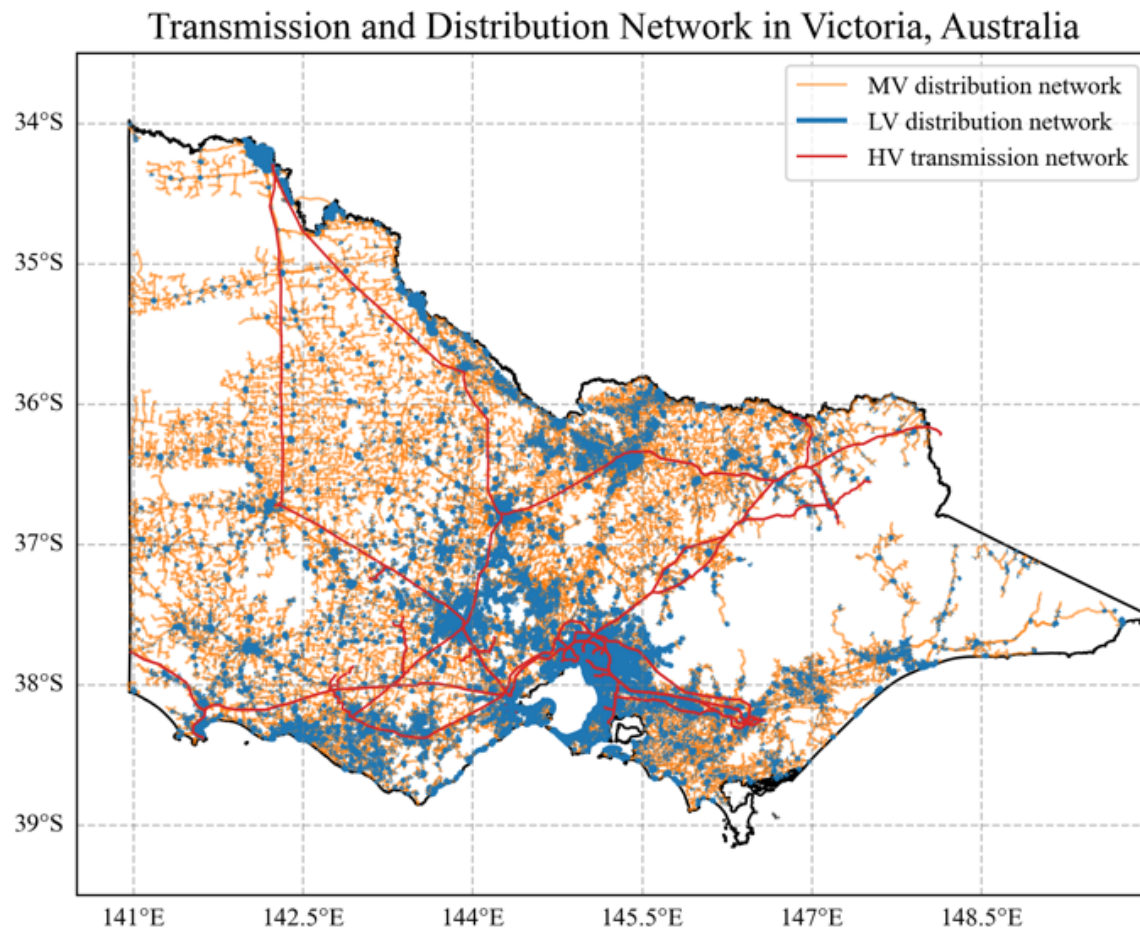
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Questions?

