



Energy Efficiency and  
Renewable Energy



California Solar  
Energy Collaborative

# How geographic smoothing and forecasting RD&D can help high penetration of distributed generation

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# How Solar Forecasting RD&D can Help Advance DG, RPS and AB32?

- What is the role of RD&D in advancing DG and helping achieve the Governor's Clean Energy Jobs Plan [...], the Renewable Portfolio Standard and AB 32?
- Which technologies or components should RD&D efforts focus on to address some of the barriers for advanced DG deployment?
- Are currently existing technologies and tools enough to power facilities with nearly 100 percent renewables in a technically and economically feasible manner?
- What are some emerging technologies that may be able to reduce costs when produced at scale?
- What issues impede the deployment DG technologies in utility distribution territories that RD&D can help address? If so, please identify the issue and how RD&D can help in a manner that benefits both the utilities and customers.
- What other future research direction, focus, strategies or initiatives may be recommended for PIER to undertake so that RD&D can better help advance DG?

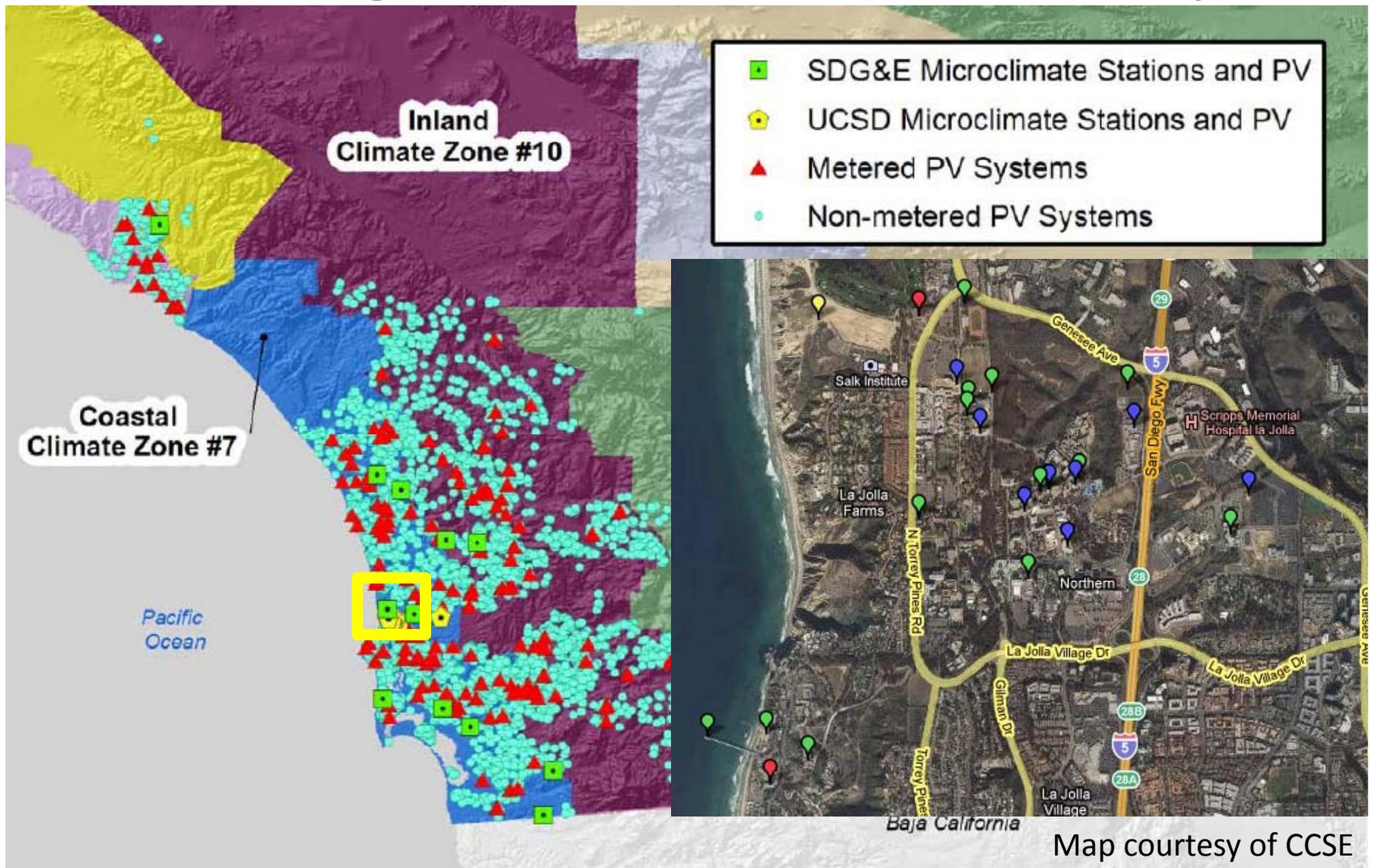
# Variability of Solar Irradiance as an Impediment to High Solar Penetration

