



**SOLAR ENERGY**  
**TECHNOLOGIES OFFICE**  
U.S. Department Of Energy

# **Forecasting Session I: Solar Forecasting 2**

## **Coordinated Ramping Product and Regulation Reserve Procurements Using Probabilistic Solar Power Forecasts**

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# Project Team

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**IBM:** Hendrik Hamann (Co-PI), Rui Zhang

**University of Texas Dallas (UTD):** Jie Zhang (Co-PI), Binghui Li

**Industry Partners:** Amber Motley, Clyde Loutan, Rebecca Webb (California ISO), Blagoy Borissov, Steven Rose (Midcontinent ISO)

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# Project Summary

**Objective:** Integrate probabilistic short- (2-3 hr ahead) and mid-term (day-ahead) solar power forecasts into operations of two ISOs:

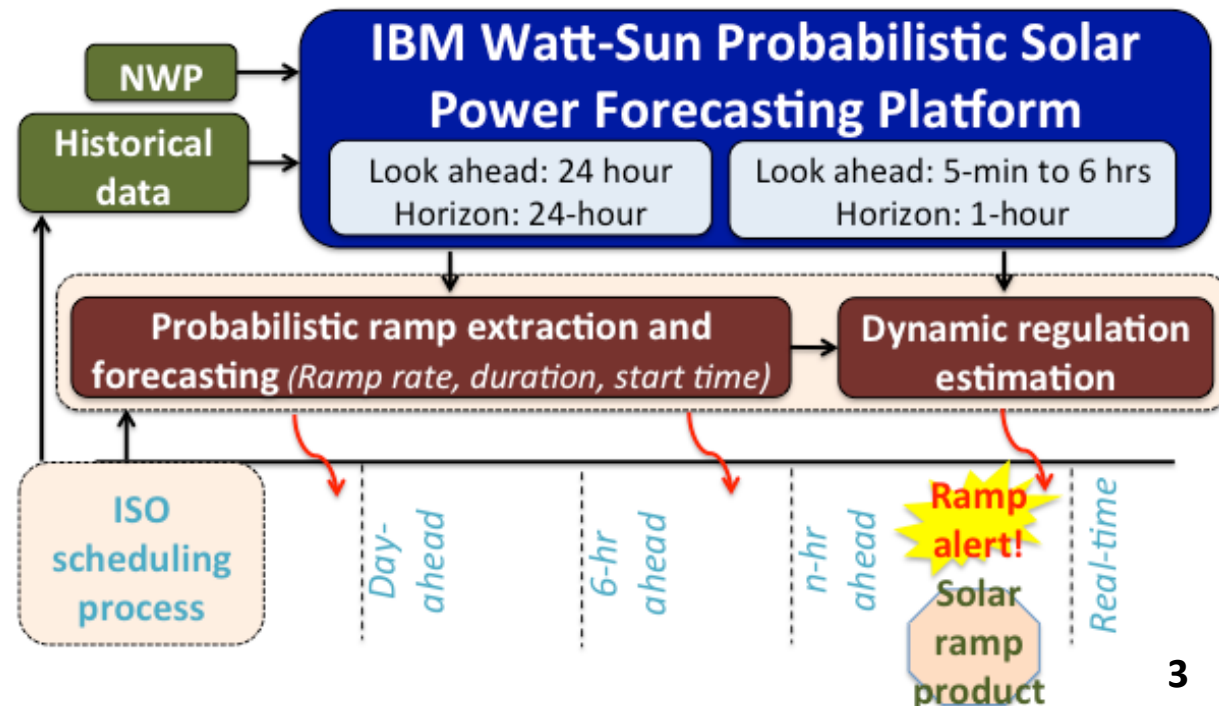
- CAISO & MISO

## Approach:

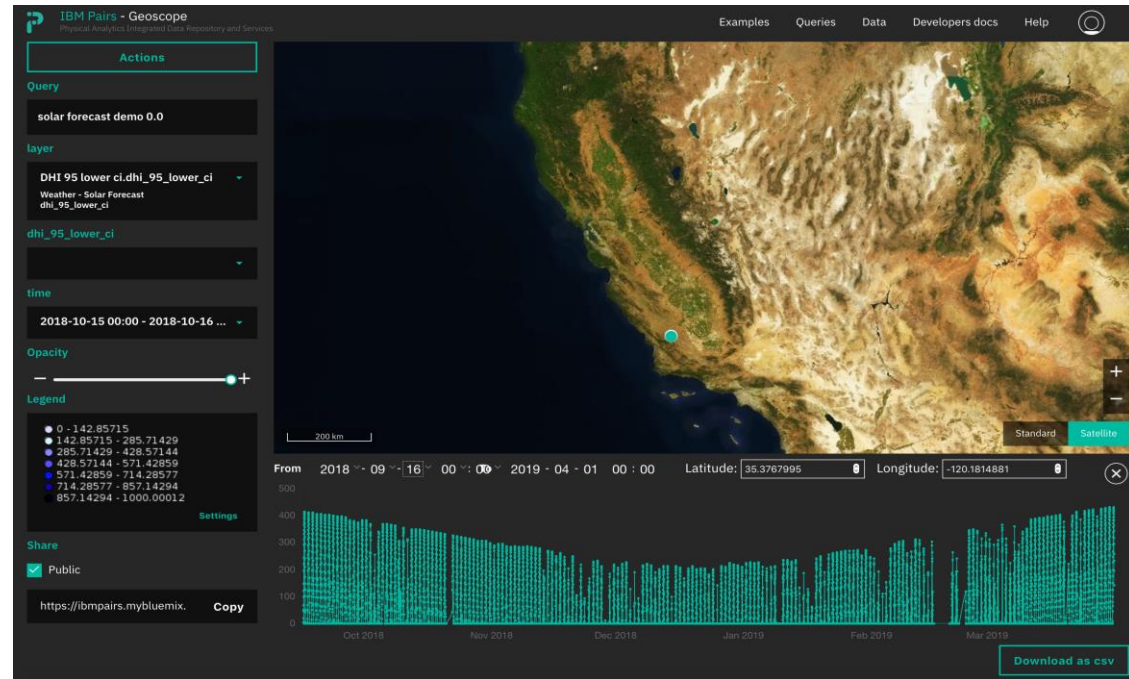
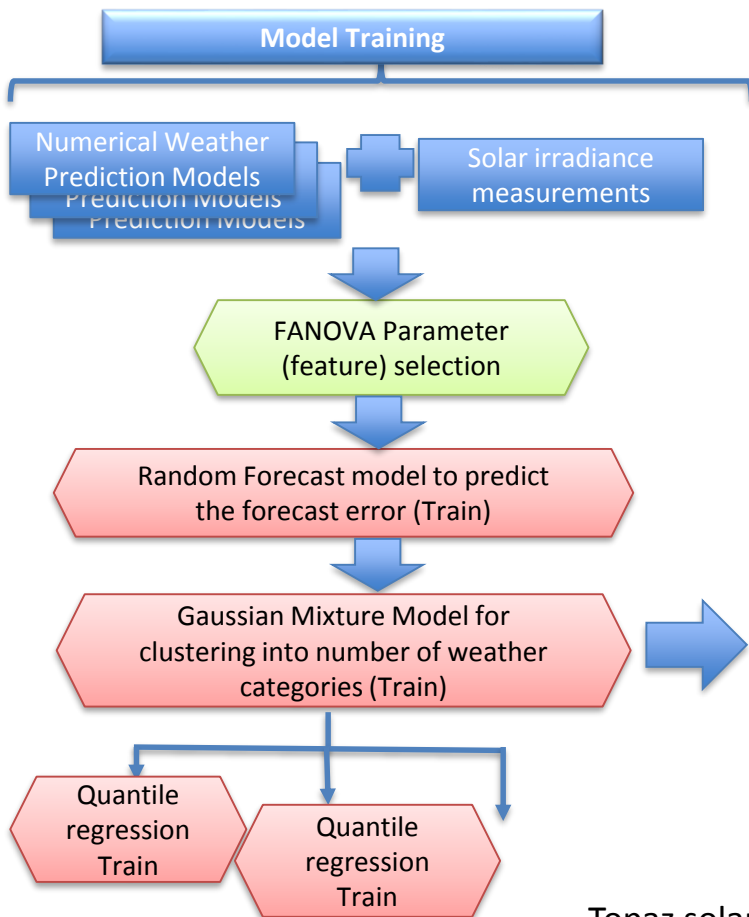
**Thrust 1:** Advanced big data-driven “probabilistic” solar power forecasting technology using IBM Watt-Sun & PAIRS (Big data information processing and machine learning approaches to blend outputs from multiple models).

