

# Advanced Modeling and Verification for High Penetration PV: Final Report



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Tom Hoff  
President, Research and Consulting  
April 10, 2012



# Acknowledgements



- Funding for this work has been provided by the California Solar Initiative (CSI) Grant Agreement titled “Advanced Modeling and Verification for High Penetration PV”
- Special thanks to Smita Gupta, Project Manager

Funding Approver	California Public Utilities Commission
Funding Distributor	California IOUs
Program Manager	Itron



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**Itron**

# Project Participants

## Companies, Agencies & Organizations

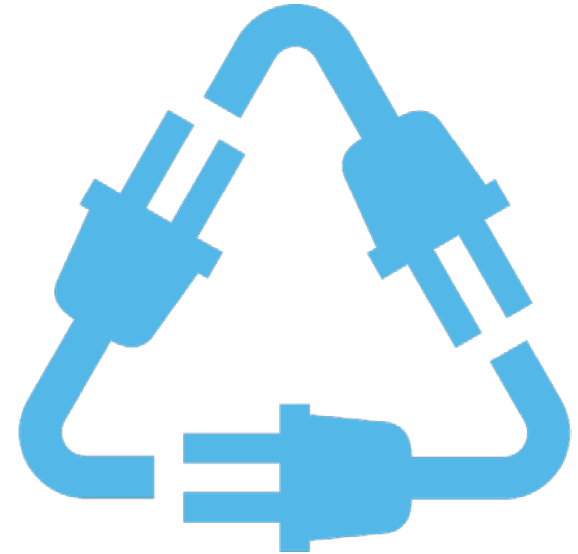


## Utilities



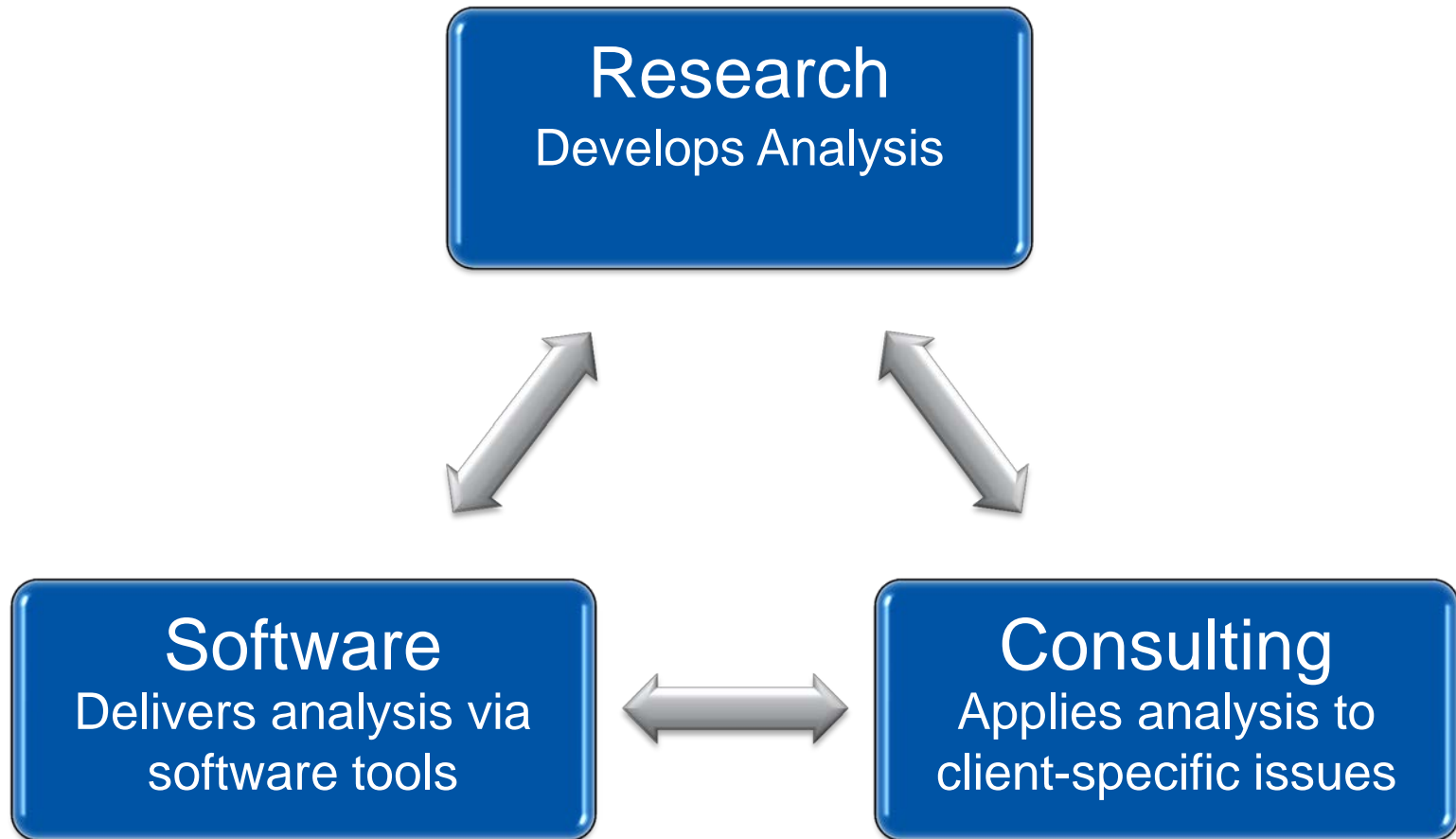
# Clean Power Research

- Founded by Dr. Thomas E. Hoff in 1998
- Pioneers in economic analysis of PV and clean energy
- Software services powered by research and industry-leading data
- Research and consulting in Napa, CA  
Software development in Kirkland, WA



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# Company Structure



## CLEAN POWER RESEARCH PRODUCTS & SERVICES

### DATA SOURCES

SolarAnywhere®

PowerTariffs™

Incentives

TMY (NREL)

### SOLAR PREDICTION

Forecast, real-time and historical time-series irradiance data and power simulation for planning, developing and operating solar installations

SolarAnywhere®

### ECONOMIC VALUATION

Embeddable energy, economic and environmental analysis for streamlining sales of renewable energy, EV and energy efficiency projects.

CleanPower Estimator®

QuickQuotes™

PowerBill®

### PROGRAM OPTIMIZATION

Automated incentive management and optimization services for renewable energy programs

PowerClerk®

### RESEARCH AND CONSULTING



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# Project Overview

## Planned Tasks

- Enhance spatial and temporal resolution of SolarAnywhere® for ***selected*** CA locations
- Enhance PVSimulator to include ***output variability*** and validate
- Integrate PV modeling capabilities into a distribution system engineering and analysis tool
- Create ***initial Excel tool*** to calculate economic value of a specific PV fleet configuration

## Actual Accomplishments

- Enhanced spatial and temporal resolution of SolarAnywhere® for ***the entire state*** of CA
- Developed, validated, and patented approach to simulate ***both output variability and output***
- Developed web services to integrate PV modeling capabilities into distribution system tools
- Created ***full web-based*** tool to calculate economic value of a specific PV fleet configuration



# Task 1

Enhanced Spatial and Temporal  
Resolution of SolarAnywhere for the  
Entire State of CA



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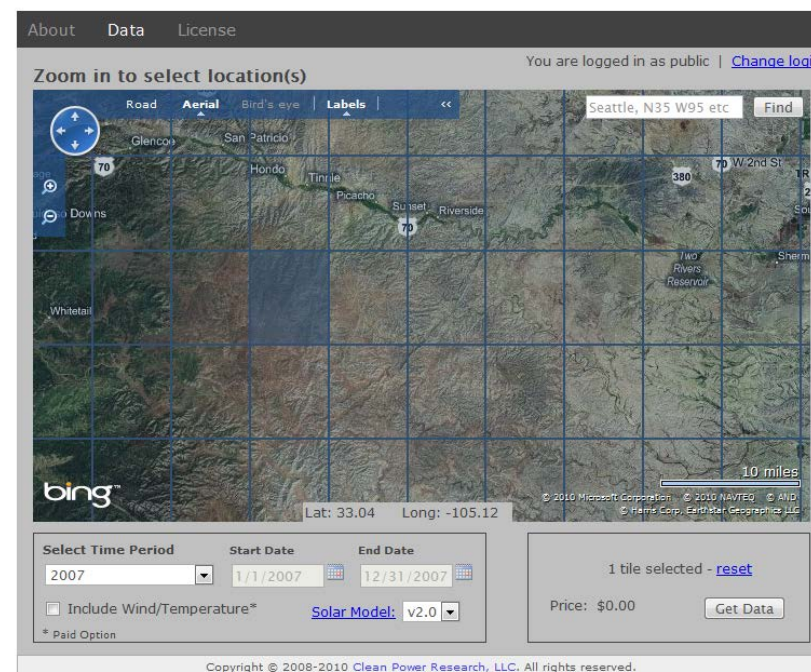


# What is SolarAnywhere?

## Web-accessible solar irradiance data service

- Innovative
  - Historical values from 1998 through latest hour
  - Hour-by-hour forecasts up to a week in advance
- Accessible
  - Select locations via web-based map
  - Programmatically accessible web service
  - Integrate with system operation tools

**SOLAR***anywhere*<sup>®</sup>



Clean Power Research<sup>®</sup>

# Convert Satellite Images to Irradiance



8 AM

12 PM

4 PM



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# SolarAnywhere Enhanced Resolution

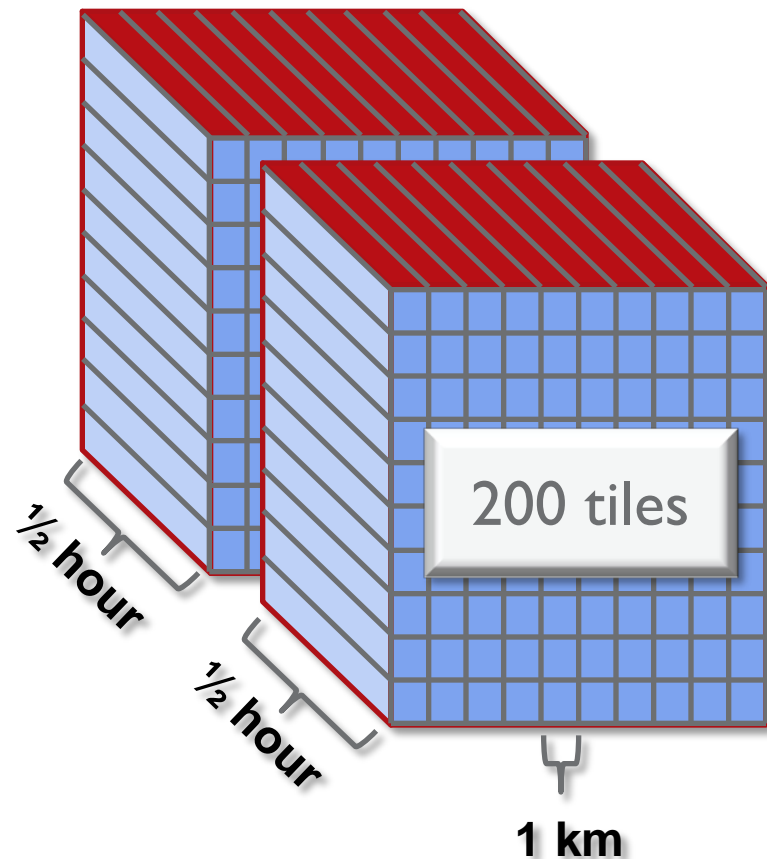
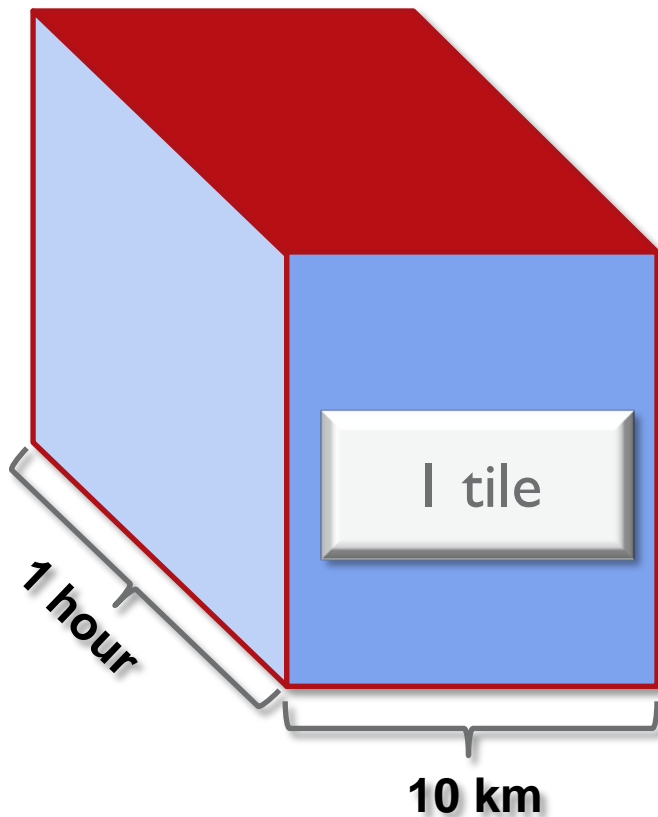
**SOLAR***anywhere*  
STANDARD RESOLUTION



**SOLAR***anywhere*  
ENHANCED RESOLUTION

10 km grid, 1 hour data

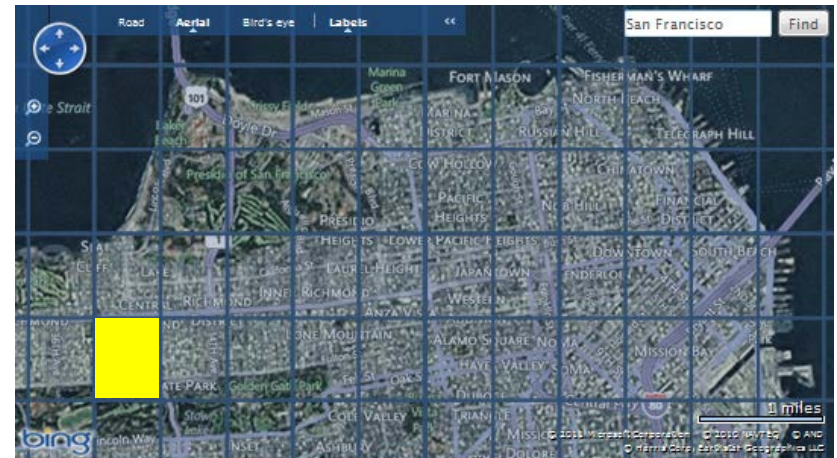
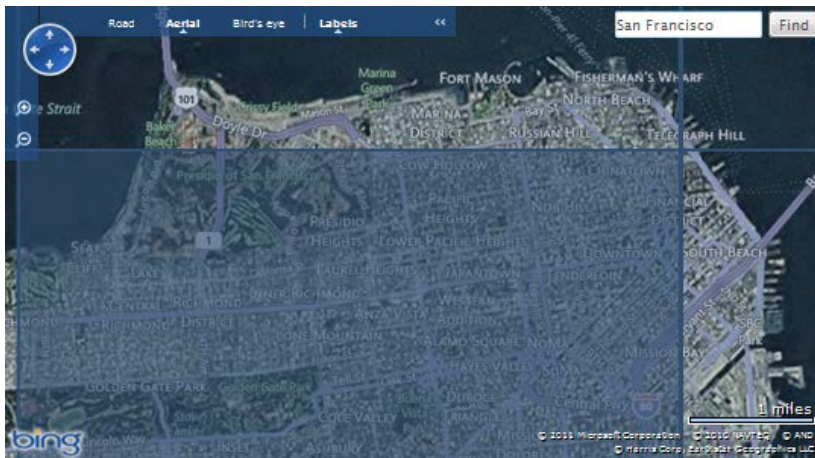
1 km grid, 1/2 hour data



