



# Update on Reliability Risk Modeling

CIFP - Resource Adequacy  
May 30, 2023

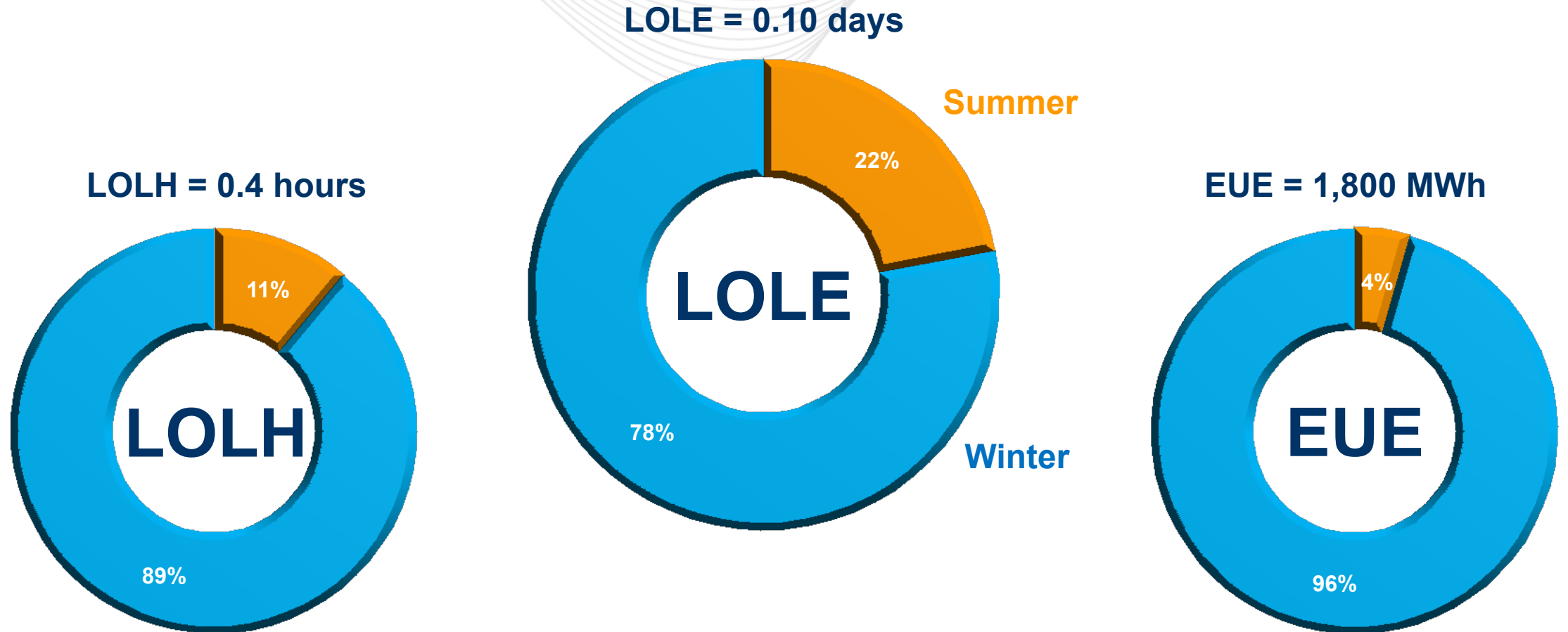
- Provide an update on PJM's proposal for enhancing reliability risk modeling in resource adequacy studies
- Share *preliminary* results on the patterns of reliability risk observed for the RTO with the new model
- Solicit stakeholder feedback on the analysis and preliminary results and how this might inform the market design

## Enhance reliability risk modeling, especially that of winter risks

- Explicitly model how **forced outages and other de-rates vary with temperature** (increasing in extreme cold and hot) *and* are further **correlated across the fleet** even after accounting for unit-specific performance dependence on temperature
- **Expand weather history in reliability modeling** to 50+ years (*currently 28 years in updated model*) to better represent the full distribution of summer and winter weather outcomes
- Move to Expected Unserved Energy (EUE) as the primary reliability metric
- Move to hourly modeling in the reserve requirement studies

**Result:** reliability risk modeling that better captures the likelihood, severity, and patterns of risk

# Preview of Preliminary Analysis Results



## Weather Scenarios



Historical weather patterns observed from expanded history

- *Adjusted to capture impact of climate change on temperatures*

## Load Scenarios

Hourly load profiles derived from PJM's Load Forecast model for each weather scenario

- *Weather patterns shifted forward and backward to account for day of the week / holiday variables*