- Distribution system
  - Voltage changes; wear and tear on voltage regulation equipment
  - Reverse power flows
- Transmission system
  - Low penetration: forecast error leads to increase in reserve costs, inefficient transmission scheduling
  - High penetration: curtailment, storage

# The Role of RD&D in Solar Forecasting

- The ultimate goal is to be 90% accurate (MAPE) in intra-hour solar forecasts for spatial areas of 10 sq.m.
- The ultimate goal is for solar forecasts to raise the intra-hour reliability for a spatially dispersed DG network to be characterized as a firm generation intra-hour resource on a distribution circuit and a wider regional area
- The ultimate goal is for solar forecasts to be integrated with energy storage for intra-hour charge-discharge algorithms
- The ultimate goal is for solar forecasts to reduce non-renewable peaker generation, spinning reserves and permanent load shifting.

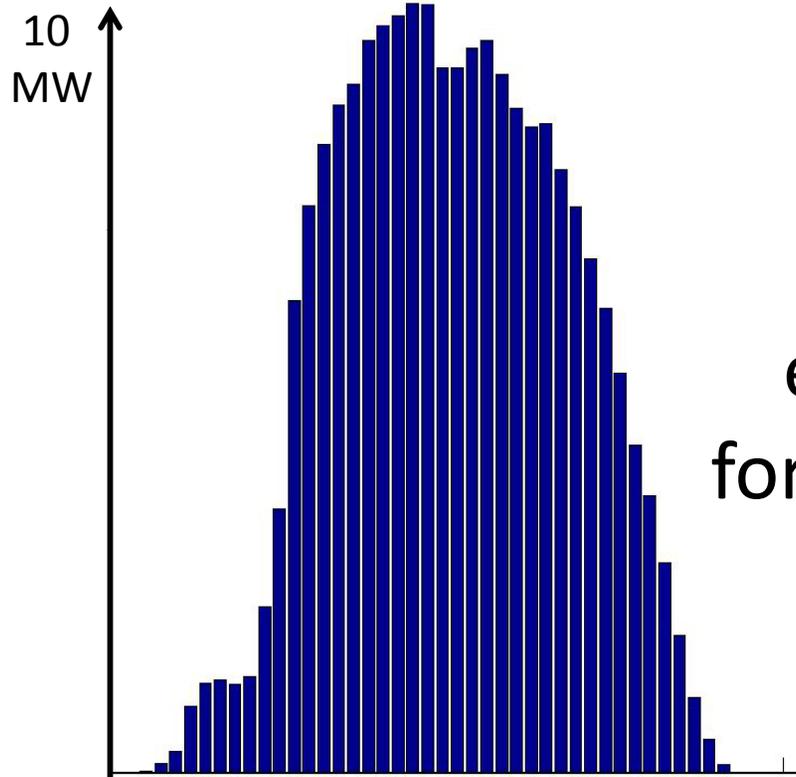
# PV Systems in San Diego County and UC San Diego: Testbed for Solar Variability



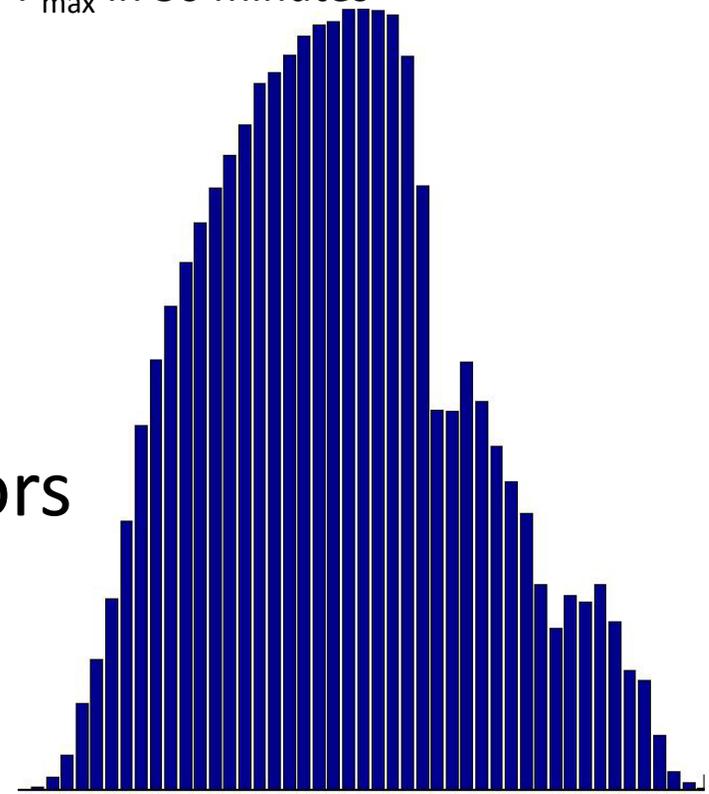
# What are the largest aggregate ramps for 15 MW PV in SDG&E territory?