# Example: San Francisco, CA

**SOLAR**anywhere<sup>®</sup>  
STANDARD RESOLUTION

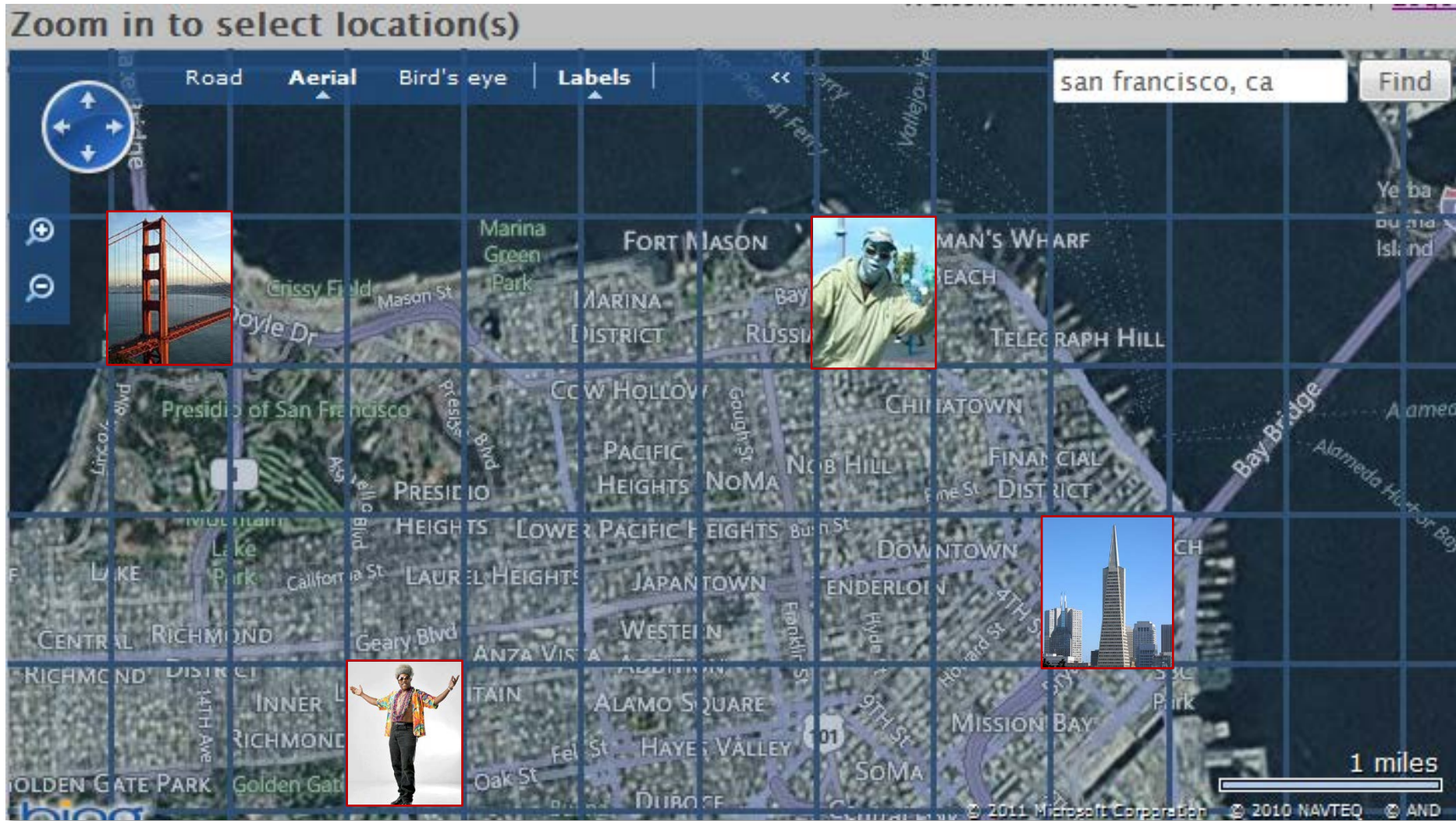
**SOLAR**anywhere<sup>®</sup>  
ENHANCED RESOLUTION



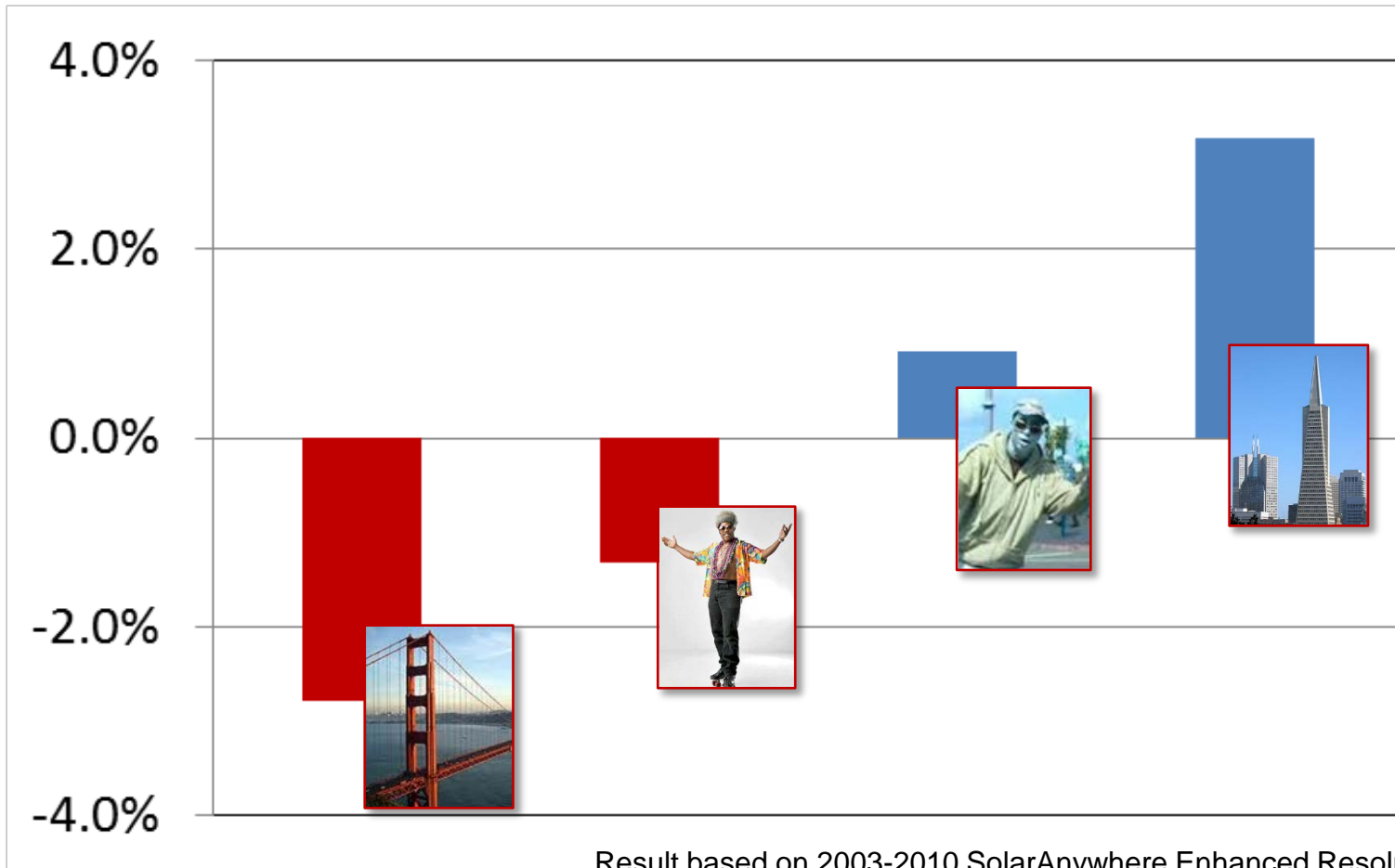
Clean Power Research<sup>®</sup>



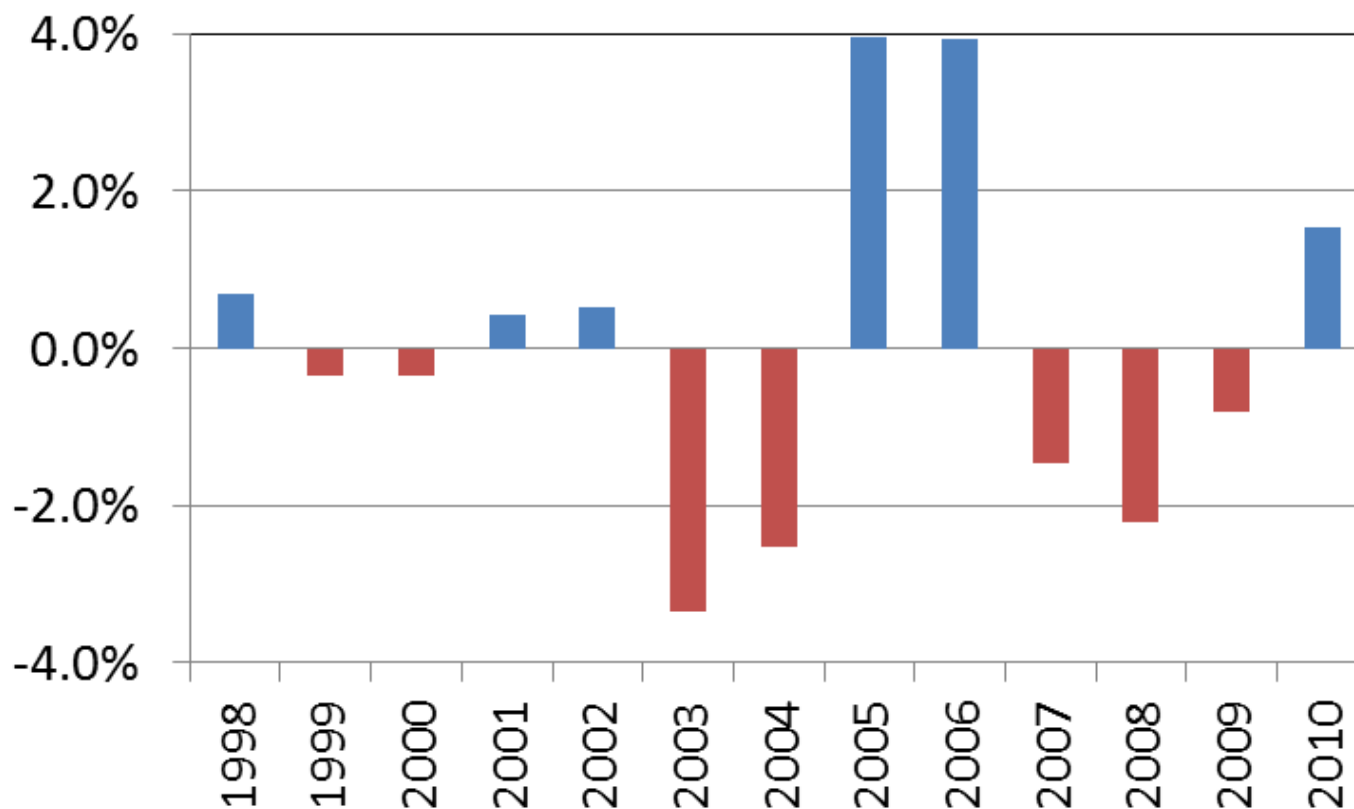
# Example: San Francisco, CA



# Annual Variation by Location



# Variability by Year



Result based on 2003-2010 SolarAnywhere Enhanced Resolution and 1998 – 2002 SolarAnywhere Standard Resolution data



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# SolarAnywhere Status

- Standard resolution (10 km grid, 1 hour resolution) data from 1998 through 7 day forecast anywhere in U.S.
- Enhanced resolution (1 km grid, ½ hour resolution) data from 2003 through 7 day forecast anywhere in California
- Provide data to perform high penetration renewables studies (e.g., CAISO high penetration study) and multiple validation studies (UCSD)

[www.SolarAnywhere.com](http://www.SolarAnywhere.com)



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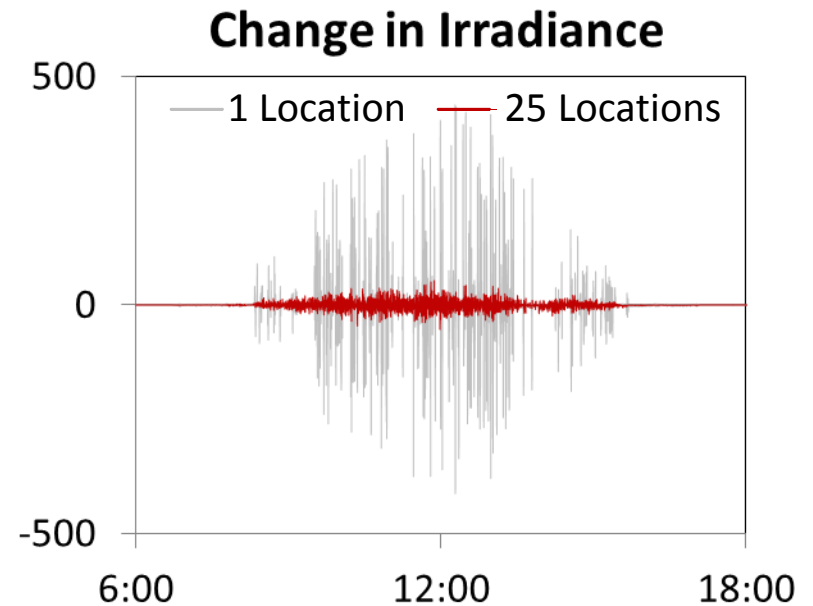
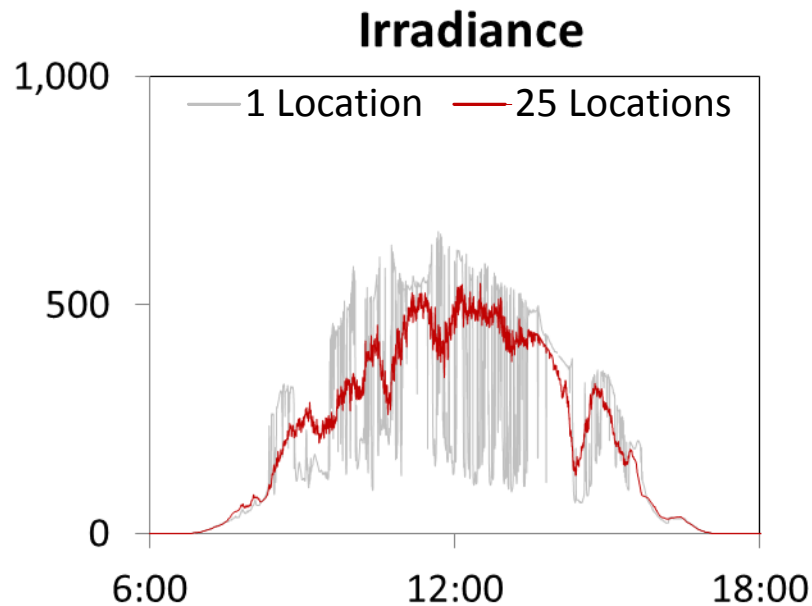
## Task 2

Developed, Validated, and Patented  
Approach to Simulate Both Output  
Variability and Output



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# What is Output Variability?