**Thrust 2:** Integrate probabilistic forecasts in ISO operations for *ramp product & regulation* requirements

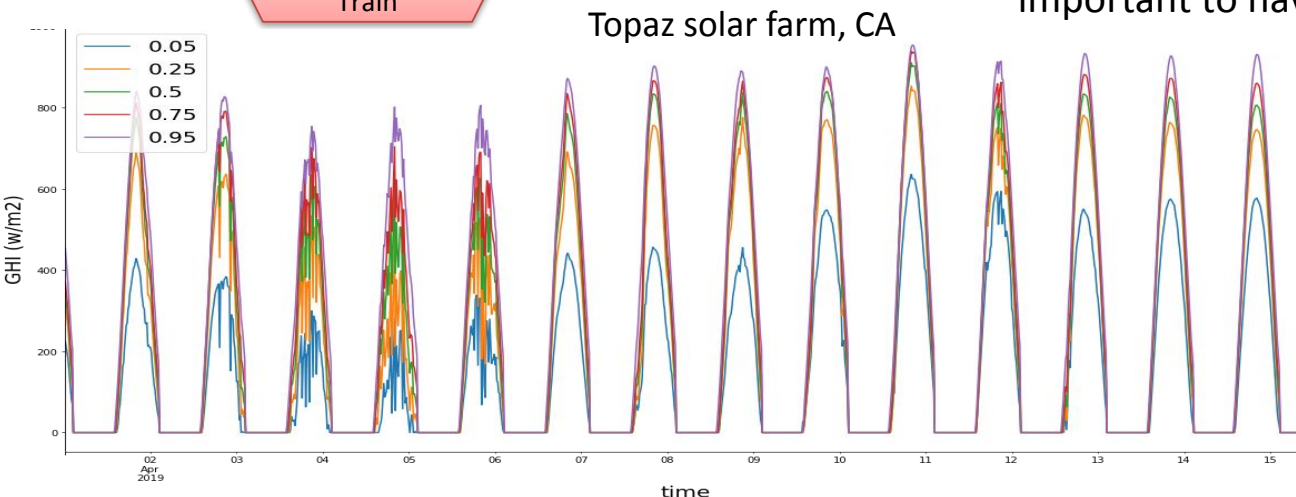
**Thrust 3:** Provide situational awareness via visualizations of probabilistic ramp forecasts & alerts