## Resource Performance

Unit, class, & fleet historical performance (forced outages, ambient de-rates, etc.) as a function of weather for thermal and variable generation

- *Correlated outages for any reason captured in class/fleet outage rates above the "typical range"*

## Resource Adequacy Analysis

Model system resource adequacy under thousands of alternative histories

- *One alternative weather history, reflecting distribution of uncertainty given 50+ years of history*
- *One alternative load history, reflecting distribution of load forecasts given weather, time/date, etc.*
- *One alternative realization of capacity resource performance, reflecting distribution of potential performance of individual resources and historically observed correlations across resources*

## Patterns of Reliability Risk

LOLE vs. LOLH vs EUE metrics

- *Summer vs. winter? Morning vs. midday vs. evening? Long vs. short events? Deep vs. shallow?*

## Thermal Generation

Forced outages (including ambient de-rates) modeled as a function of temperature based on historically observed performance back to 2012

- *Each historical day provides an observation of hourly forced outage rates for individual units and classes*
- *Each historical day of observed generator performance is grouped into daily temperature bins (based on min daily temperature in winter and max in summer)*
  - *e.g. bin1 for winter might include all days of observed performance with min. daily temp. below 0°*
- *The Monte Carlo analysis then draws against observed performance from the appropriate temperature bin for a given day (and temperature) of the historical weather scenarios*
  - *e.g. if Jan X, '94 has a daily min temp. of -10°, the analysis will draw against all observations of performance in bin1*

Planned / maintenance outages “optimally” scheduled for a given weather scenario and load profile

## Variable Resources

Performance modeled as a function of weather and historically observed performance (or back-casts) back to 2012

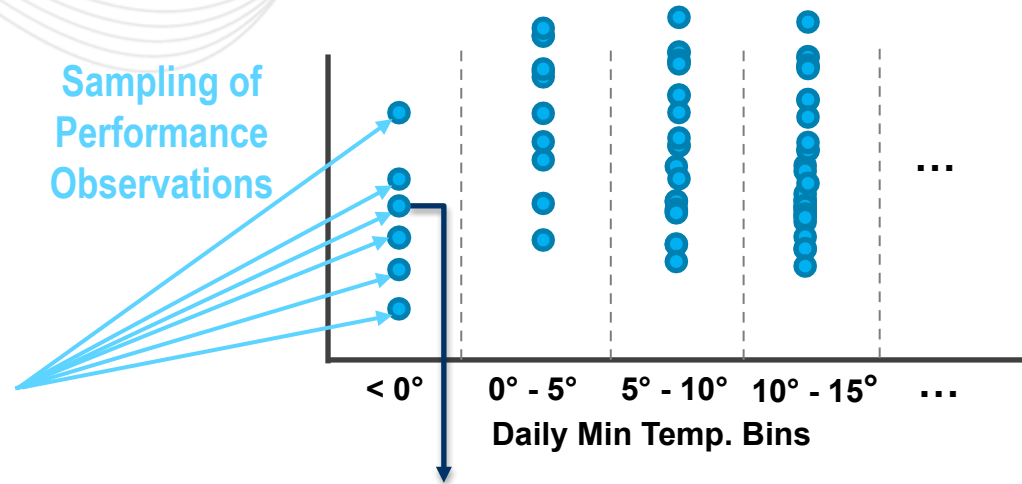
- *Monte Carlo analysis draws from performance data in similar manner as thermal availability / forced outage rates*

# Monte Carlo Draws of Thermal and Variable Performance (Illustrative Example)

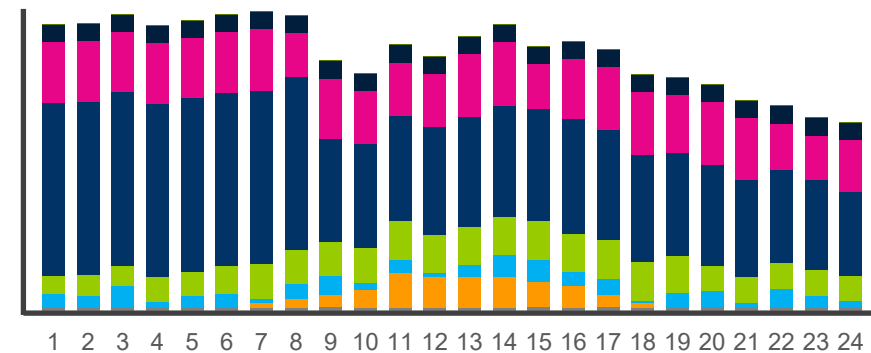
## Weather Scenarios

Weather Year	Date	Season	Daily Temp.
197X	Jan. 1	Winter	4° (min)
197X	Jan. 2	Winter	8° (min)
197X	Jan. 3	Winter	7° (min)
...	...	...	...
1994	Jan. X	Winter	-5° (min)
...	...	...	...
2012	7/15/12	Summer	92° (max)
2012	7/16/22	Summer	89° (max)
...	...	...	...
2022	Dec. 31	Winter	12° (min)