# PV's Intermittency Challenges

- Who will face the challenges of PV intermittency?
  - Independent system operators
  - Load serving entity schedulers
  - Distribution system planners
  - Distribution system operators
- What do they need to address the challenges?
  - Aggregated fleet power and variability  
(real-time and forecasted)



# Independent System Operators

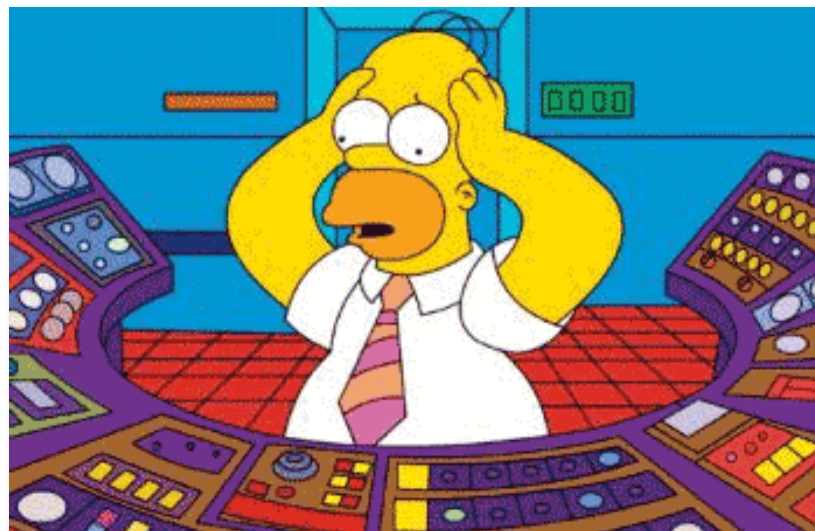
Power Output Over One Day  
Single Small PV Plant



- Maintain balancing area reliability
- Plan for resources to accommodate PV
- Procure capacity and ramping resources based on ***PV fleet forecasts***

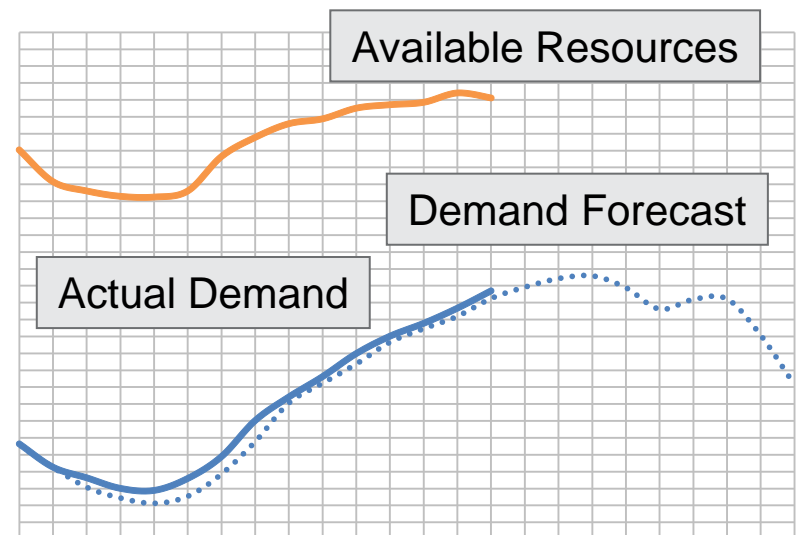
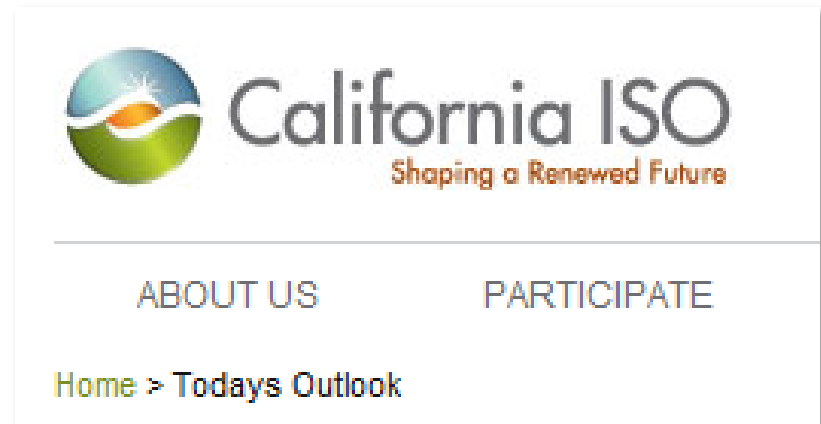
If this is  
1 PV plant ....

what will I do  
with 100,000?



# Load Serving Entities

- Submit demand forecasts to system operator
- Distributed PV hampers ability to forecast demand
- Inaccurate forecasts result in financial penalties
- Need to adjust demand forecasts based on distributed ***PV fleet forecasts***



# Distribution System Planners

- Ensure customers receive reliable power
- Distributed PV complicates distribution planning
- Customers will complain if power is unreliable
- Planners need to understand ***PV fleet output*** on feeders to keep customers happy





# Distribution System Operators

- Storage will be deployed within smart grids
- Storage needs to be intelligently dispatched to maximize value
- Operators need ***PV fleet forecasts*** within distribution system to intelligently dispatch storage



A123 batteries in distribution system



# Perception: PV is Highly Variable and Unpredictable

How can high-penetration PV resources be integrated without incurring large backup generation and other equipment costs?

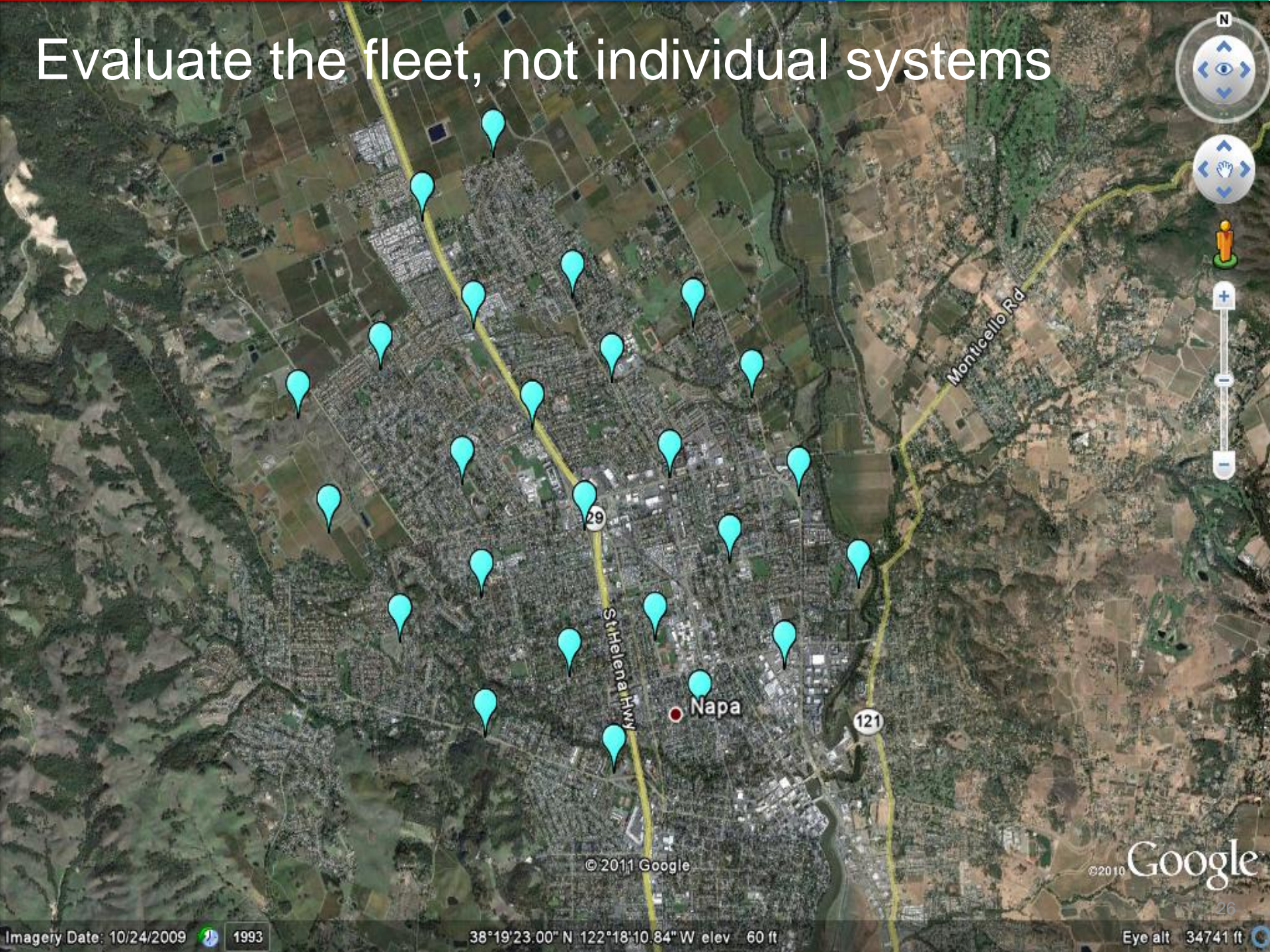


The story begins with assessing  
variability of an actual PV fleet...





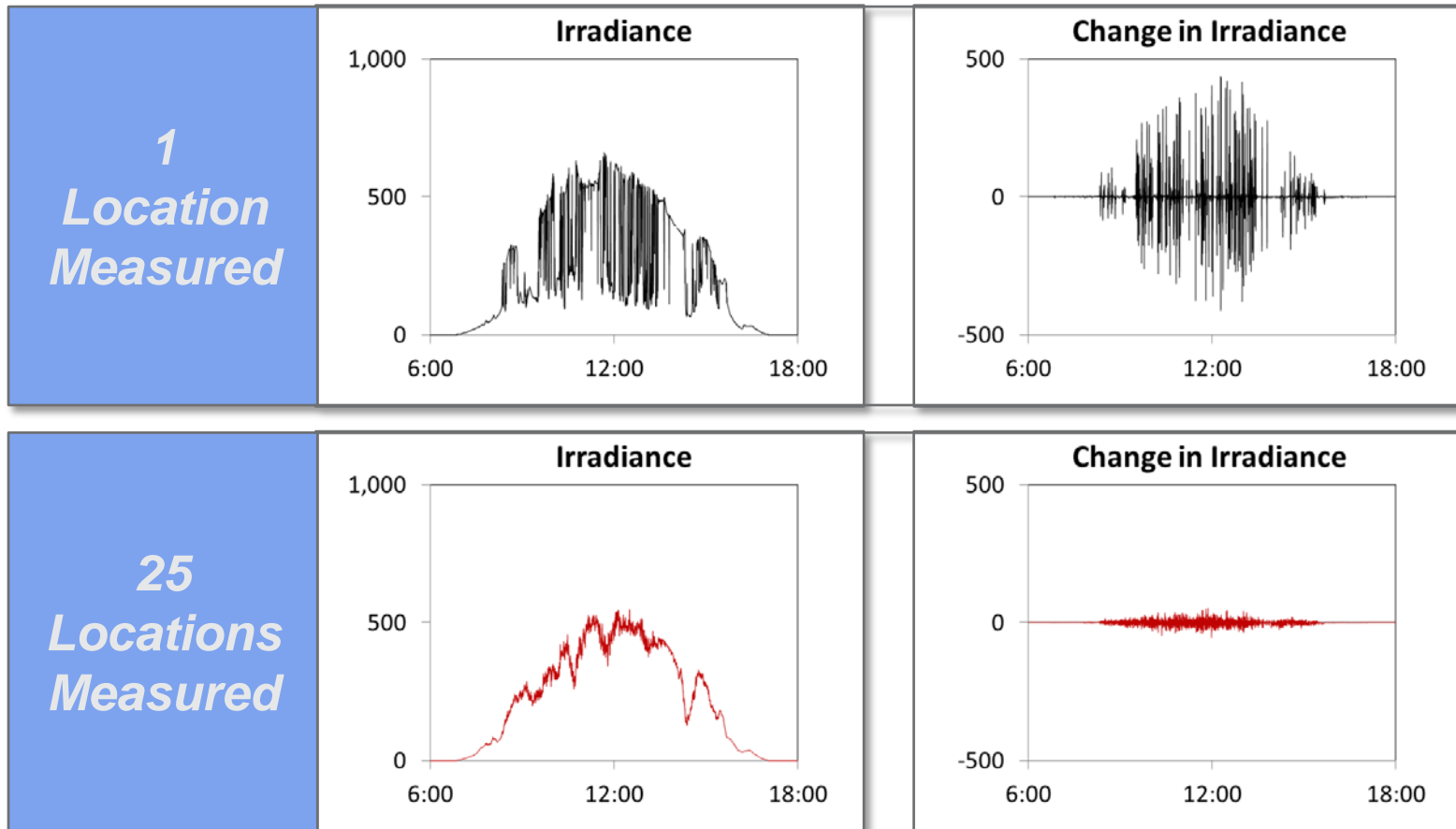
# Evaluate the fleet, not individual systems