November 29, 2009: largest up-ramp  
60% of  $P_{max}$  in 60 minutes

September 29, 2009: largest down-ramp  
43% of  $P_{max}$  in 30 minutes



Currently  
evaluating  
forecast errors

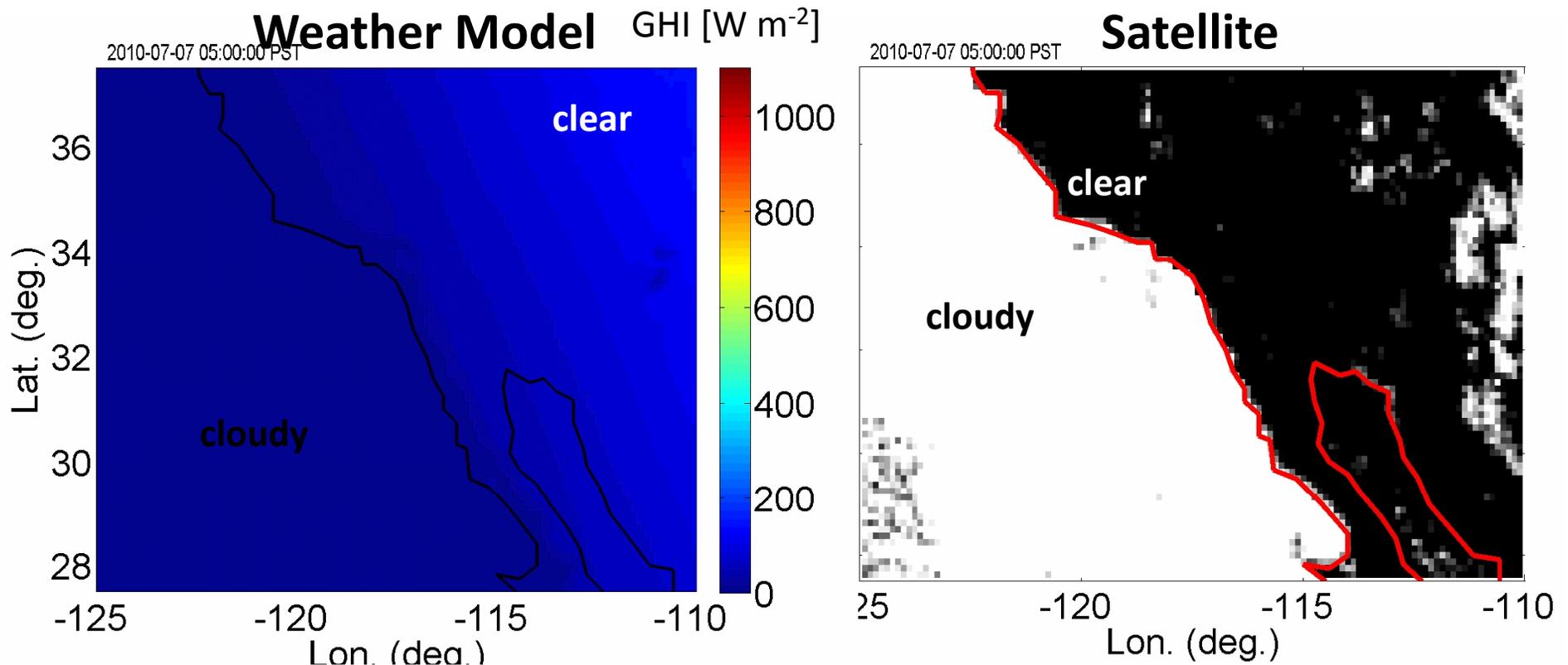


Research questions:

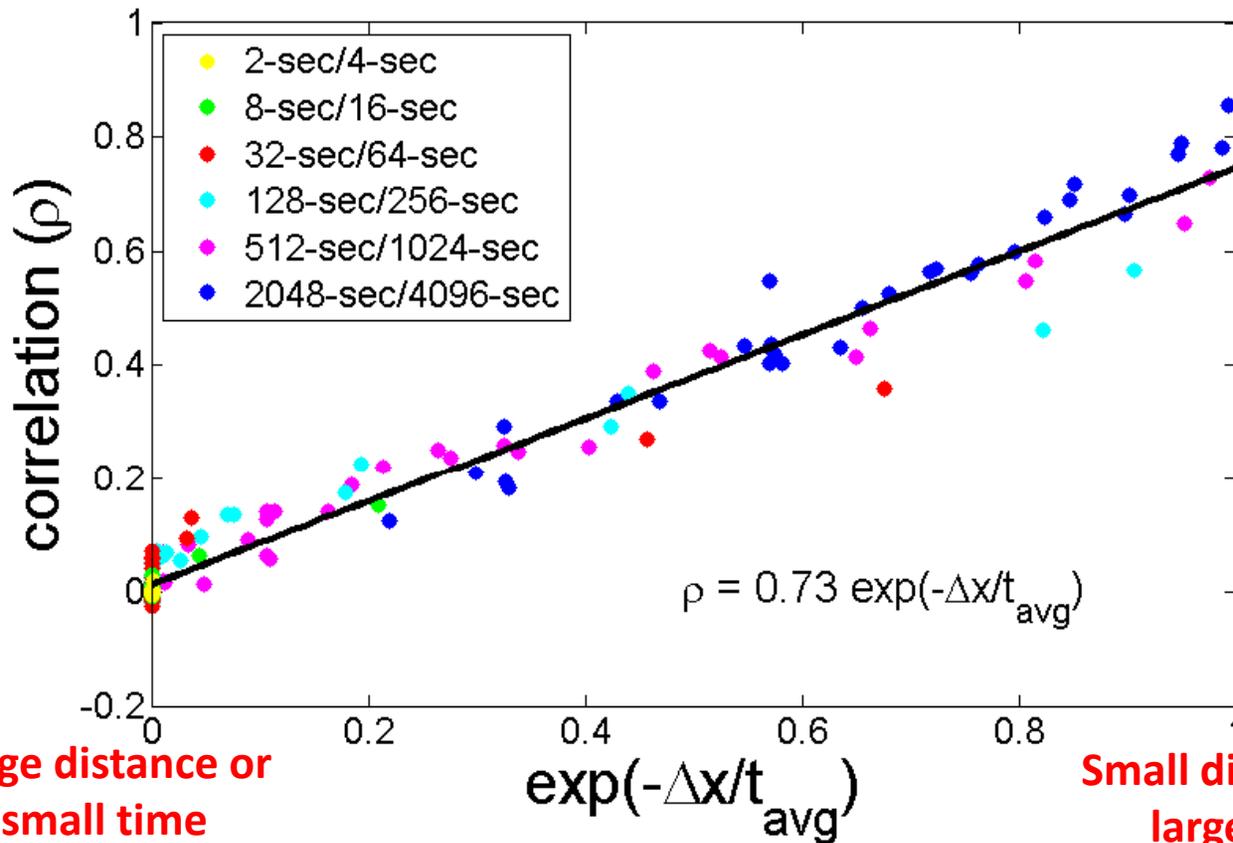
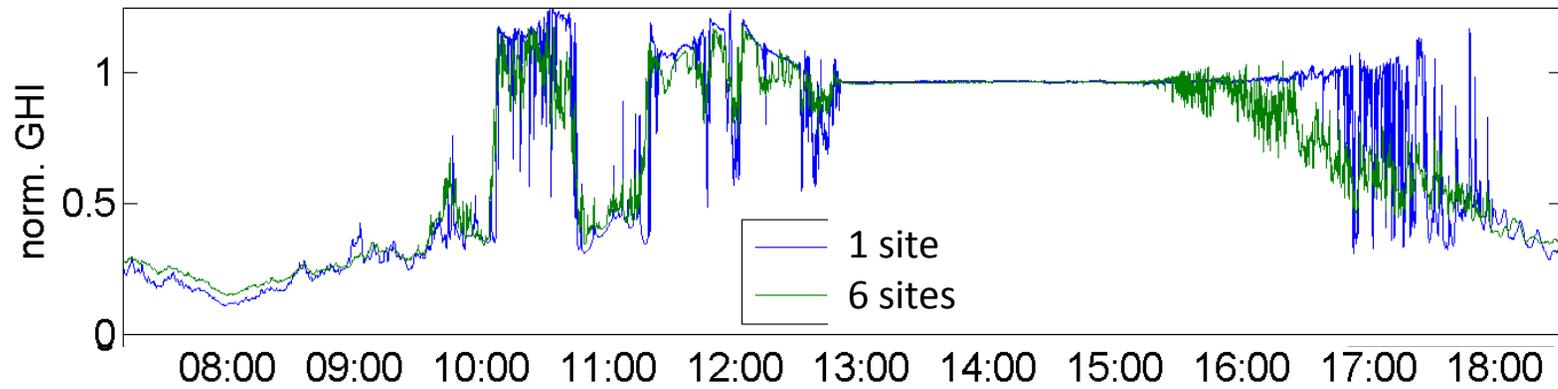
Are largest ramps predictable – day ahead, hour ahead? Under what conditions are ramps more likely?