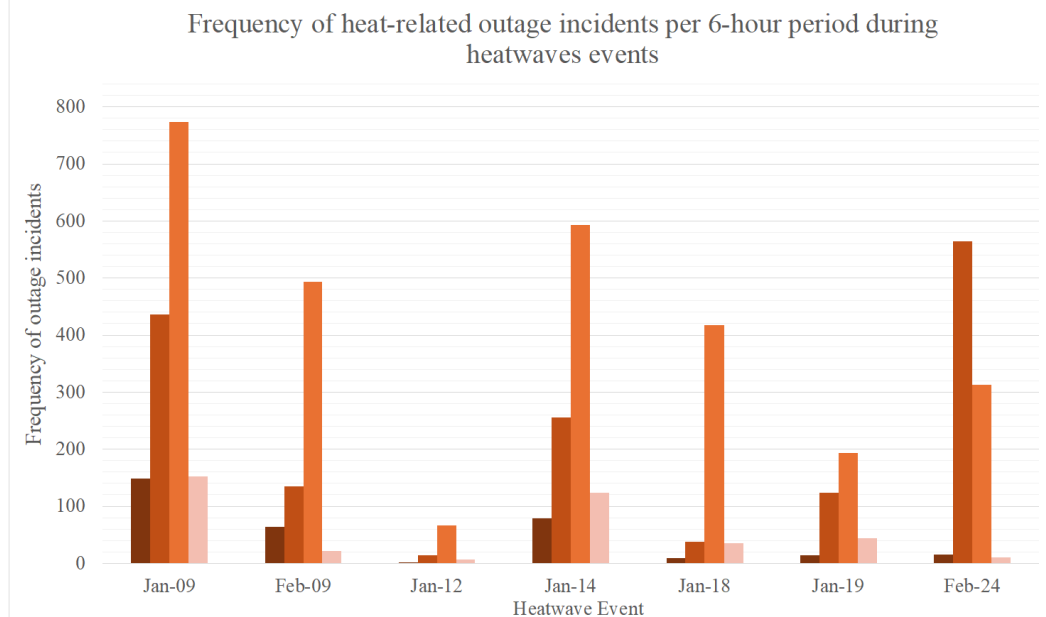
# Limitations

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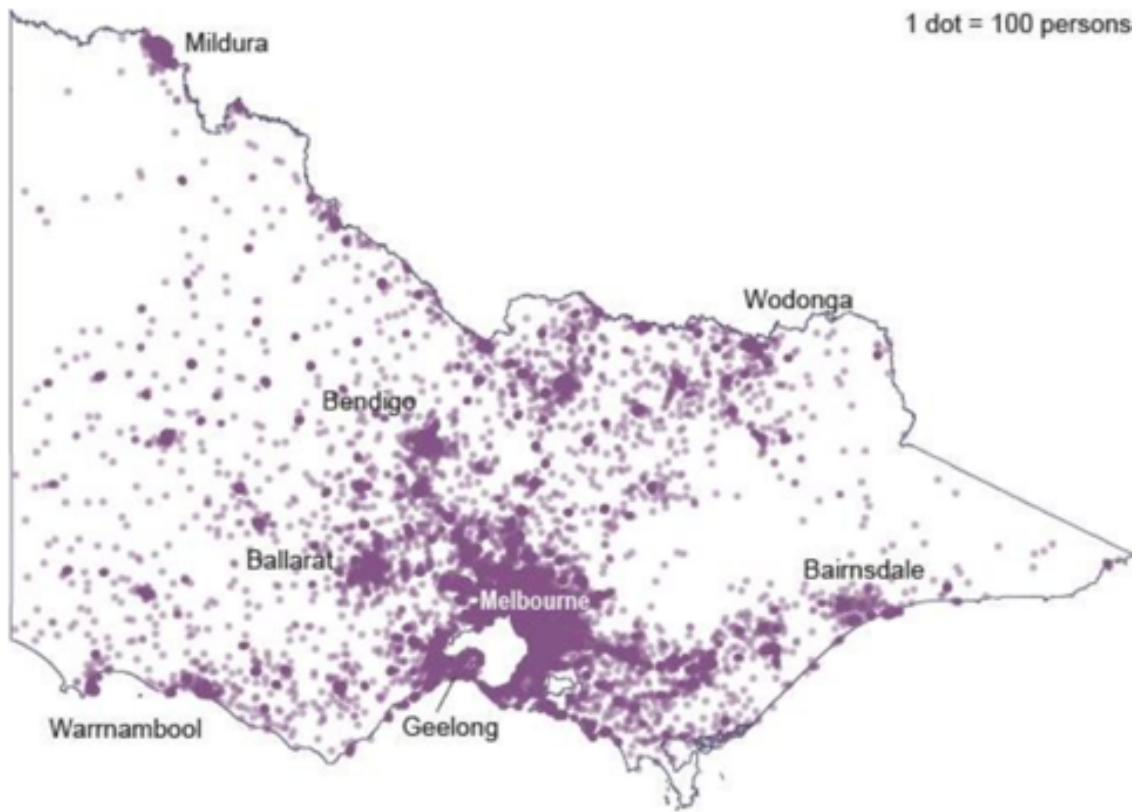
- **Dependence on Event Definition Robustness**
- **Uncertainty whether failure rates will remain constant**
- **Potential Changes in System Resilience – increase or decrease**
- **Impact of concurrent extreme weather events**
- **Exclusion of Wider NEM Influences**
- **Single model and scenario assessed**
- **Exclusion of Demand Dynamics**
- **Neglect of Urban Heat Island Effect and Humidity**



Notes: Annual generation for 2023-24 has been estimated for the full financial year.  
 "Flexible gas" includes gas-powered generation and potential hydrogen capacity.  
 "CER storage" means consumer energy resources such as batteries and EVs.