# Geographic Diversity Leverages Weather System Inertia

10 second irradiance data from 4 x 4 km grid in Napa on Nov. 21, 2010

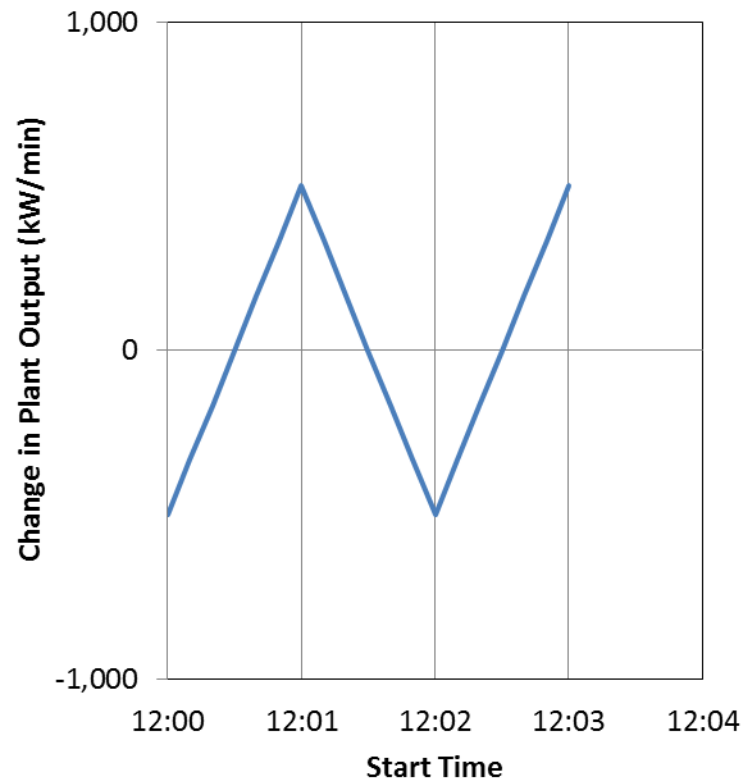
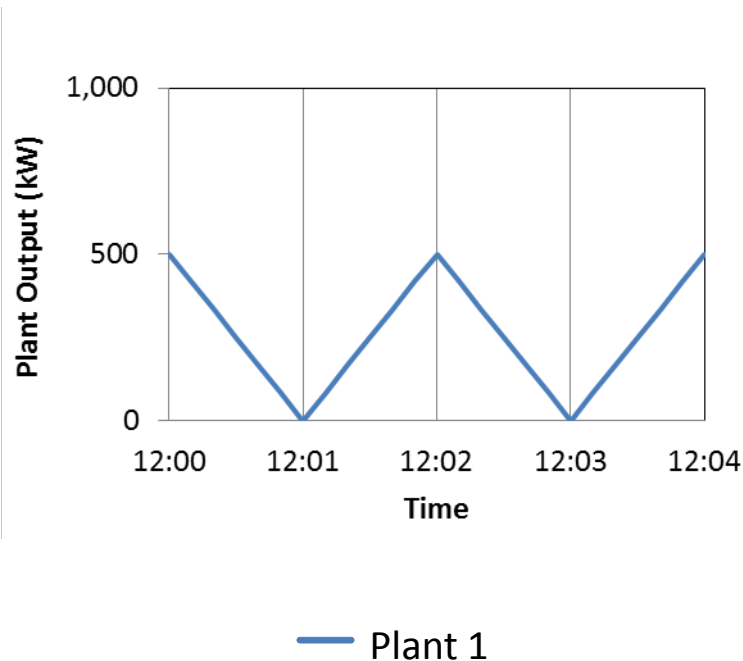


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# Variability Can Be Quantified Using Correlation Coefficients

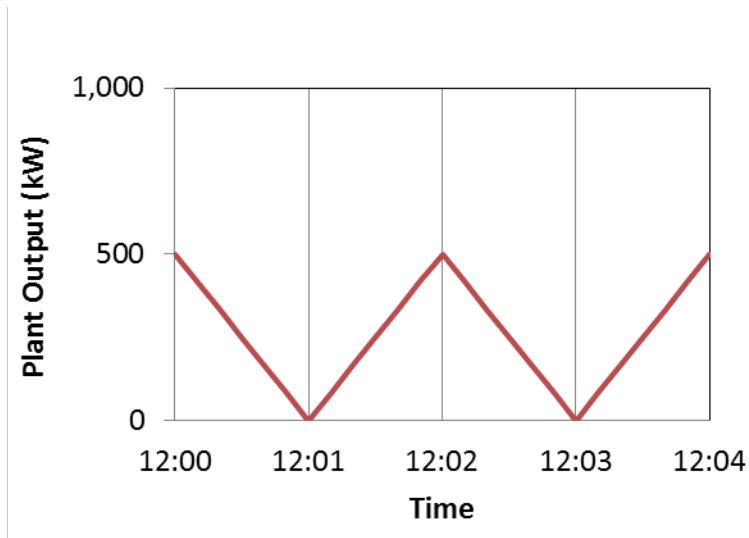


# Hypothetical Example of Two 500-kW Plants: Perfect Positive Correlation (100%)

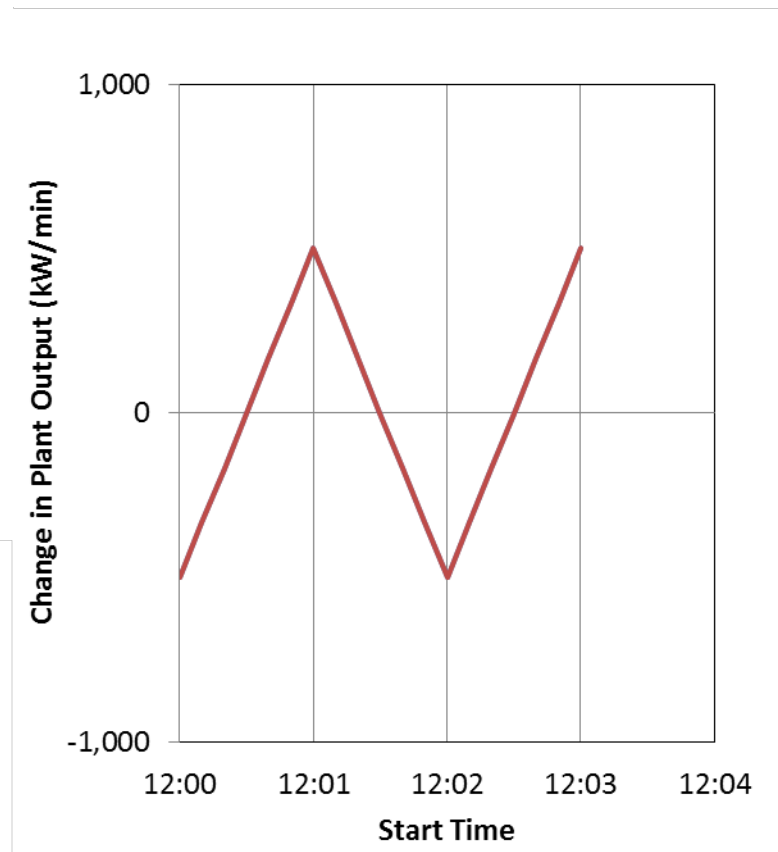




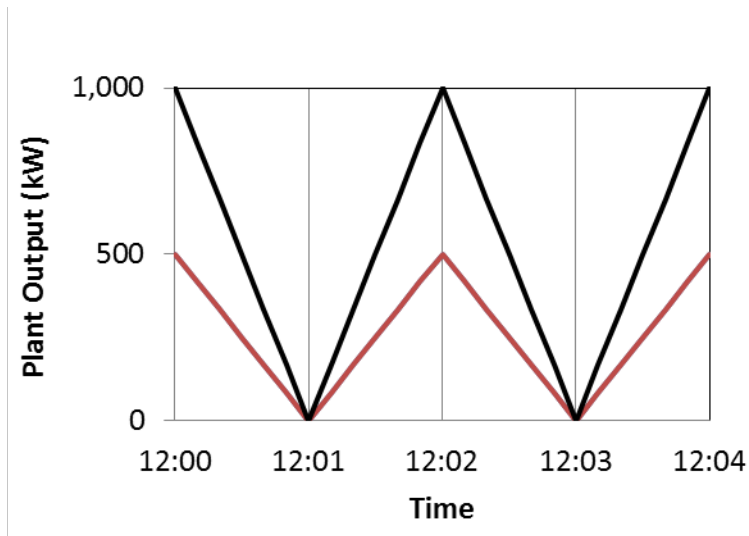
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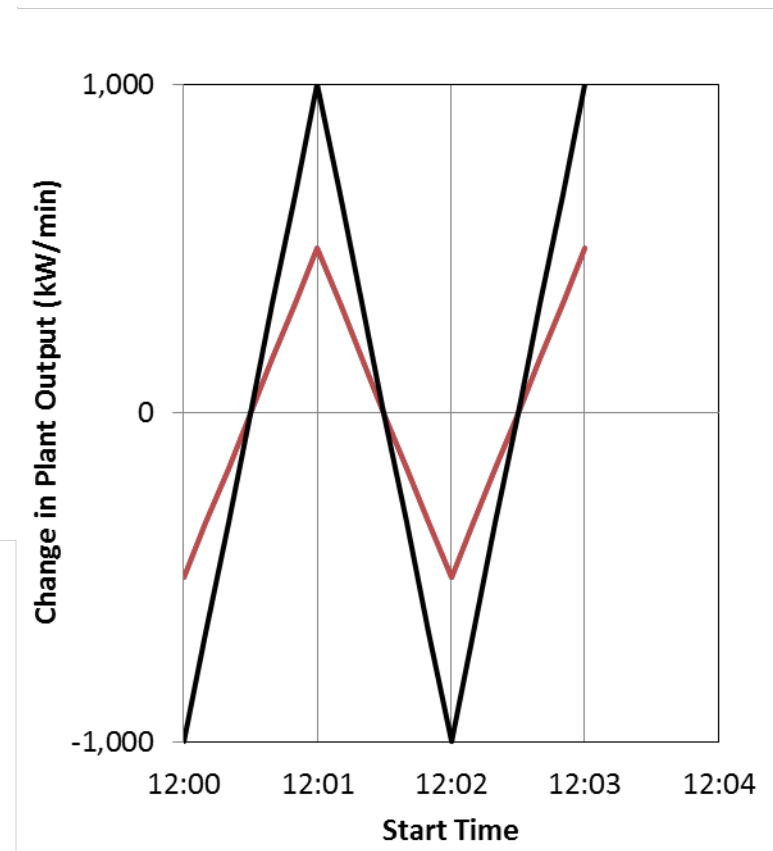
— Plant 1  
— Plant 2



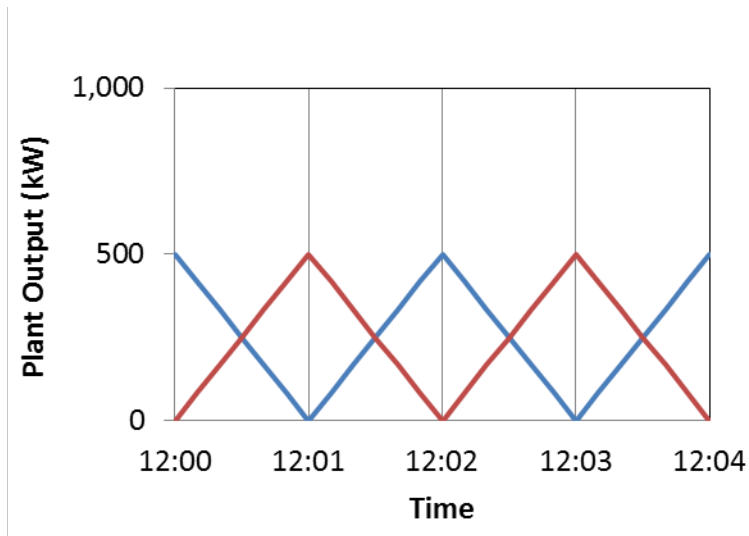
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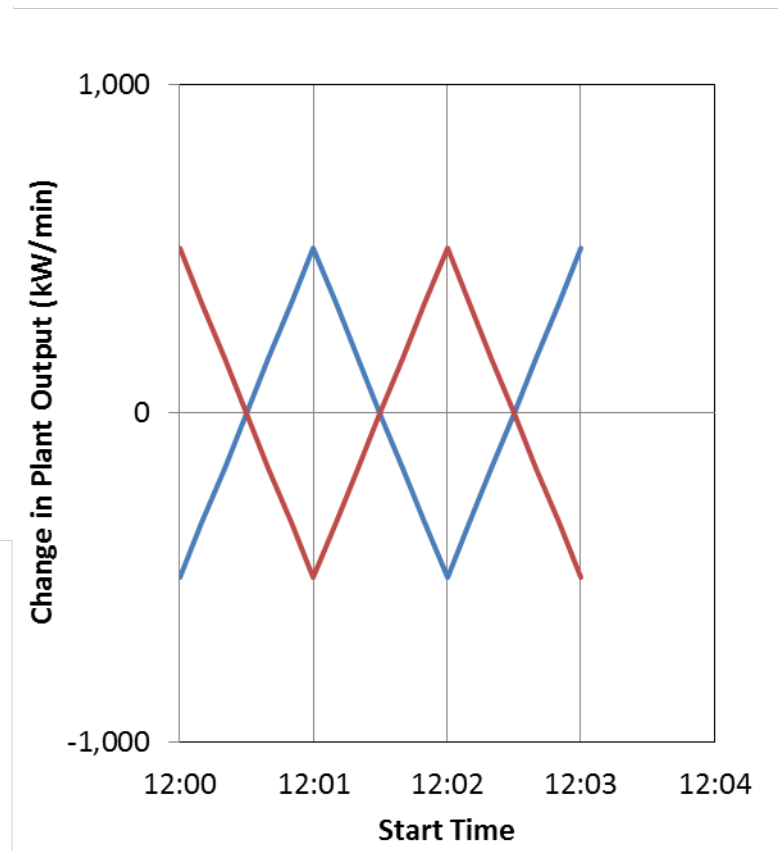
— Plant 1  
— Plant 2  
— Combined



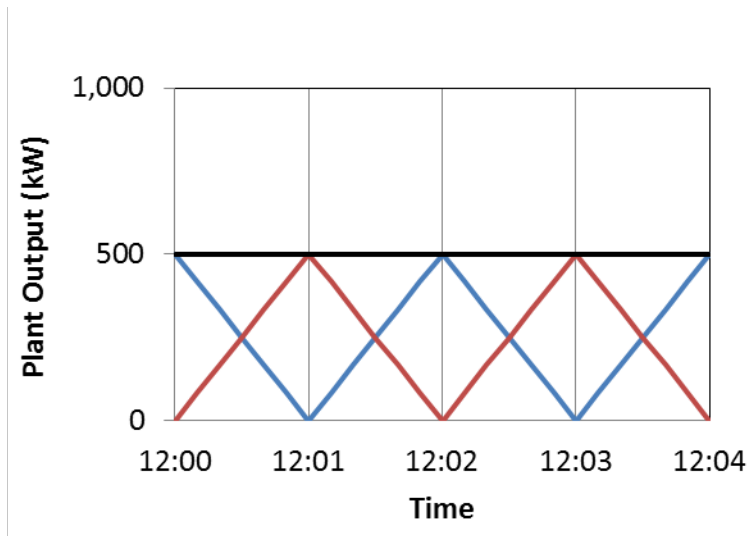
# Hypothetical Example of Two 500-kW Plants: Perfect Negative Correlation (-100%)