# Forecast errors for large ramps

- Small spatial error (10 to 100 miles), but big impact (80% of CA DG)
- Reducing error would require very high resolution numerical simulations
- Research on statistical corrections



# Quantifying benefits of Geographic Smoothing



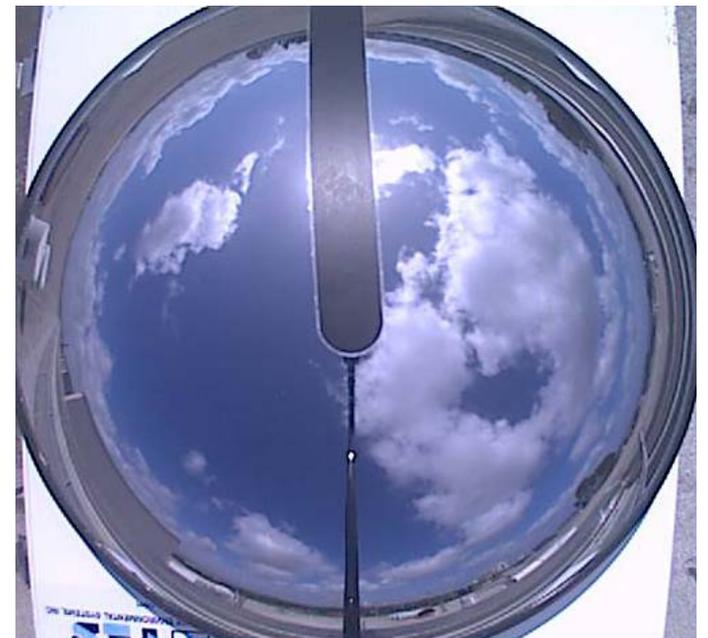
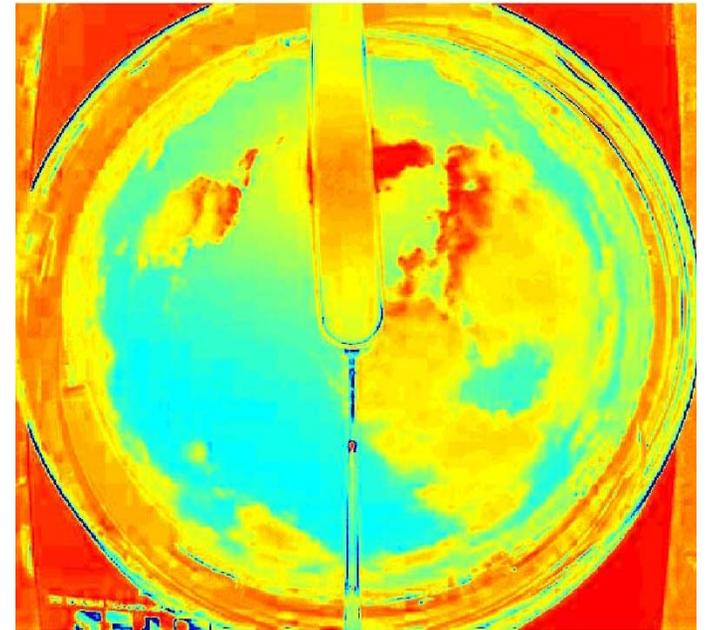
Universal relationship of correlation between sites versus distance divided by time  
→ Apply to simulate geographic smoothing