Daily Historical Winter Observations of Availability / Performance by Temperature Bin (since 2012)



Sample Observation: Feb. X, 2015 Hourly Availability\*

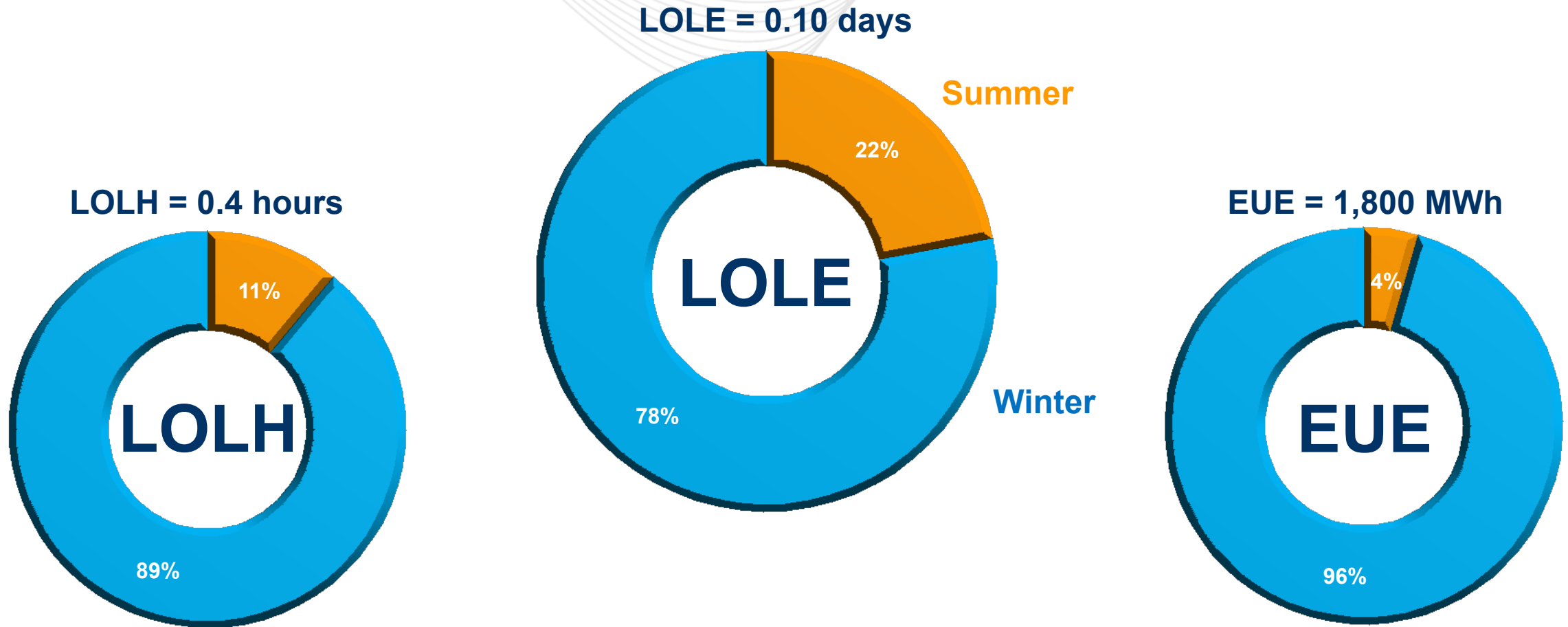




# Preliminary Analysis Results



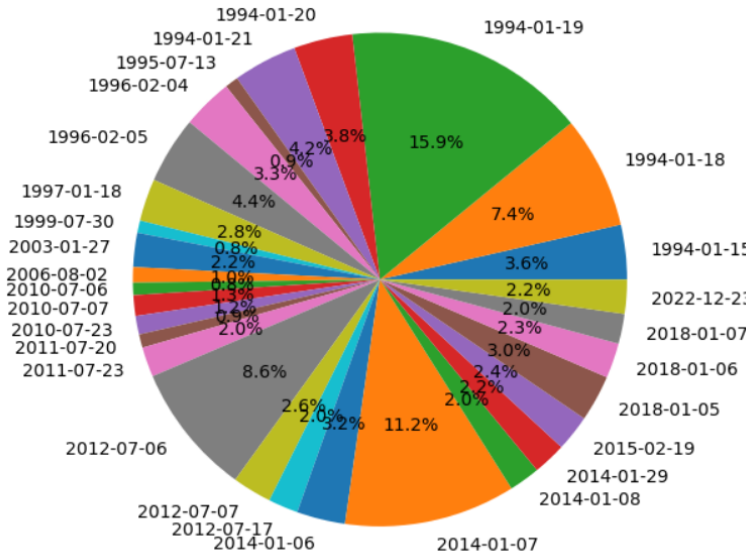
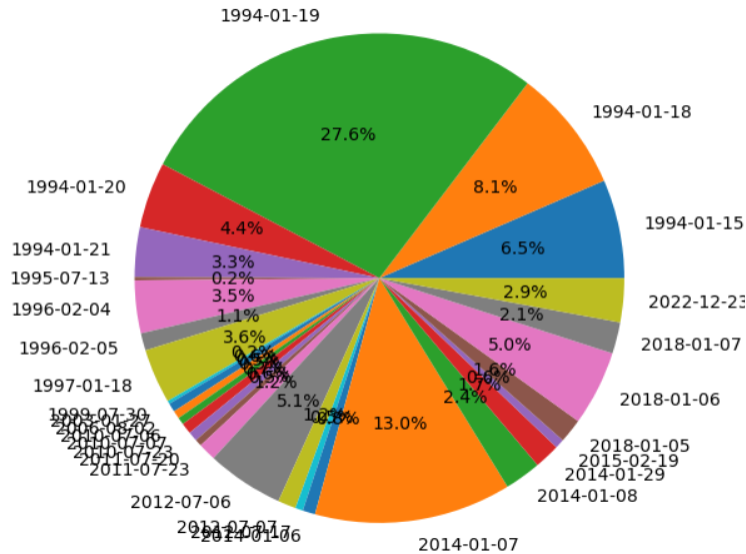
# Preliminary Analysis Indicates Shifting Risks