Use trained models and quantile regression for **FORECASTING**



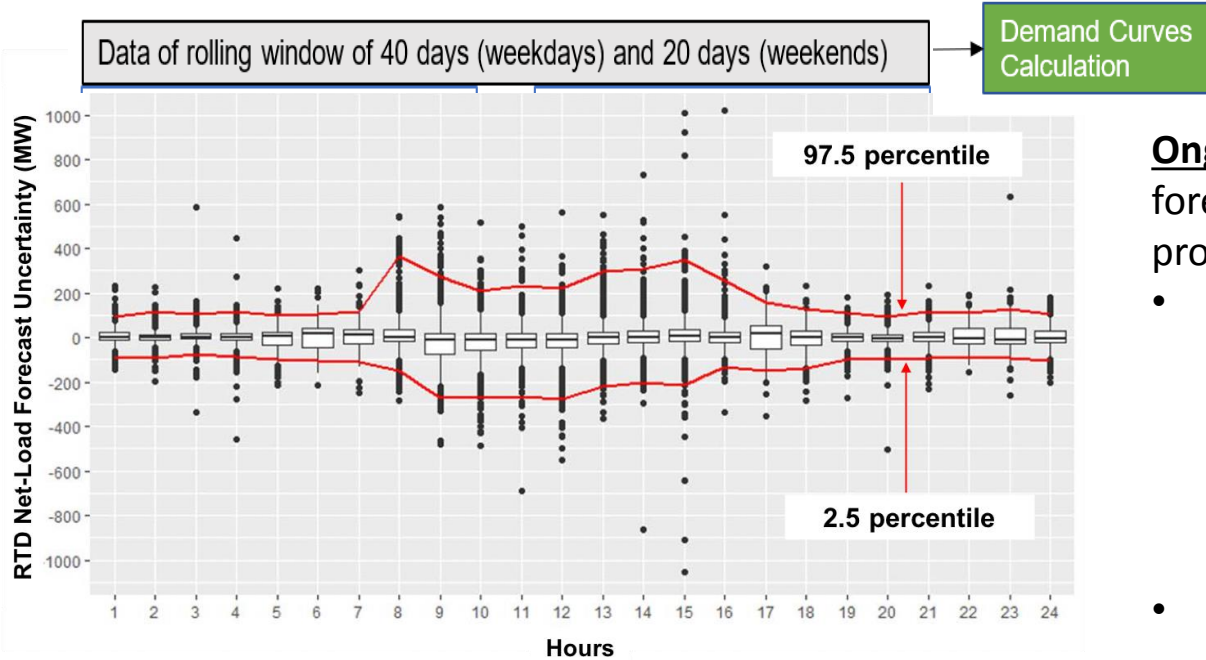
**Finding:** Distribution is asymmetrical, hence important to have quantile regression techniques



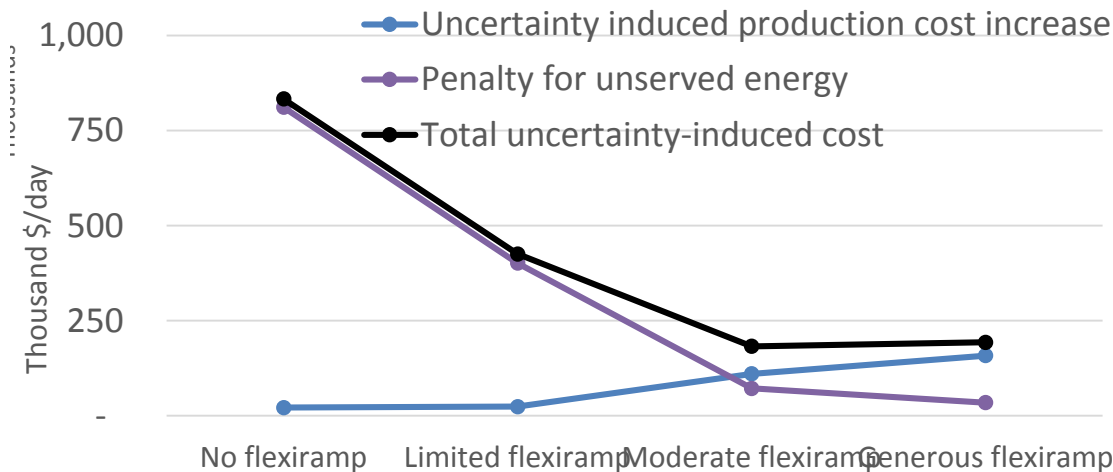
**Future work:** AI based short term forecast methods using GOES-R, e.g., Generative Adversarial Neural Network

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**Progress 1:** ISO baseline Flexible Ramping Product (FRP) procurement uses historical forecast errors.