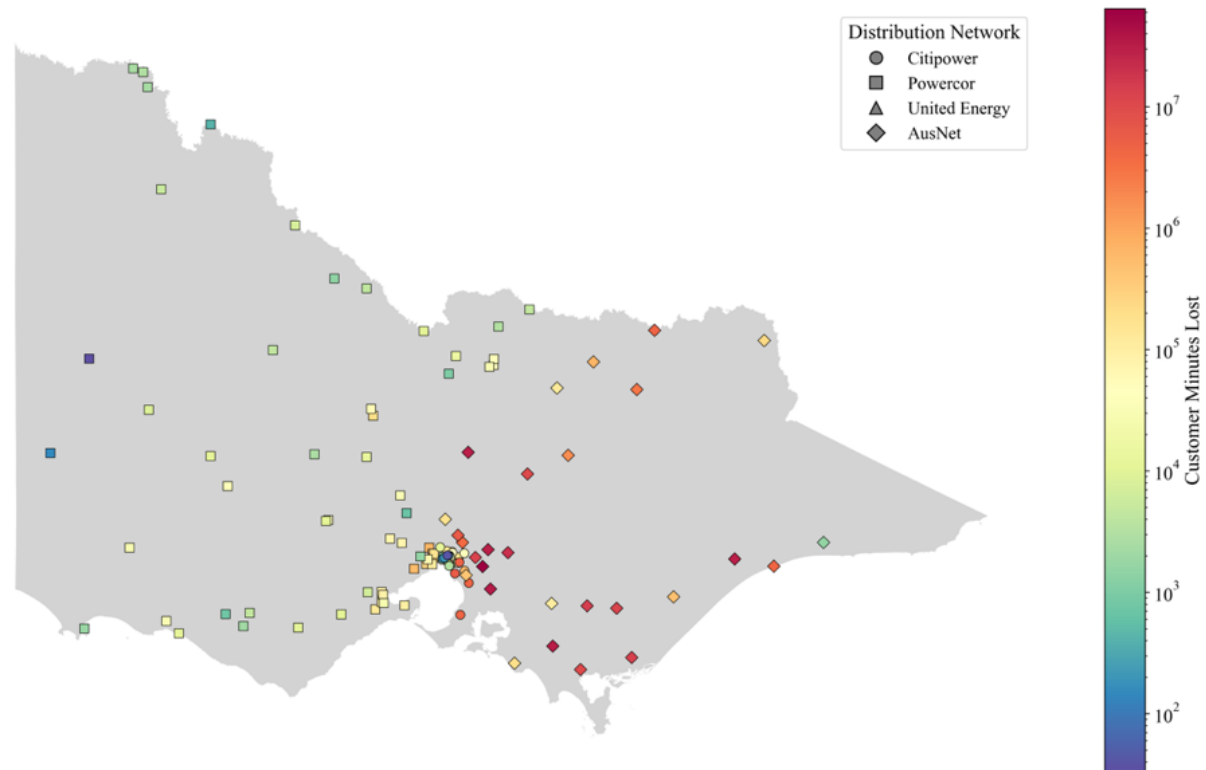




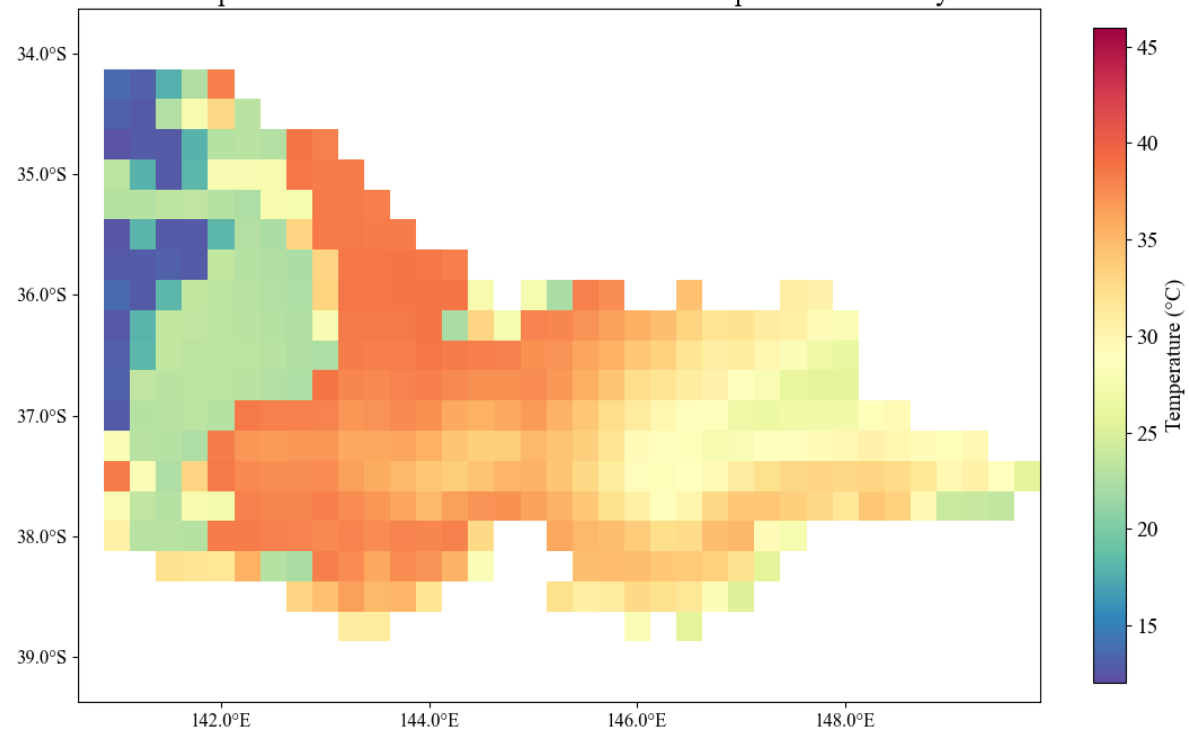


Population density, Victoria 2016 Source: ABS Census 2016