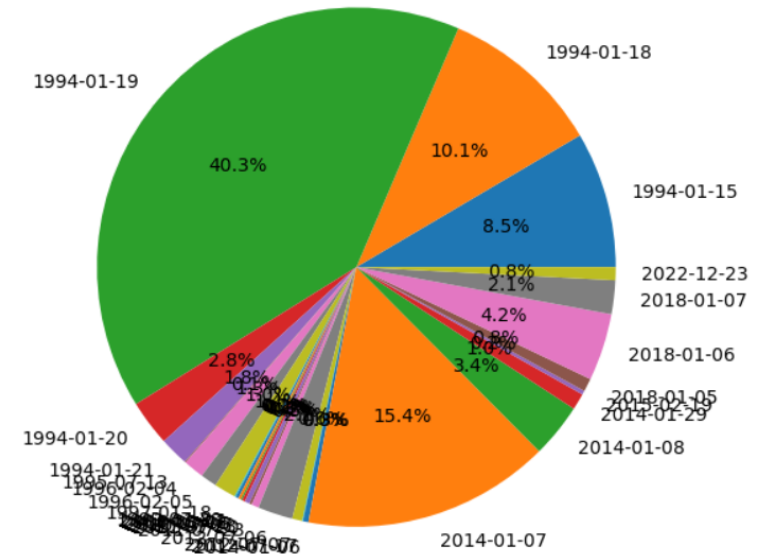
# Winter Risk Driven by Extreme Weather

**LOLE = 0.10 days**

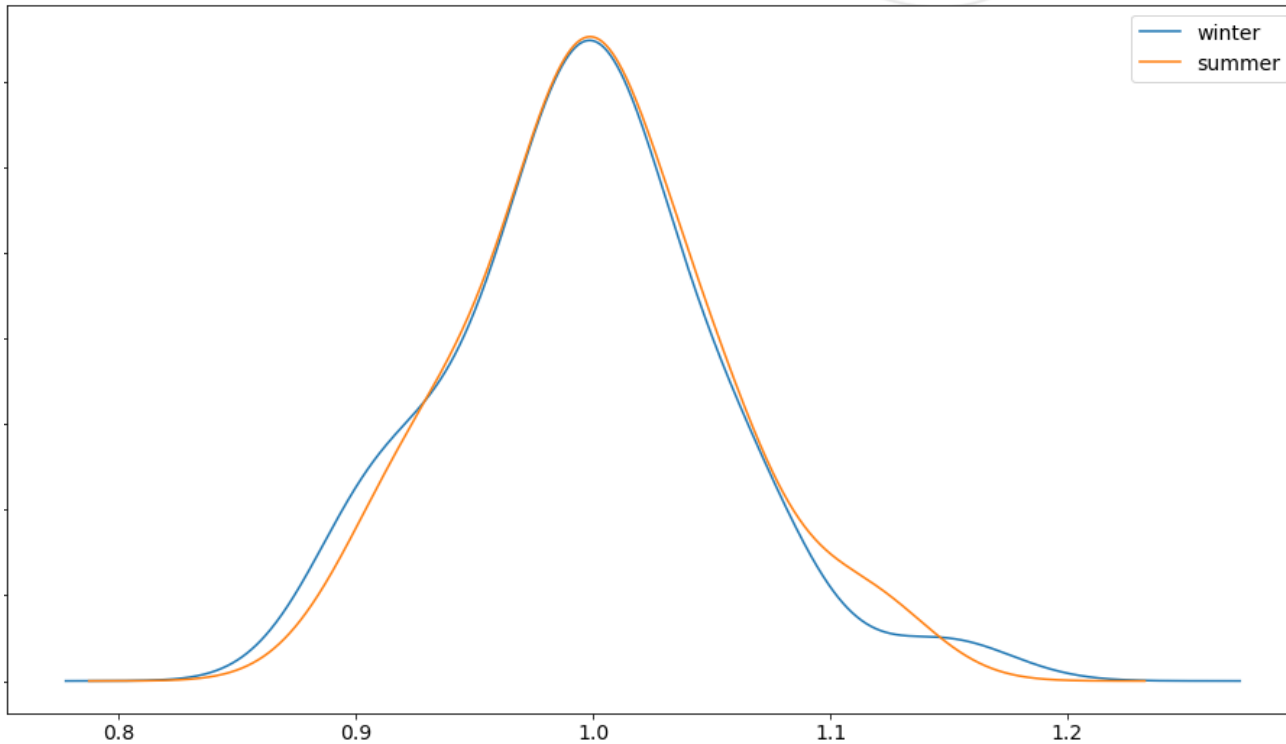
**LOLH = 0.4 hours**



**EUE = 1,800 MWh**