**Progress 2:** Reliability vs. economics of various FRP levels. (IEEE 118 bus system market simulations)



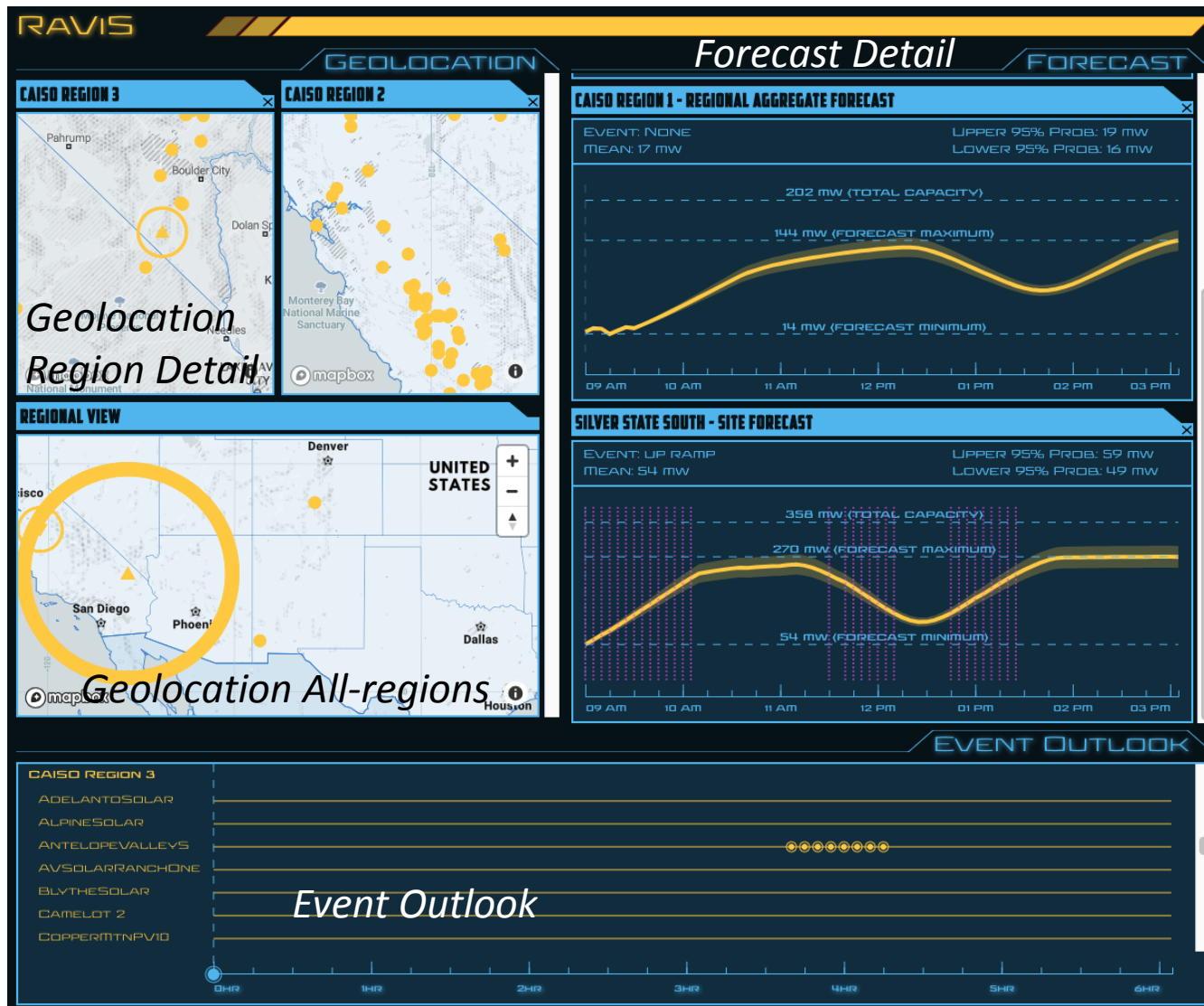
**Ongoing work:** Integrate probabilistic forecast into ISO FRP procurement process.

- Estimate probabilistic net-load forecasts from IBM solar forecasts using convolution (considering dependence across sites and components).
- Compare the levels of uncertainty in probabilistic forecasts and histograms of historical error.
- Estimate cost and reliability impacts of probabilistic net-load forecast based FRP procurement under high solar futures (IEEE 118 bus and ~20,000 WECC systems)

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# Ramp Visualization for Situational Awareness (RaViS)

## Thrust 3



### Features:

- Forecast data from IBM integrated
- RaViS refresh rate of 60 seconds
- User interface: Single page web application and open source
- Shows site specific metadata via hover
- Highly flexible and easily configurable

### Future work:

- Net-load ramps
- Adaptable to other kinds of events: outage/trip, cyber threats