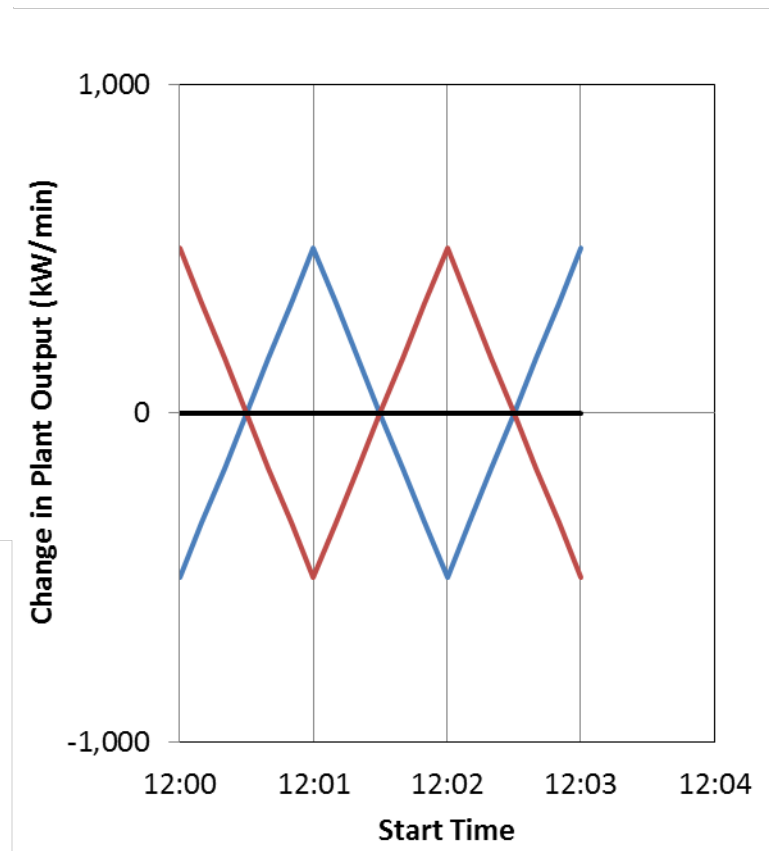
— Plant 1  
— Plant 2  
— Combined



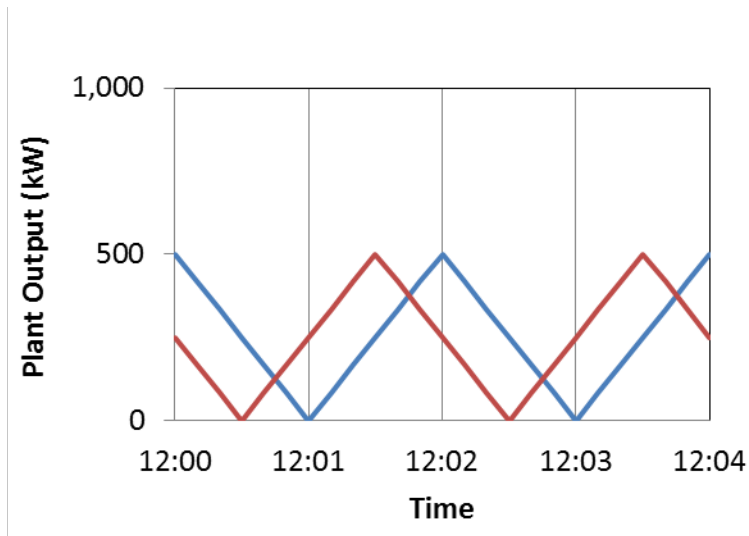
# Hypothetical Example of Two 500-kW Plants: Perfect Negative Correlation (-100%)



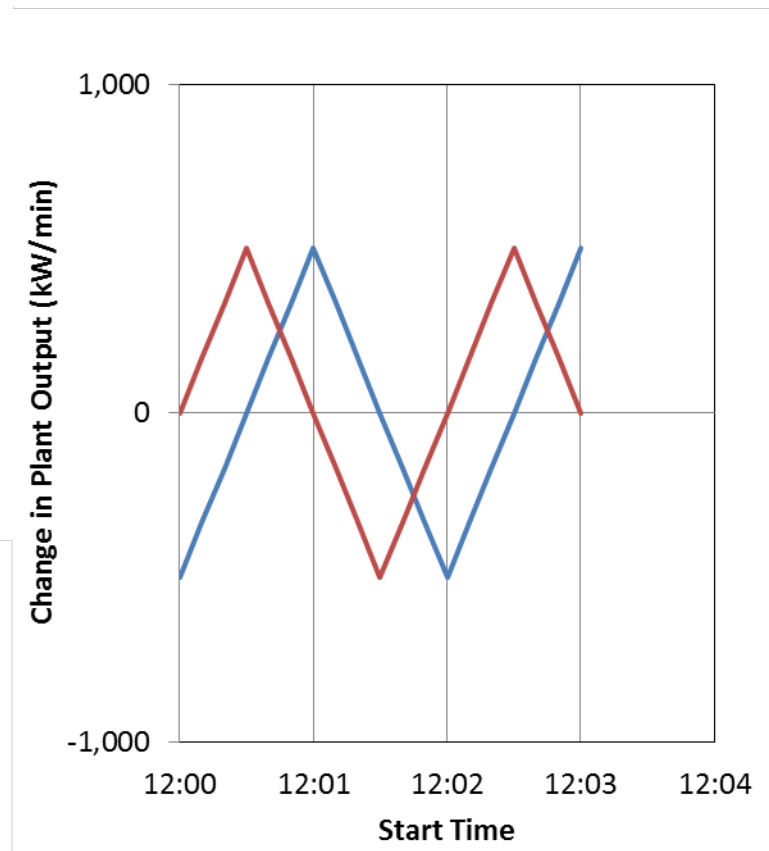
— Plant 1  
— Plant 2  
— Combined



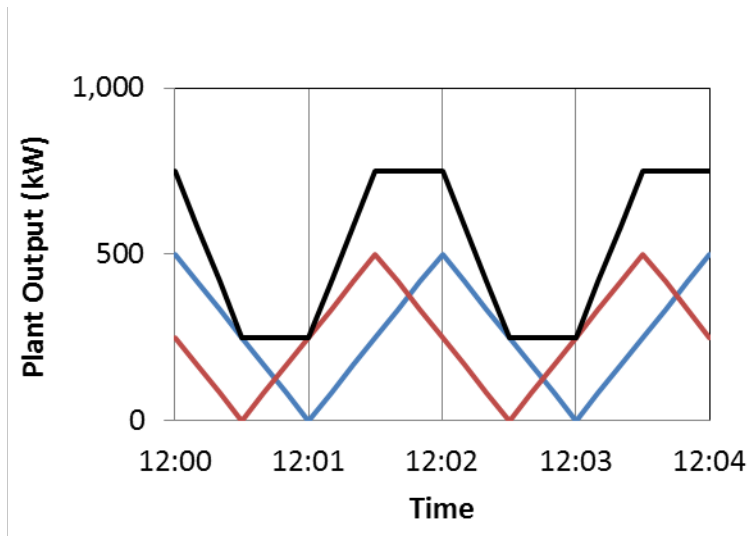
# Hypothetical Example of Two 500-kW Plants: Uncorrelated (0%)



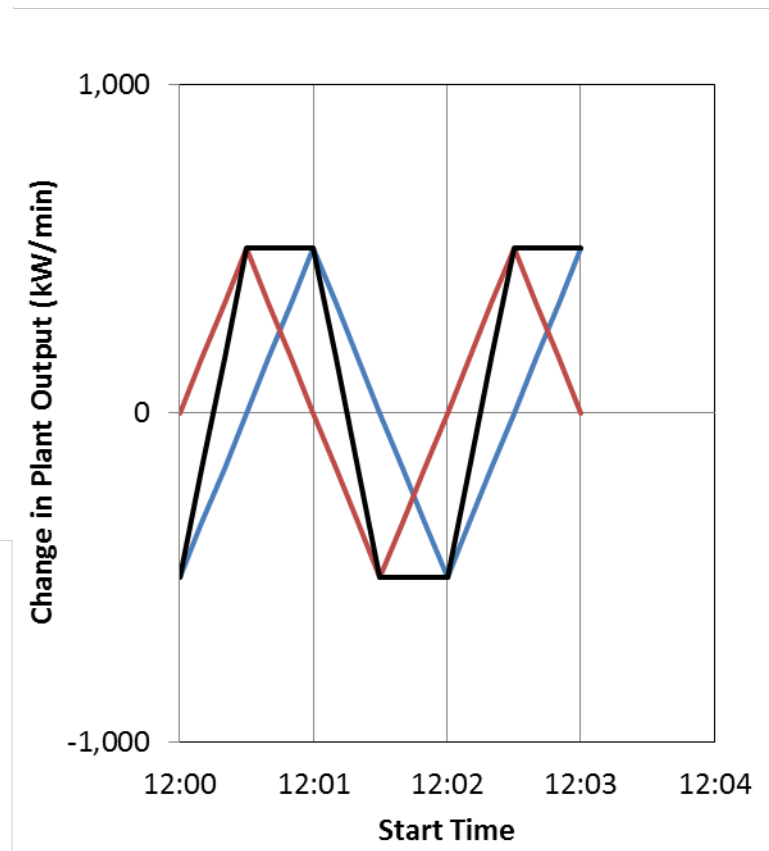
— Plant 1  
— Plant 2  
— Combined



# Hypothetical Example of Two 500-kW Plants: Uncorrelated (0%)

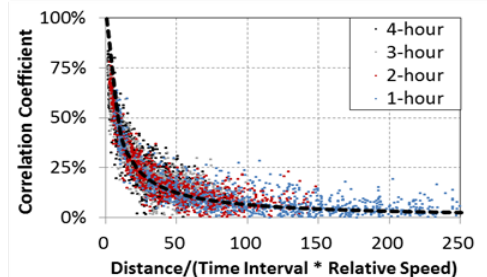
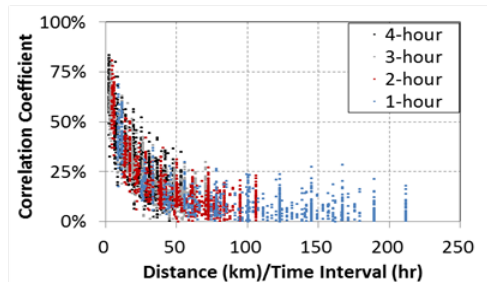
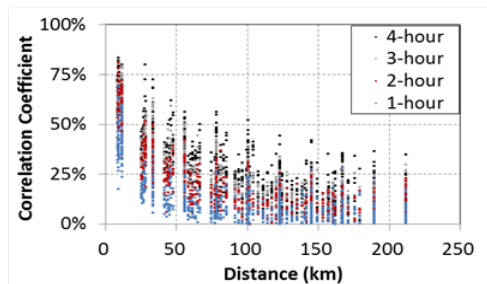


— Plant 1  
— Plant 2  
— Combined

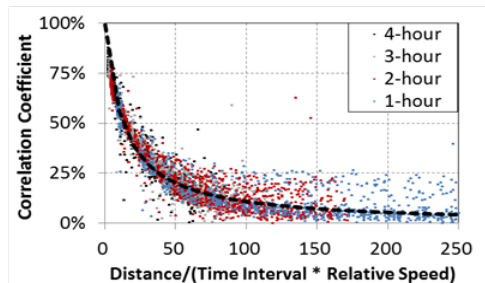
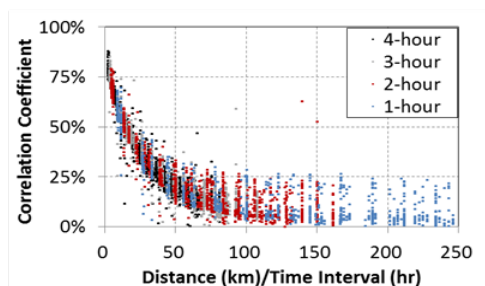
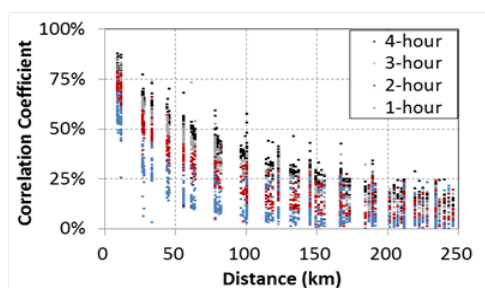


# Correlation in Change in Clearness

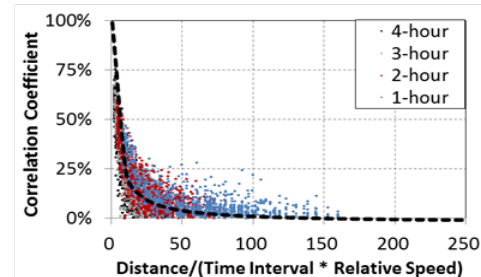
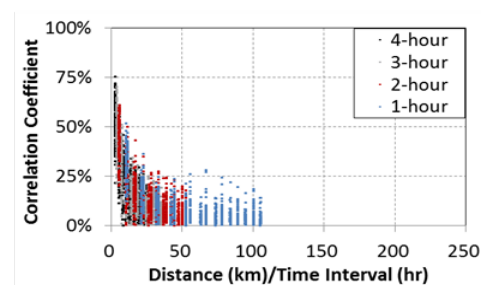
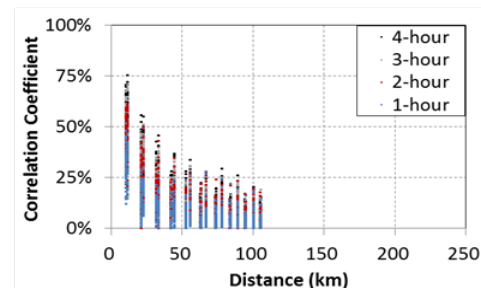
## Southwest



## Great Plains



## Hawaii



Note: Distance / (Time Interval \* Relative Speed) is related to Dispersion Factor