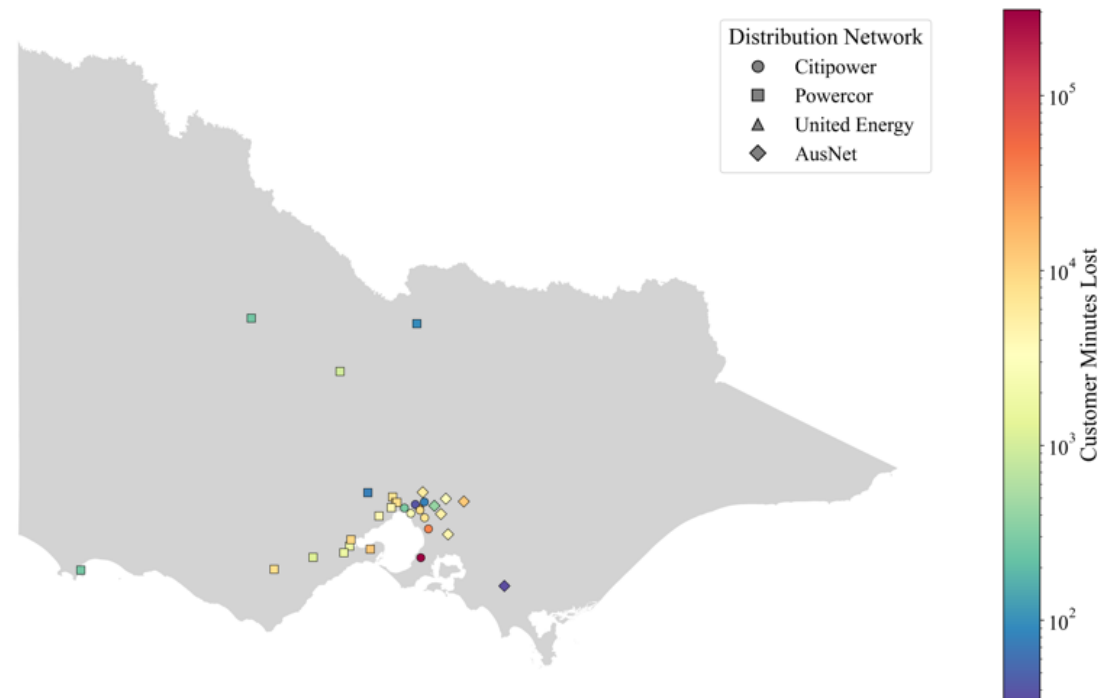
Customer minutes lost during heatwaves by location and DNO (2009-2024)