## Distribution of seasonal peak load forecast across years, relative to the respective 50/50 peak

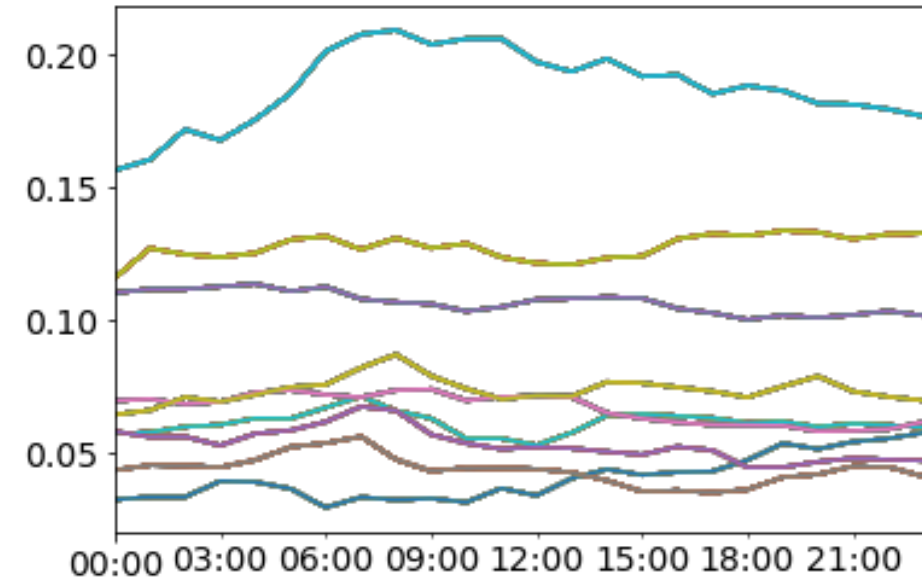
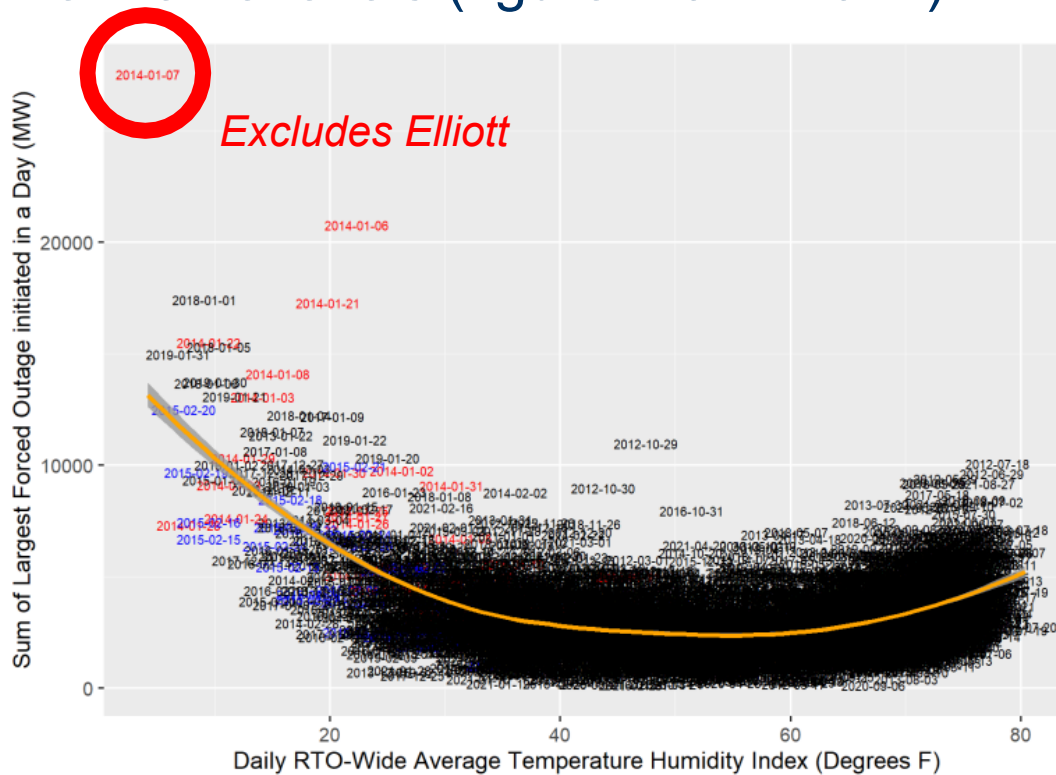