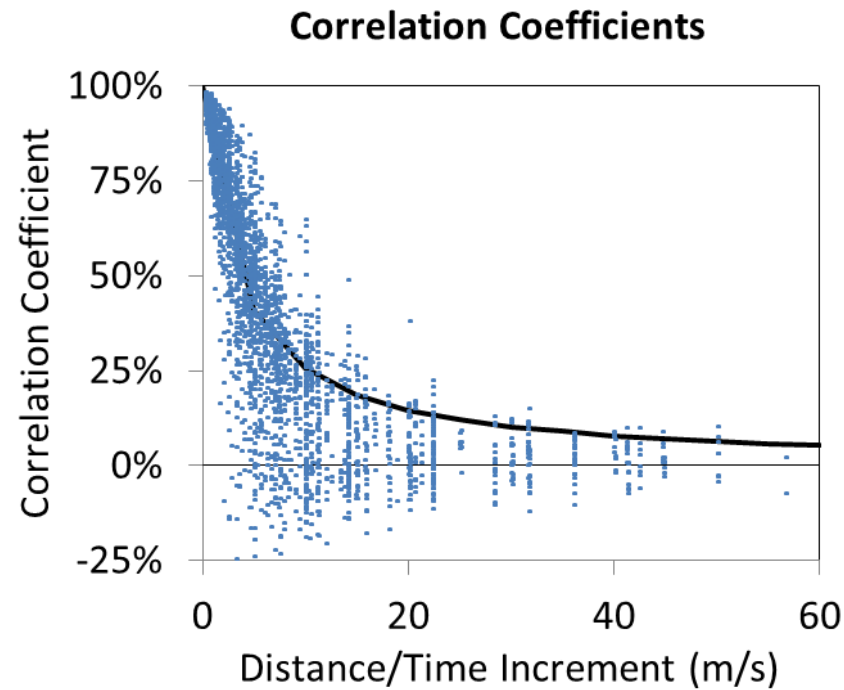


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100 km/1 hour = 28 m/sec



# Correlation at Cordelia Junction

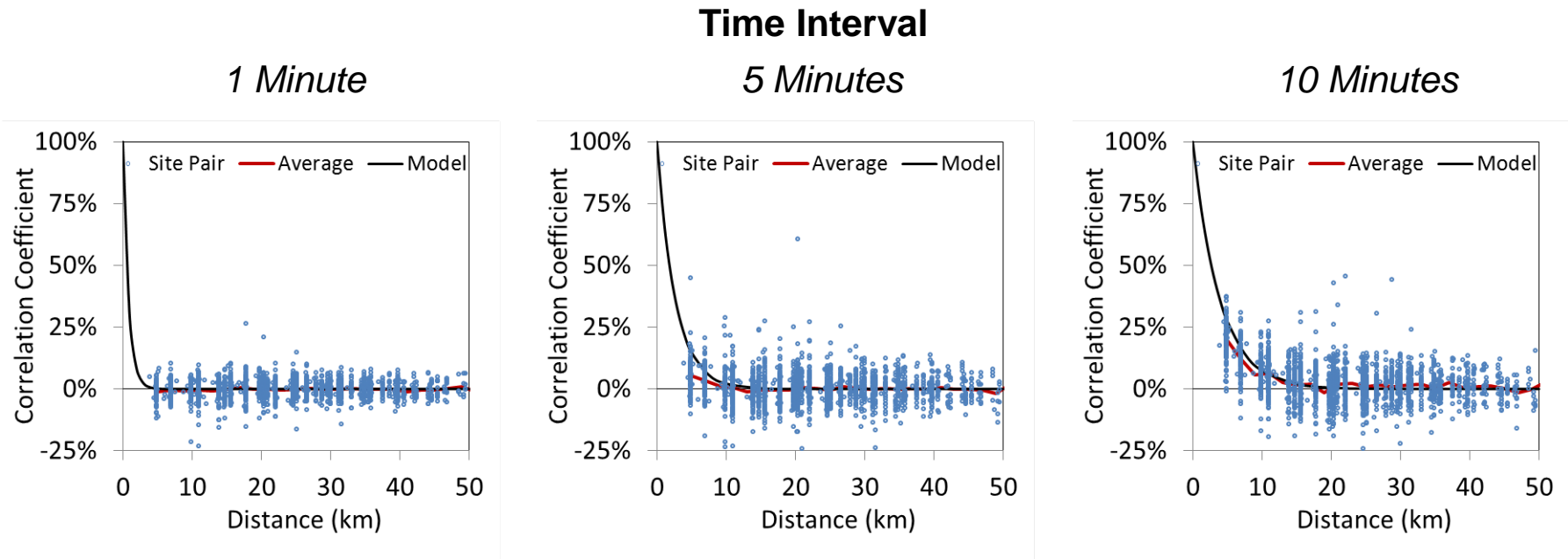


10 sec. data from 400m x 400m grid at Cordelia Junction, CA (Nov. 7, 2010)



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# CPR's Model Required to Simulate Variability Confirmed Using SMUD's Network of Irradiance Sensors



Bing, et. al., "Solar Monitoring, Forecasting, and Variability Assessment at SMUD," forthcoming at ASES 2012



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# Variability Can Be Minimal for a Large PV Fleet

- PV *fleet* variability is much lower than one would expect based on single *system* performance
- The physical inertia of rotating machines in the current utility system is what minimizes short-term variability
- The weather system inertia that is leveraged by the geographic diversity associated with a large fleet of PV systems is what will minimize short-term variability for PV



...the story continues with  
determining how to predict PV fleet  
power generation



# Direct Approach: Measure Everything

- For installed PV systems
  - Install meters on every PV system
  - Retrieve power output at the desired time interval
  - Sum output across all systems in the fleet
- When studying impacts of future systems
  - Collect irradiance data ...
    - ... from dense network of weather monitoring stations
    - ... covering all anticipated locations of interest
    - ... at the desired time interval
  - Simulate output for each PV system individually
  - Sum results for all systems



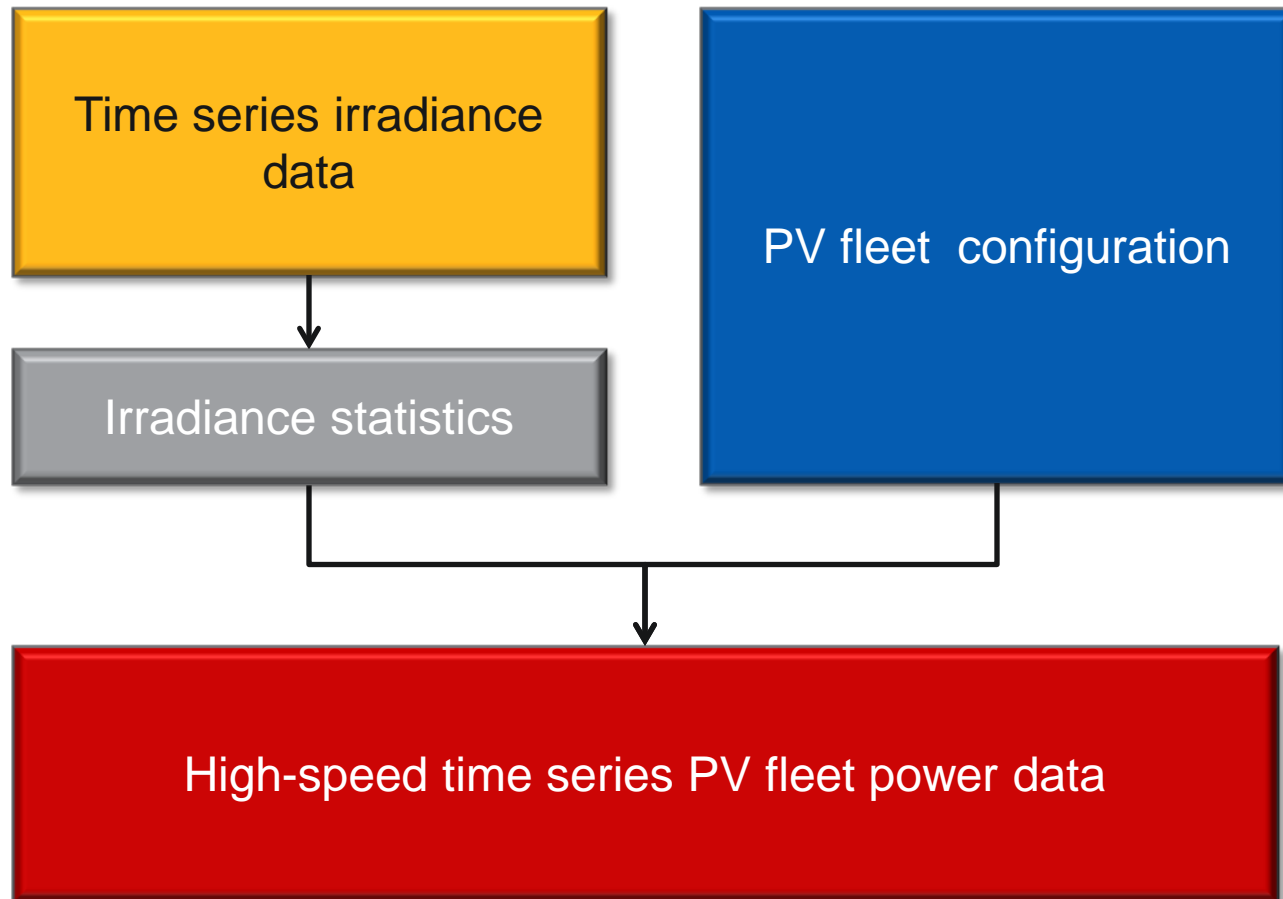
# Problems with Direct Approach

- Expensive instrumentation and communications
- Requires measuring equipment
- Data must be recorded at desired time resolution
- Few dense irradiance networks exist
- Not applicable to forecasting





# Indirect Approach



But do tools exist to implement this?

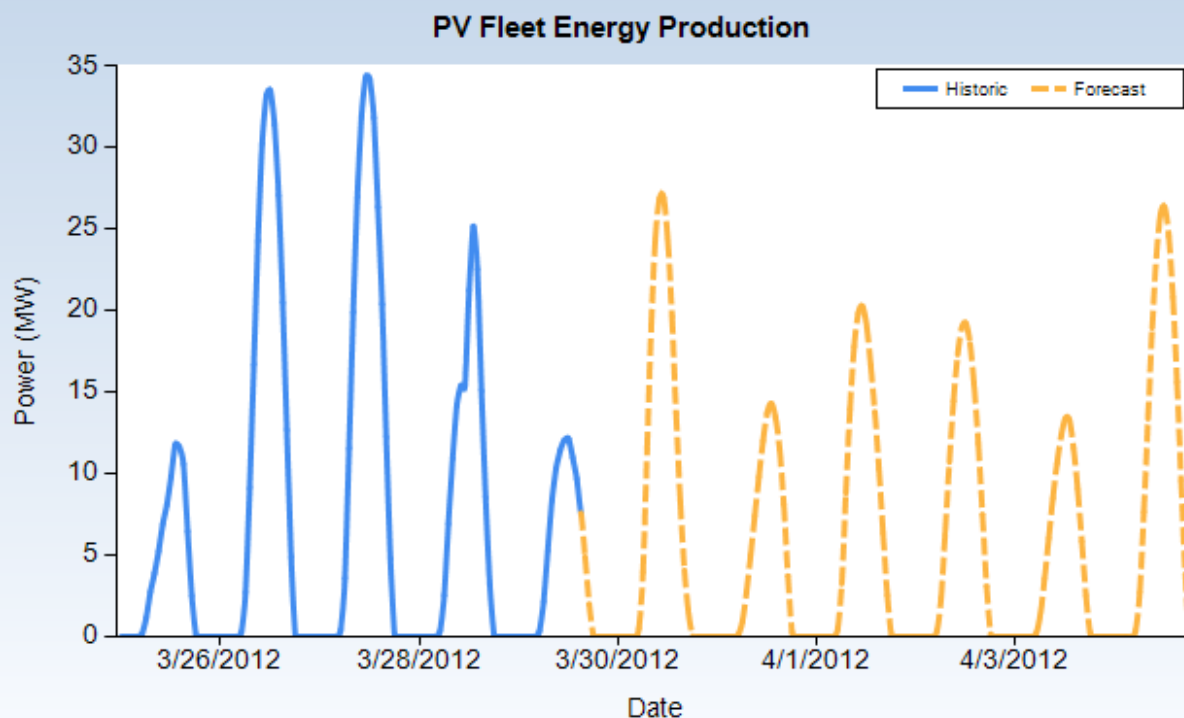


# NYSERDA PV Fleet Output: In Use for 1+ Year



## Available Reports

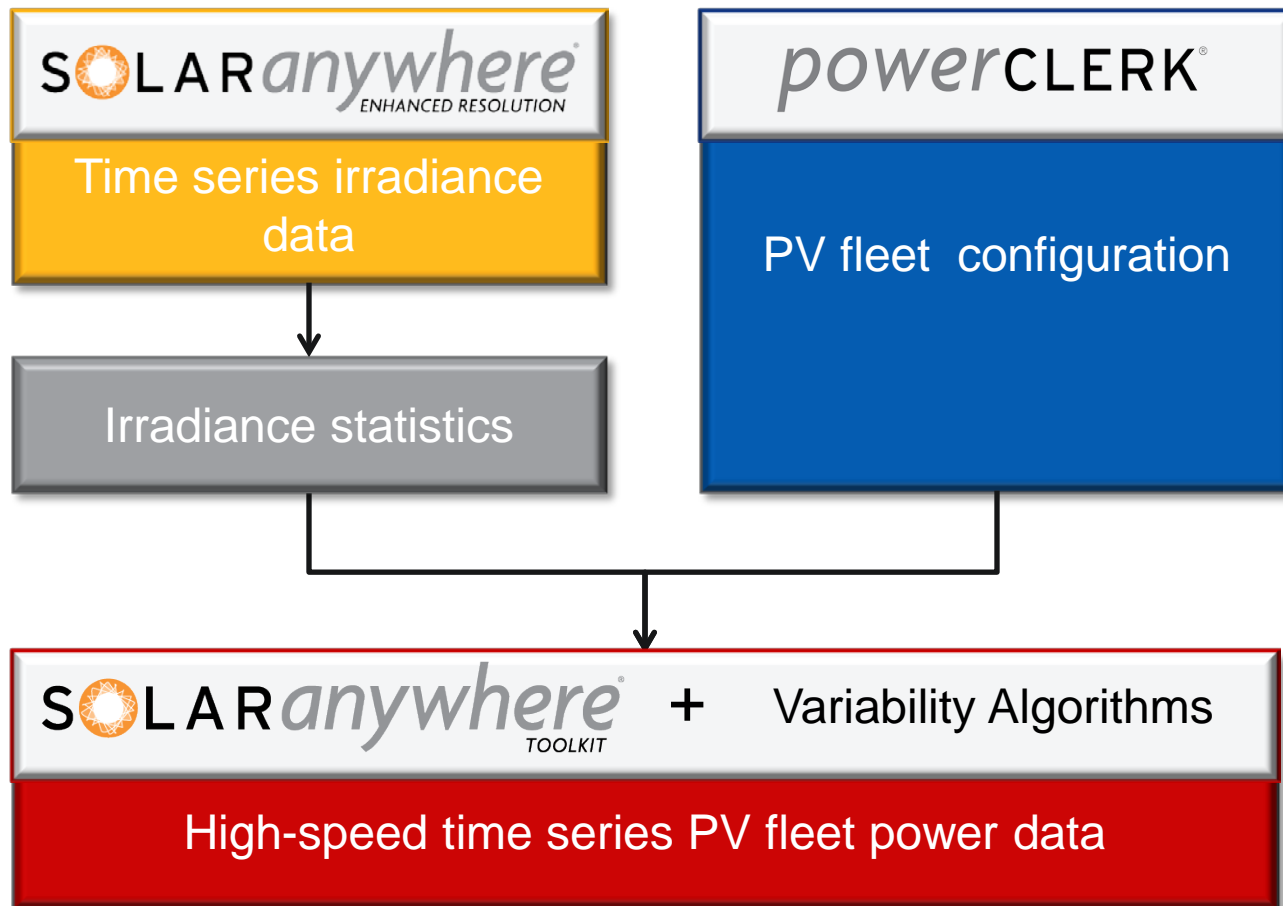
- Map
- PV Fleet Energy Production**
- Program Summary
- Installation Status
- Applications by Status
- Cumulative Production
- Cumulative Capacity
- Capacity by Manufacturer
- Price by County
- Price Deviation by County
- Price by Component
- Price Distribution
- Capacity Distribution
- Incentive Distribution



Included Dates: 3/25/2012 - 4/4/2012

NYSERDA PV Program Analysis by PowerClerk® 3/29/2012 12:21 PM

# Use of Software Services to Implement Approach



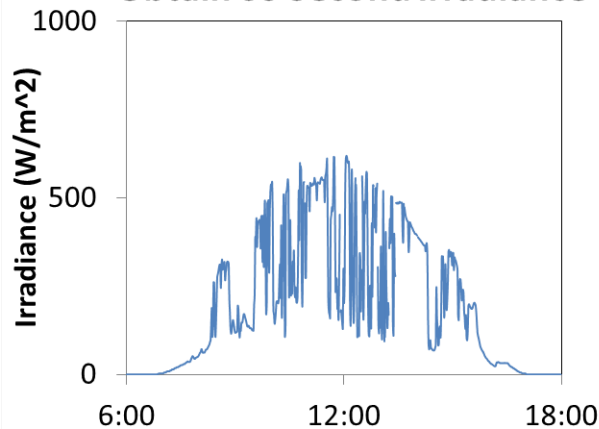
How do the pieces fit together?