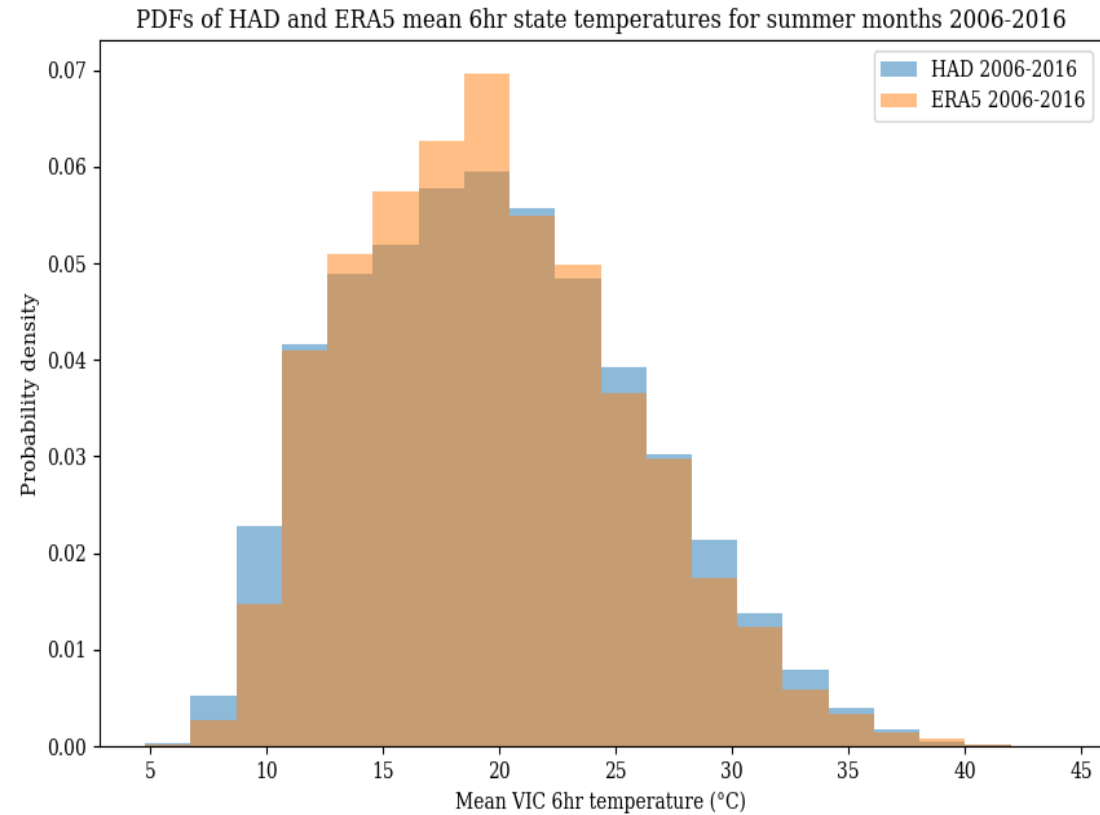
Mean temperatures across Victoria between 10am and 4pm on 2nd January 2012