Loads during coldest temperatures are high (relative to 50/50 winter peak) but overall volatility of winter load does not appear to be primary driver of new winter risk

**Historical thermal forced outages** increase during colder temperatures, and can reach extreme levels (figure: 2012-2021)

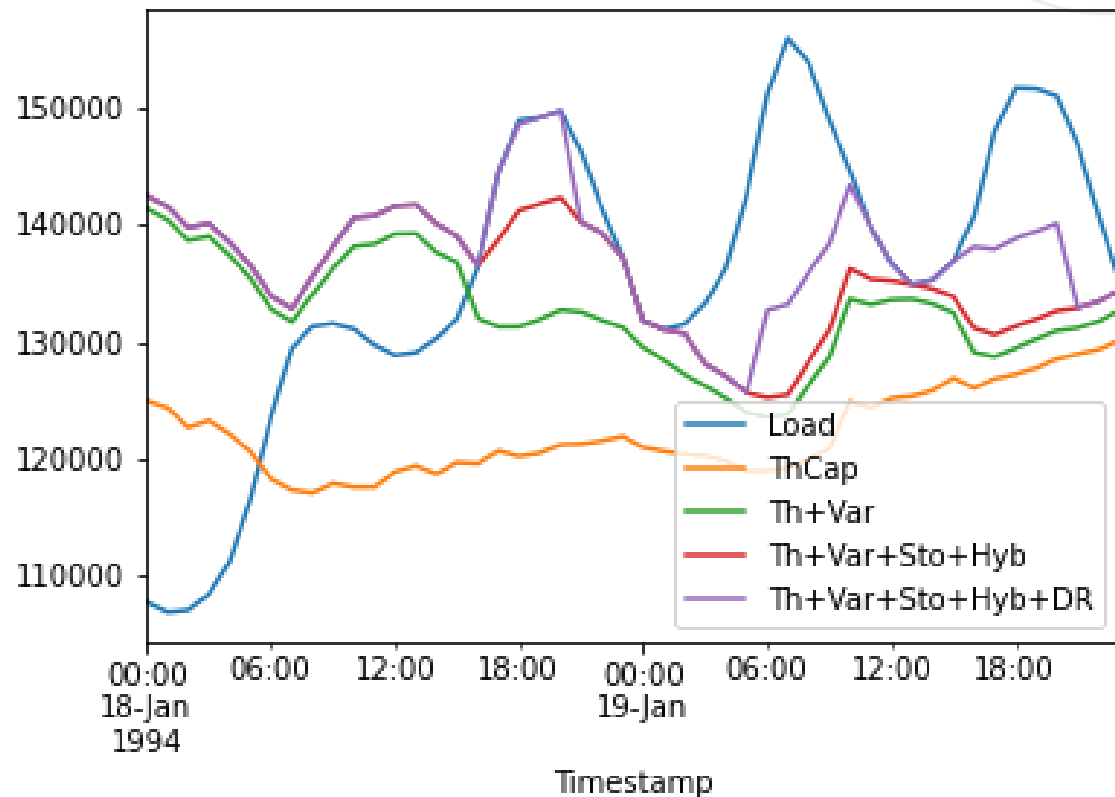
**Winter risk** is driven by extreme correlated outage potential