Large distance or small time

Small distance or large time



# Highlighted R&D: Intra-hour Solar Forecasting with a Total Sky Imager



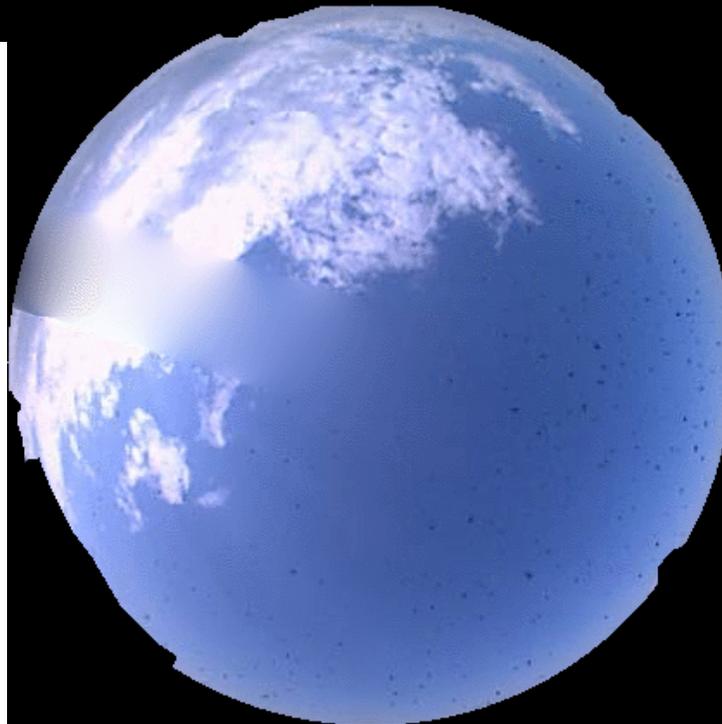
# Cloud Types



Cirrus



Cumulus



Altocumulus

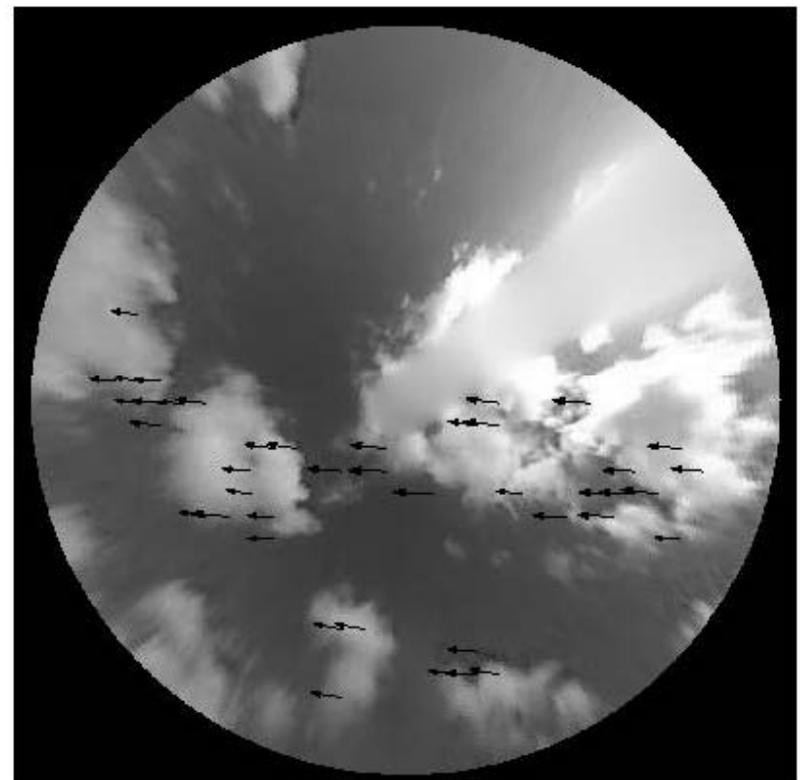