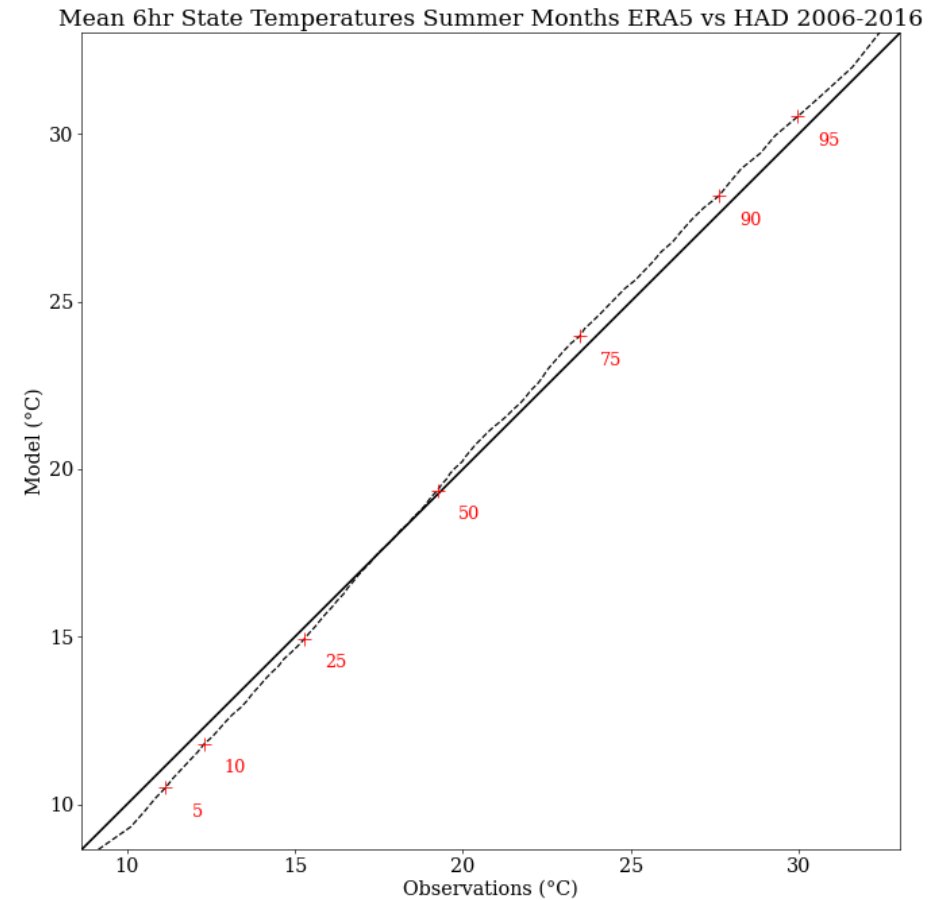
Customer minutes lost 2nd January 2012 by location and DNO



# Model Evaluation



The PDFs have a high percentage overlap of 95.28%, indicating the HadAM4 model explains the majority of observed temperature variation.



Q-Q plot shows that the model reproduces the distribution of observed mean temperatures relatively well

# Whole System Risks

Number of instances in ERA5 data above 35 Degrees Celsius for 2009–2024: 48

Number of instances in ERA5 data above 37 Degrees Celsius for 2009–2024: 17

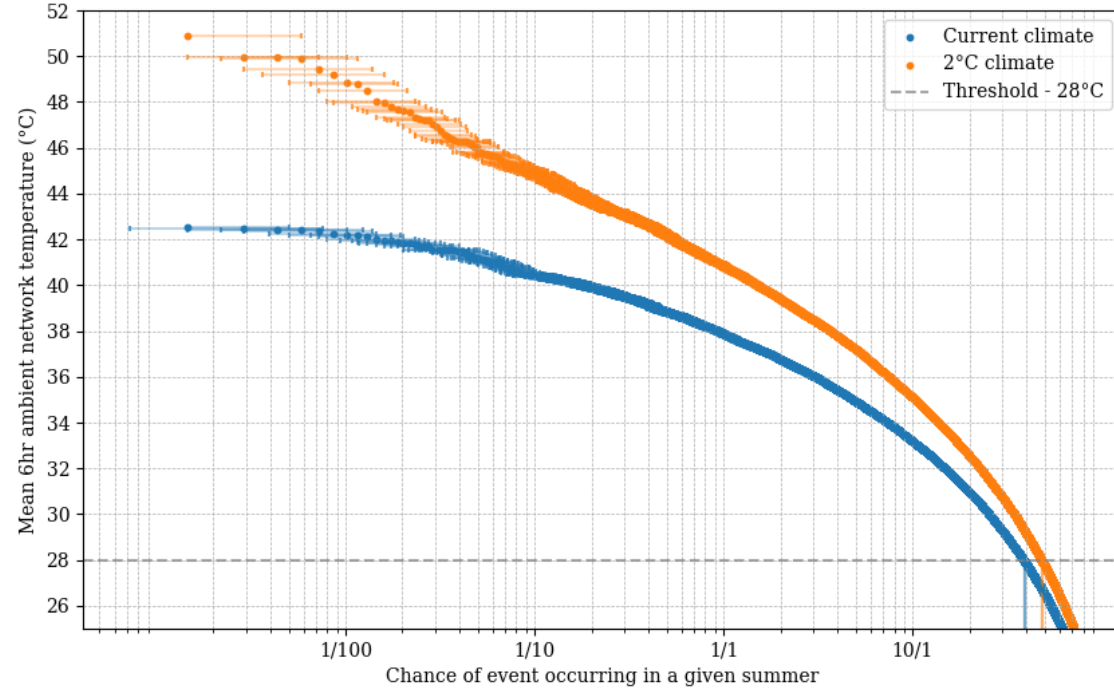
Number of instances in ERA5 data above 38 Degrees Celsius for 2009–2024: 10