Thermal forced outage rate patterns on Jan. 19, 1994 (9 patterns)

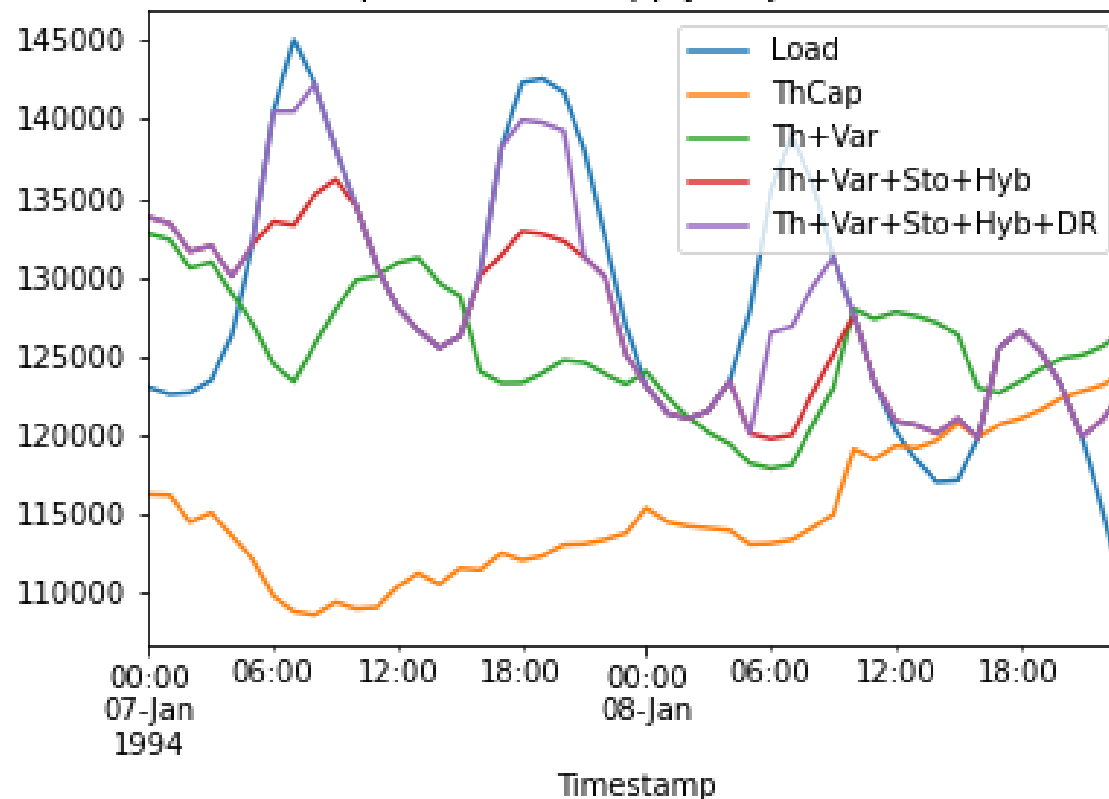


## Extreme Correlated Outage Events Driving Substantial Winter Risk

Sample Demand/Supply on Jan 18-19 1994



Sample Demand/Supply on Jan 7-8 2014



## Back of the envelope

- Peak load forecasts (2026/27):
  - Summer 50/50 forecast: 153 GW; 90/10: 167 GW
  - Winter 50/50 forecast: 137 GW; 90/10: 146.5 GW
- Historical supply outages:
  - Worst summers: ~15 GW (July 2012)
  - Worst winters: ~46 GW (Dec. '22); ~40 GW (Jan. '14)

Seasonal differences in worst-case supply outages (25+ GW) can be significantly more than differences in peak loads (15-20 GW)

## Sensitivity analysis

- Inclusion/exclusion of worst historical winter (1994)
- Inclusion/exclusion of historical fuel-related outages
- Inclusion/exclusion of planned & maintenance outages during peak winter period
- Various methodologies for re-sampling from historical data