# Cloud Motion Vectors

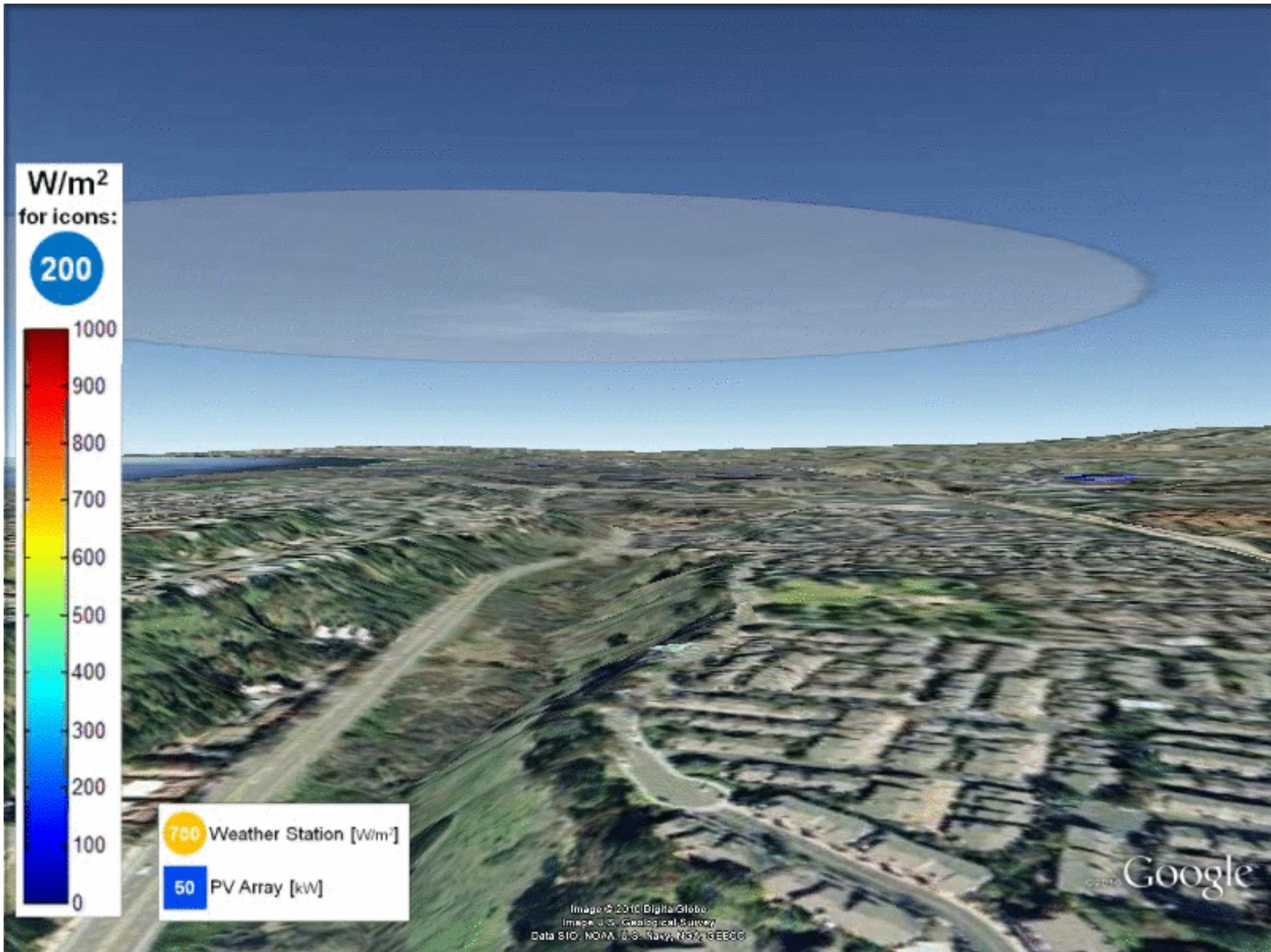
- Apply cross-correlation method to coordinate-transformed sky image.
- Retain only vectors for which high correlation is obtained
- Assume homogeneous cloud velocity