Number of instances in ERA5 data above 39 Degrees Celsius for 2009–2024: 3

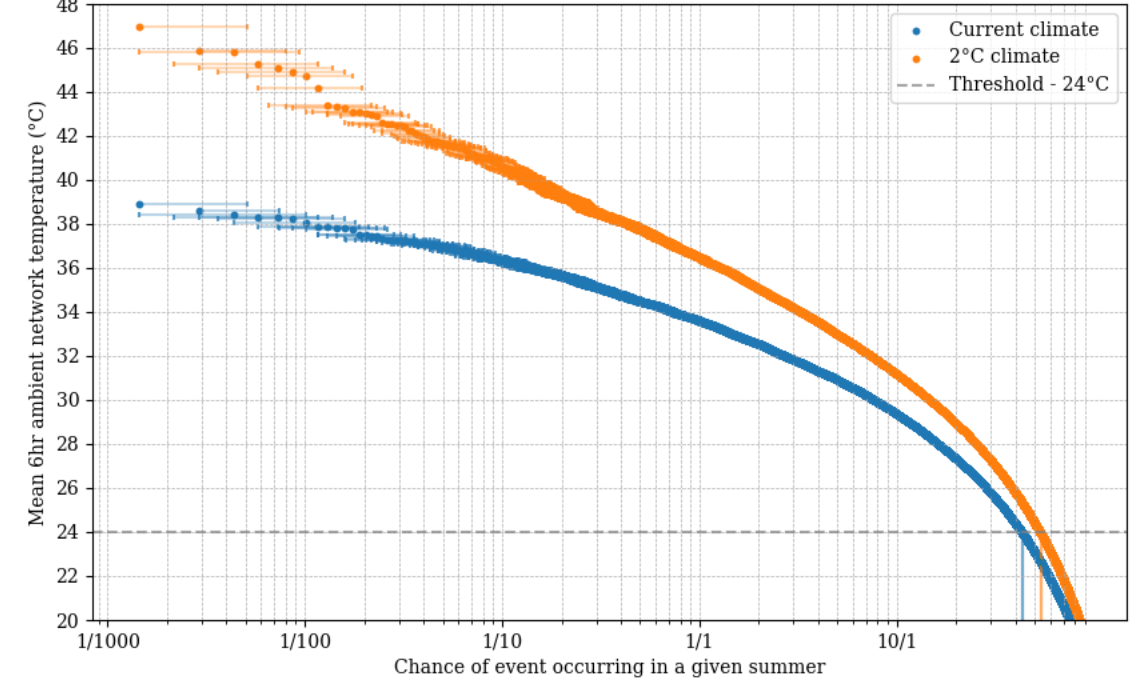
Temperature Threshold (°C)	Failure Rate (%)	Likelihood of Exceeding Threshold Under the Current Climate (%)	Likelihood of Exceeding Threshold Under the 2 Degree Warming Scenario (%)	Probability Ratio
39	100	28 (+4/-3)	206 (+9/-9)	7.48 (+1.07/-0.92)
38	70	59 (+4/-5)	318 (+11/-10)	5.43 (+0.56/-0.45)
37	41.18	122 (+7/-7)	486 (+14/-13)	4.00 (+0.27/-0.25)
35	31.25	394 (+13/-12)	1022 (+4/-5)	2.60 (+0.09/-1.00)

# Results: Transmission risks

Chance of Exceeding Mean Ambient Temperatures across VIC Transmission Network between 10am-4pm



Chance of Exceeding Mean Ambient Temperatures across VIC Transmission Network between 4pm-10pm





# Conclusions

- limited analysis at both a whole systems and component-level restricts a comprehensive understanding of climate change impacts on Victoria's electricity system. Compounding these challenges is a regulatory environment that fails to incentivize network operators and generation project developers to adequately integrate climate resilience planning