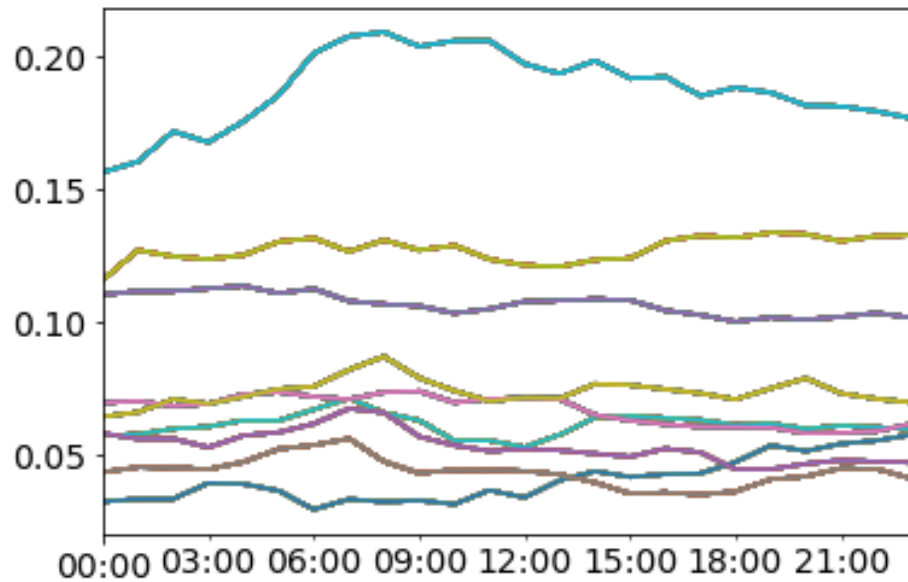
In all cases, winter risk significantly exceeded summer risk on LOLE, LOLH, and EUE basis

- Preliminary analysis is showing a significant shift in reliability risk to the winter.
- These results suggest improved alignment between the reliability risk analysis and the empirical observations of cold weather operational events seen during Winter Storm Elliott, Uri, and others.
- This supports a move away from the traditional industry assumption that risk aligns solely with peak load.
- A shift in the reliability risk profile for the RTO may require associated changes to the capacity market to ensure it remains effective.

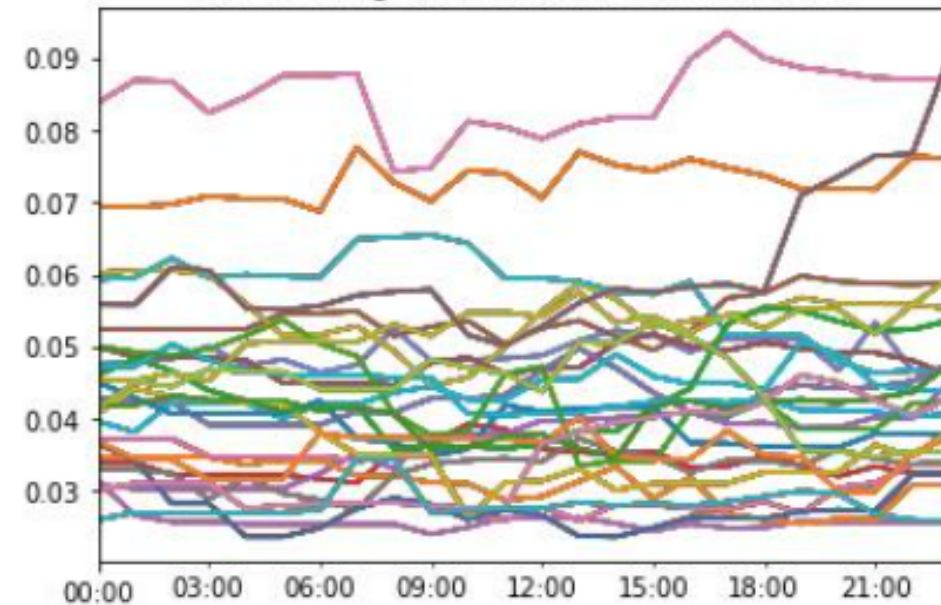
# Appendix



## Forced Outage Patterns under Most Extreme Winter Temperatures



## Forced Outage Patterns under Most Extreme Summer Temperatures



- **Delivery Year of Analysis:** 2026/2027
- **Weather Scenarios:**
  - Currently goes back to 1994 in this analysis
  - No adjustment for climate change applied in this analysis
- **Load Profiles:**
  - Based on 2023 Load Forecast model
  - Day of the week shifting not applied in this analysis
- **Resource Performance History:**
  - 2012 – 2022 (*includes WSE availability data*)