2009-10-04 16:26:30.000



U: -5.8532m/s V: 0.54762m/s

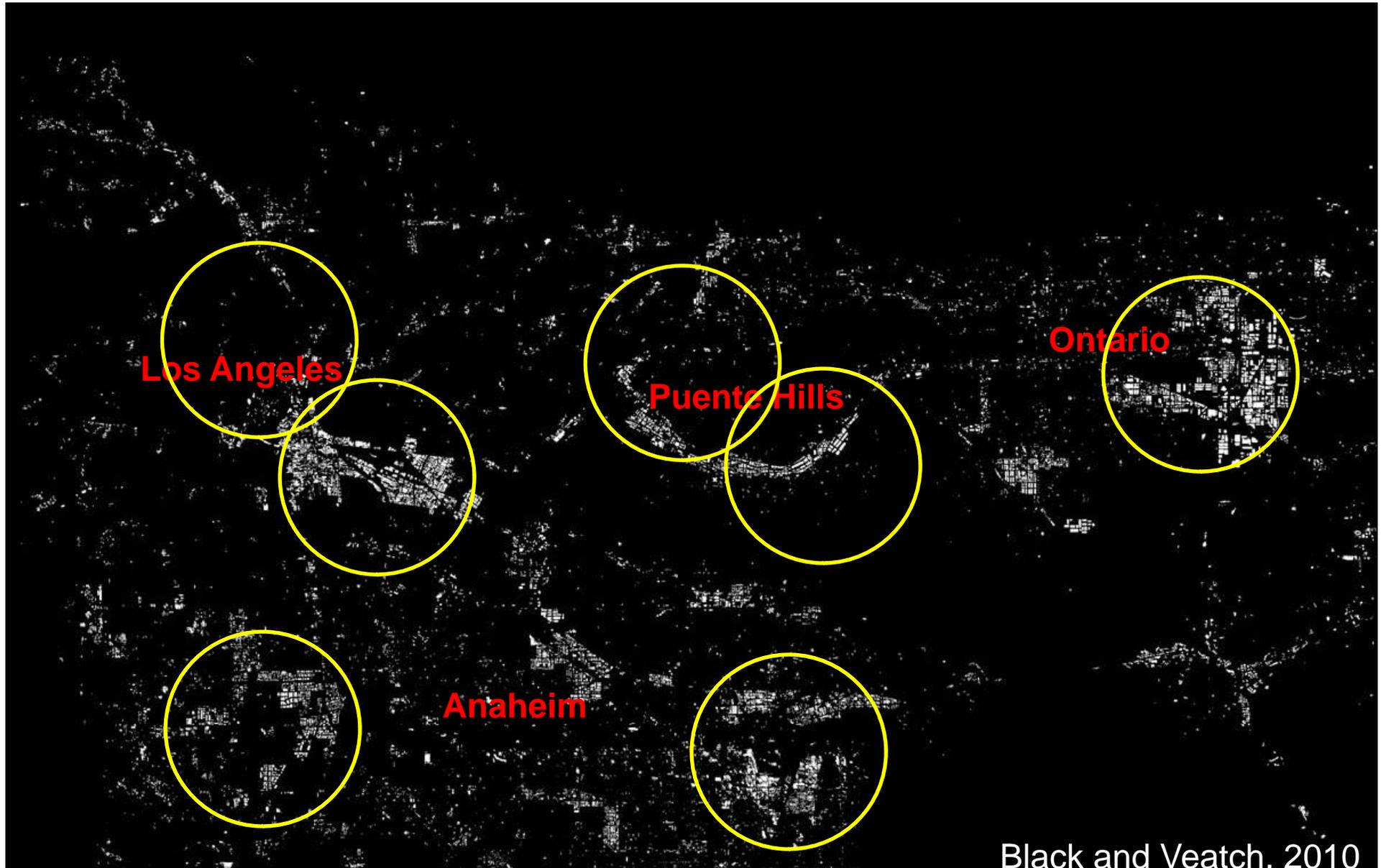




# Forecast Results

- Error increases with forecast horizon, but still 25% better than persistence after 5 minutes.
- After 10 to 25 minutes the scene is advected out of the field of view
  - Sky Imager provides situational awareness to CAISO over this timescale
- If we can achieve the forecasting breakthroughs, 7 sky trackers would provide intra-hour forecasts for the majority of the LA/OC market
- Demonstration studies with Sempra Energy at 48 MW PV and SCE for rooftop PV

# Los Angeles Warehouse Roof Market



Black and Veatch, 2010

# RD&D direction, focus, strategies or initiatives to advance DG, RPS and AB32

- Day ahead Solar Forecasting (Numerical Weather Prediction, NWP)
  - Evaluate forecast performance for California-specific meteorological events (winter frontal system, marine layer clouds, Tule fog)
  - Conduct high resolution rapid refresh simulations to improve cloud resolution
  - Conduct data assimilation of ground or satellite data into NWP

# RD&D direction, focus, strategies or initiatives to advance DG, RPS and AB32

- Intra-day Solar Forecasting (Satellite)
  - Evaluate forecast from satellite imagery
  - Construct radiative transfer models to model cloud effects (especially for concentrating solar power)
- Intra-hour Solar Forecasting (Sky Imager)
  - Responsive to FERC NOPR
  - Integration with satellite imagery
  - 3d radiative transfer models
- Lab to market: Collaborating with industry (CAISO, Enernex, AWS Truepower, Garrad Hassan, Clean Power Research) and Byron Washom in PIER funded research to bring forecasting technologies to market

# Integrating Solar Forecasting with the Smart Grid Solar Stakeholders

- Transformer, inverters, energy storage and PV manufacturers
- Distribution system operators, designers, and control software developers for mitigating variability
- CAISO for centralized solar, microgrids, virtual power plants and DG and the private sector stakeholders in these markets
- Tech transfer to regulators and professional standards for allowable limits of penetration
- A great start with the [DOE-CPUC workshop](#) site hosted by UCSD March 2011

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- \$0.5M from CEC for Forecast Model Integration (on 5/18/11 Business Calendar)