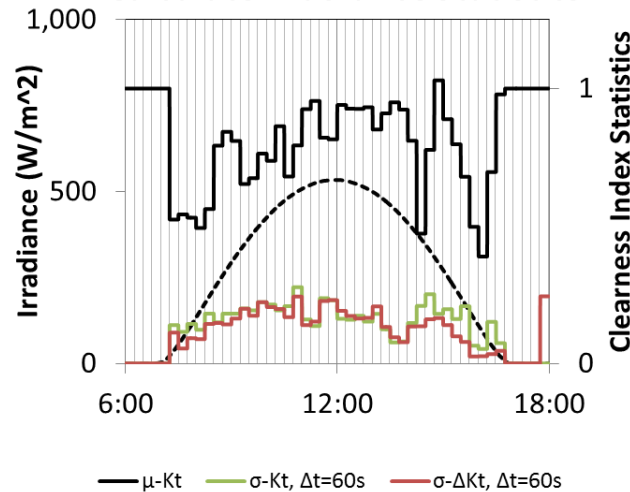
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# Generate High-Speed Time Series PV Fleet Power Data

**Obtain 60 Second Irradiance**

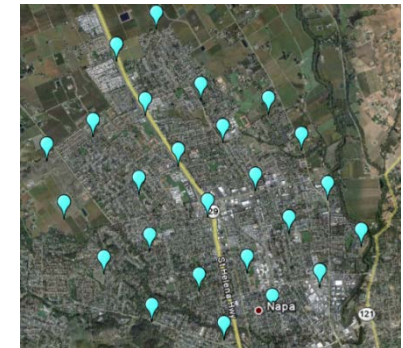


**Calculate Irradiance Statistics**



**Patent Pending:**

**Combine with Fleet Configuration**



1. Computer-Implemented System and Method for Estimating Power Data for a Photovoltaic Power Generation Fleet
2. Computer-Implemented System and Method for Determining Point-to-Point Correlation of Sky Clearness for Photovoltaic Power Generation Fleet Output Estimation
3. Computer-Implemented System and Method for Efficiently Performing Area-to-Point Conversion of Satellite Imagery for Photovoltaic Power Generation Fleet Output Estimation

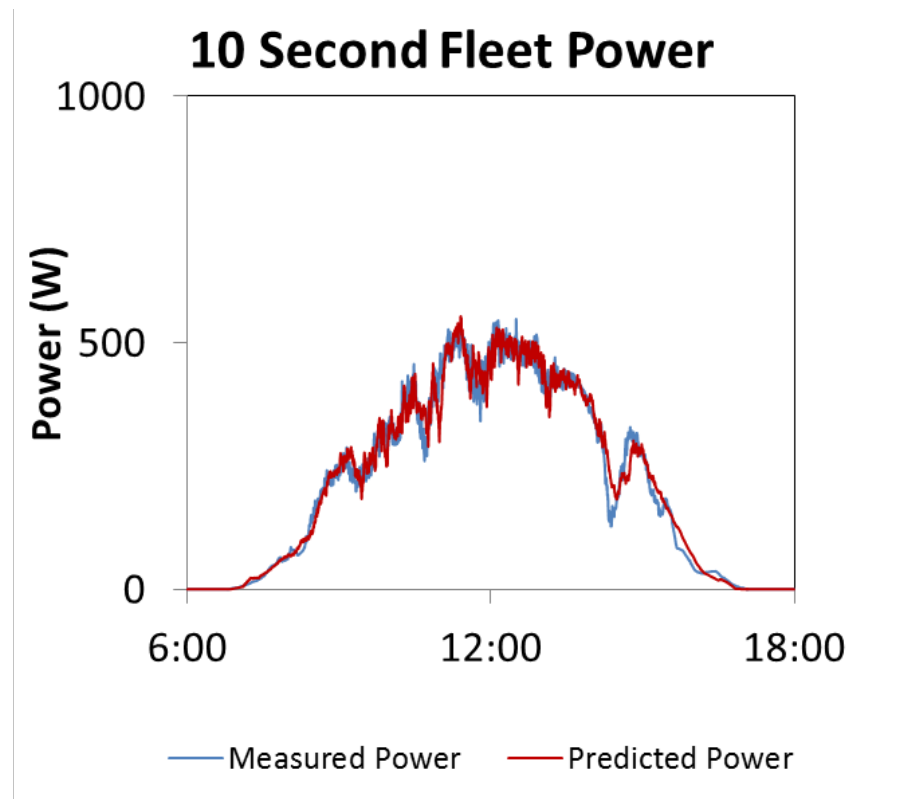


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# Result: High-Speed Time Series PV Fleet Data

Measured and simulated 10 second data from 25 locations  
in a 4 km x 4 km grid in Napa on Nov. 21, 2010



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# Task 2 Summary

- Utility system planners and operators need tools to predict PV fleet performance
- CPR has been developing such tools
  - ✓ Produced enhanced resolution solar resource data
  - ✓ Obtained PV system specifications
  - ✓ Designed simulation algorithms
- Work underway (CEC & CSI Phase 3 contract)
  - Generate high resolution solar resource data
  - Apply high speed PV fleet simulation algorithms
  - Validate PV fleet simulation using measured PV plant data



## Task 3

Developed Web Services to Integrate PV  
Modeling Capabilities into Distribution  
System Tools



# Grid Services Rationale

## **Solar Services (belongs at CPR)**

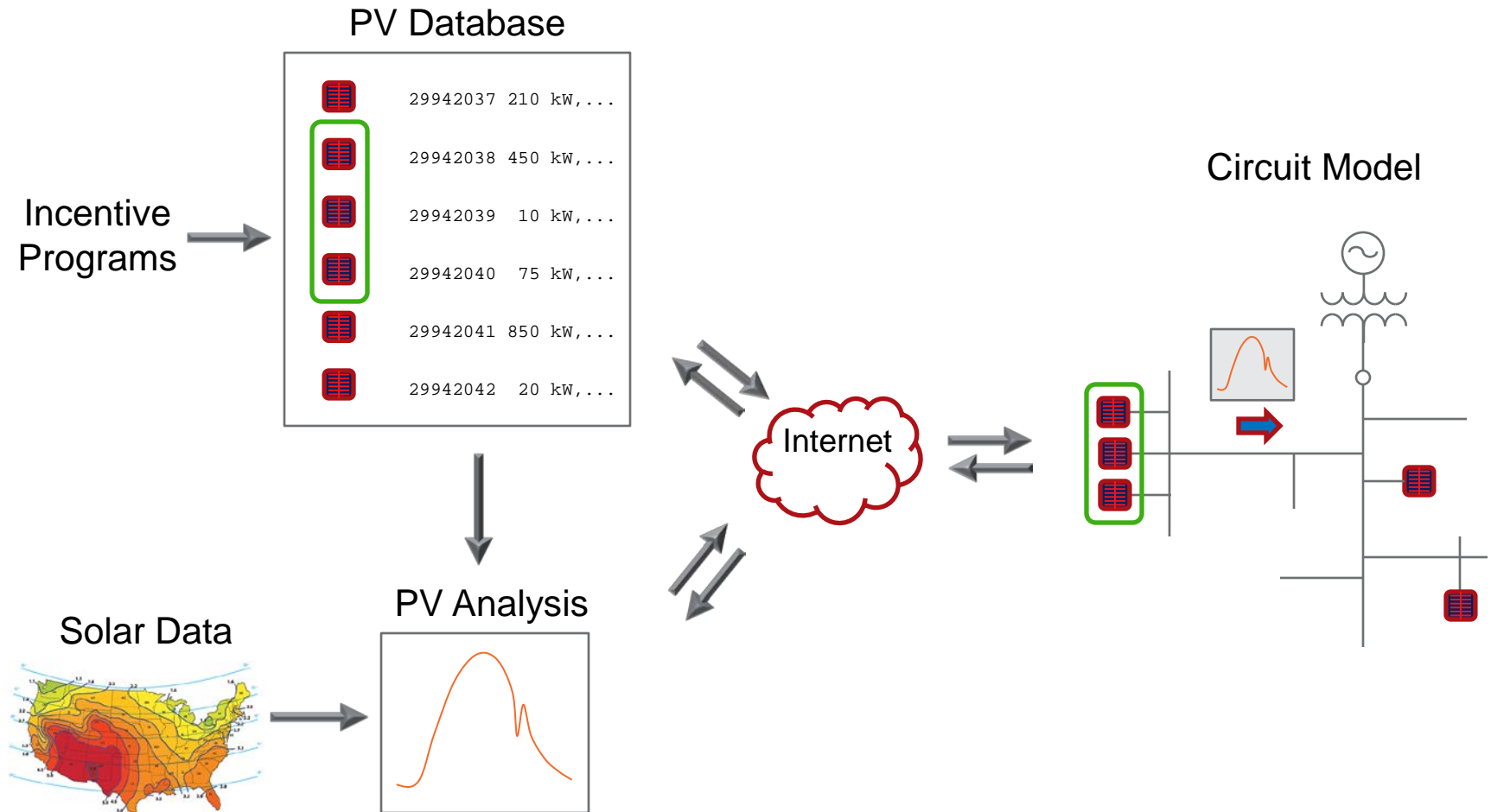
- PV modeling expertise
  - Solar irradiance
  - Cloud effects & shading
  - Sun angles
  - Forecasting
  - Variability
- PV equipment database
- Nationally recognized analytics

## **Circuit Modeling Software (belongs at developer/utility)**

- Circuit analysis expertise
- Developed and tested
- Accepted by utilities



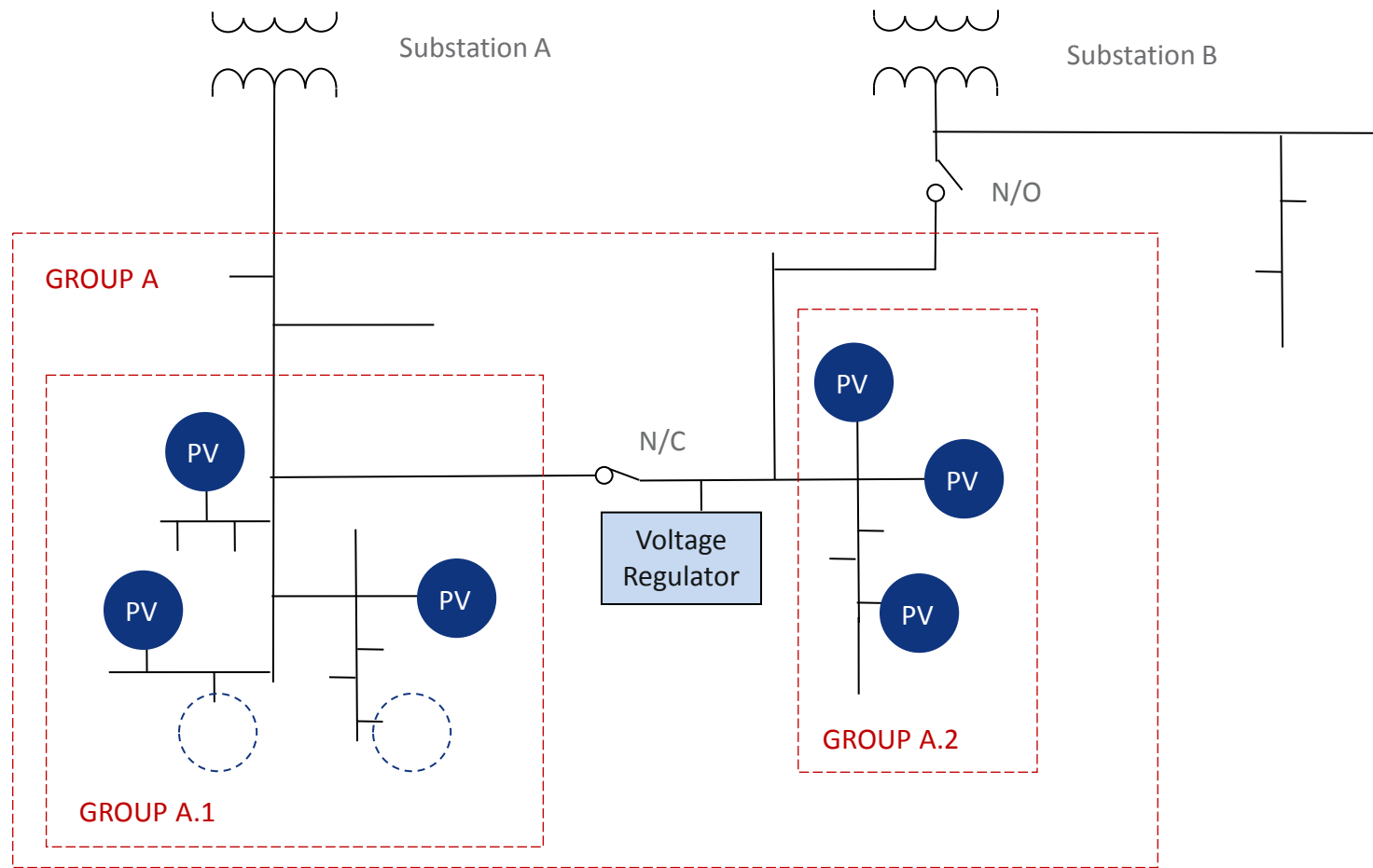
# Accessing CPR Grid Services



# Uses of Software Services

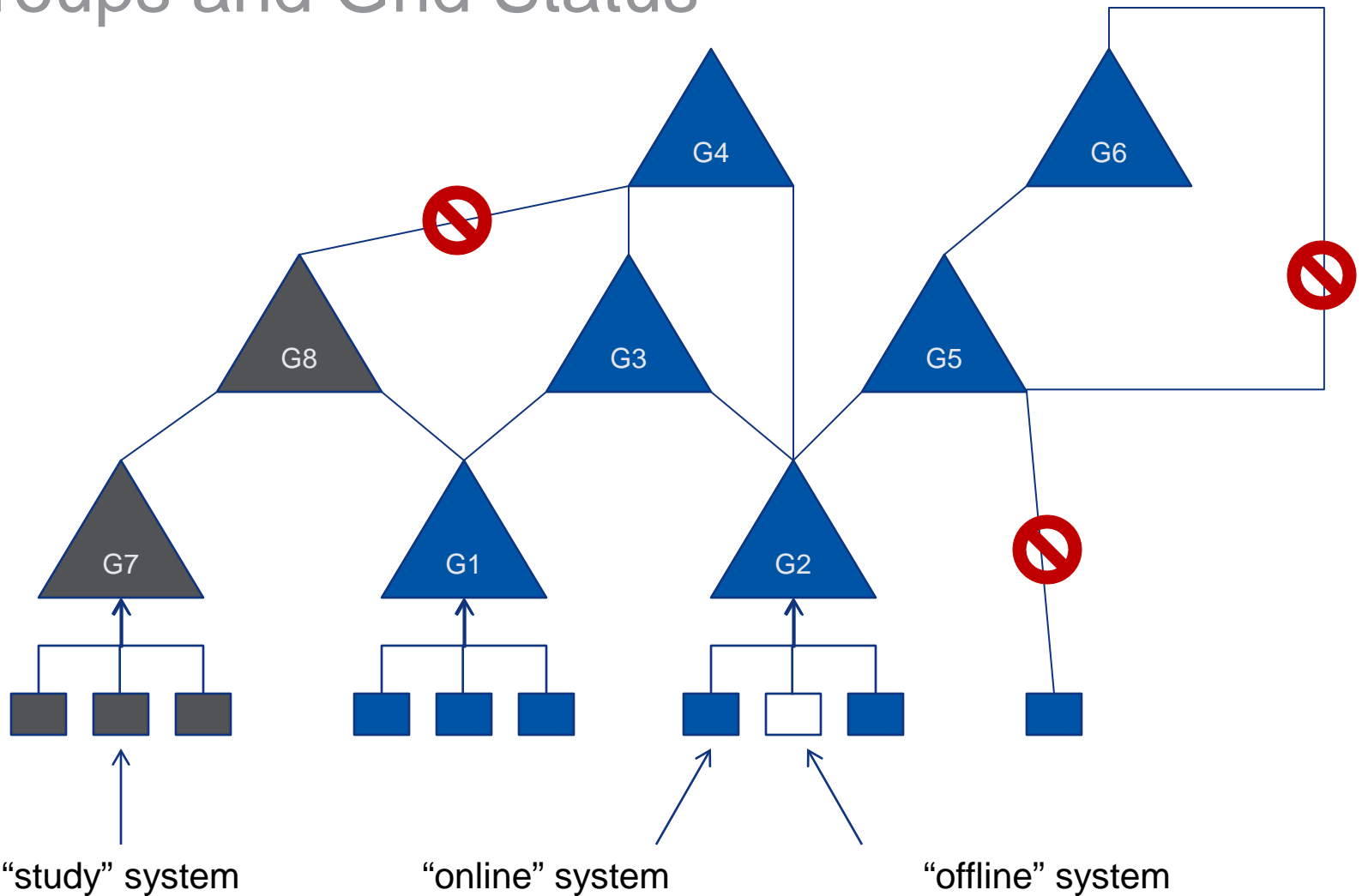
Web service	Result	Uses
PV System Power Statistics (Complete)	PV System: Min, max power by hour (10 year stats)	<ul style="list-style-type: none"> <li>• Load flow studies (voltages, currents)</li> <li>• CVR</li> </ul>
	PV System: Average, standard deviation of power by hour (10 year stats)	<ul style="list-style-type: none"> <li>• Estimate lifetime of devices (regulators, capacitors)</li> <li>• Monte Carlo simulations?</li> </ul>
PV System Power (Complete)	PV System: (real-time & hours-ahead forecast)	<ul style="list-style-type: none"> <li>• Fault location</li> <li>• Load transfer decisions</li> </ul>
PV Fleet Power and Variability (In Development)	PV Fleet: Variability (real time)	<ul style="list-style-type: none"> <li>• Determine expected voltage swings</li> <li>• Load transfer decisions</li> <li>• Schedule reg. reserves (ISO)</li> </ul>
	PV Fleet: Power (forecast)	<ul style="list-style-type: none"> <li>• Estimate summer peak overloading</li> <li>• Estimate day-ahead “net” loads for scheduling generation</li> <li>• Schedule balancing energy (ISO)</li> </ul>

# New Concepts: Groups & Grid Status





# Groups and Grid Status



## Task 4

Created Full Web-based Tool to Calculate  
Economic Value of a Specific PV Fleet  
Configuration



# Distributed PV Calculator

## Project Objective

- Build a software tool to calculate the location-specific economic value of PV to the utility grid from the utility perspective
- Targeted for use by utility planners and policy analysts

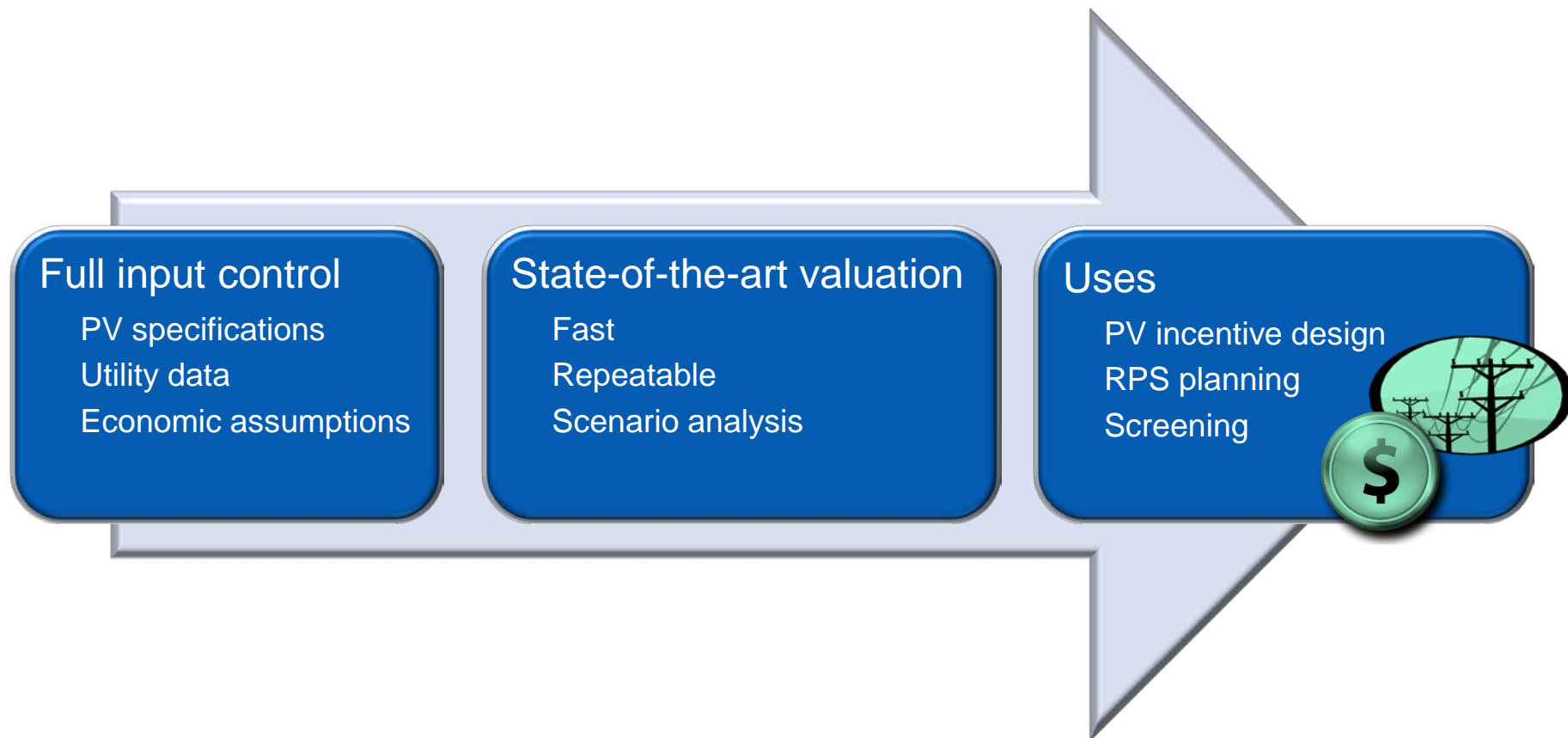


# Sample Study Questions

- How should a value-based Feed-in-Tariff (FIT) be designed?
- Is it worthwhile to target specific distribution areas?  
Which ones?
- How much PV is needed to delay a distribution upgrade by 1 year?
- How much load reduction is obtained from various PV system configurations?



# Calculator Benefits



*Saves cost and provides consistency*



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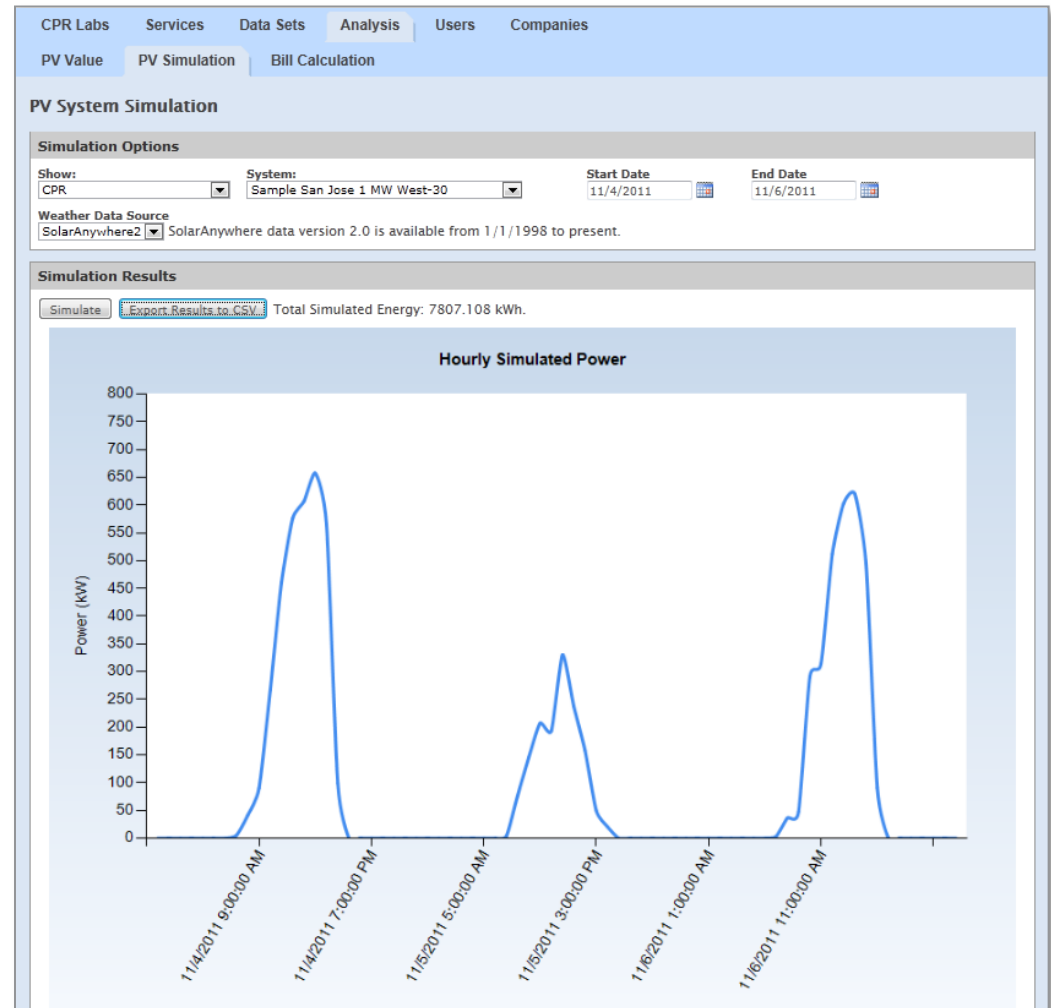
# CPR's Distributed PV Value Analysis History

- Grid-Support PV: Evaluation of Criteria and Methods to Assess Local and System Benefits to Electric Utilities (1993)
- Final Results from the PVUSA Project at Kerman (1994, 1995, 1996)
- Photovoltaic Economics and Markets: The Sacramento Municipal Utility District as a Case Study (1996)
- A Preliminary Analysis of Block Island Power Company's Use of Clean Distributed Resources to Provide Power to Its Customers (1998)
- Distributed Resources: A Potentially Economically Attractive Option to Satisfy Increased Demand on Okanogan County Electric Cooperative's Mazama Feeder Line (1998)
- Final Results Report with a Determination of Stacked Benefits of Both Utility-Owned and Customer-Owned PV Systems to SMUD (2002)
- Determination of Photovoltaic Effective Capacity for Nevada Power (2003)
- Determination of Photovoltaic Effective Capacity for New Jersey (2004)
- Moving Towards a More Comprehensive Framework to Evaluate Distributed Photovoltaics (2005)
- The Value of Distributed Photovoltaics to Austin Energy and the City of Austin (2006)
- Shining on the Big Apple: Satisfying New York City's Peak Electrical Needs with PV (2008)
- PV Value Analysis for We Energies (2009)



# PV Simulations

- Simulations for any defined systems in company
- Uses SolarAnywhere
- Historical, real time or forecast
- Downloadable results in CSV format





# Loss Savings

- Distributed resources reduce system losses by producing power in the same location where it is used
- Loss savings increase the value of other benefits across generation, transmission, and distribution systems
- Correct loss savings depend upon the benefit category
- Loss savings are calculated on the margin



# Energy Value

- Definition
  - Benefit from distributed PV generation's offset of wholesale energy purchases
- Methodology
  - Energy value equals PV output plus loss savings times marginal energy cost
  - Marginal energy costs are based on fuel and O&M costs of generator operating on the margin (CCGT)



# Generation Capacity Value

- Definition

- Benefit from added capacity provided to the generation system by distributed PV

- Methodology

- Generation capacity value equals generation capacity cost times PV's effective load carrying capability (ELCC), taking into account loss savings
- Generation capacity cost is based on capital cost of CCGT



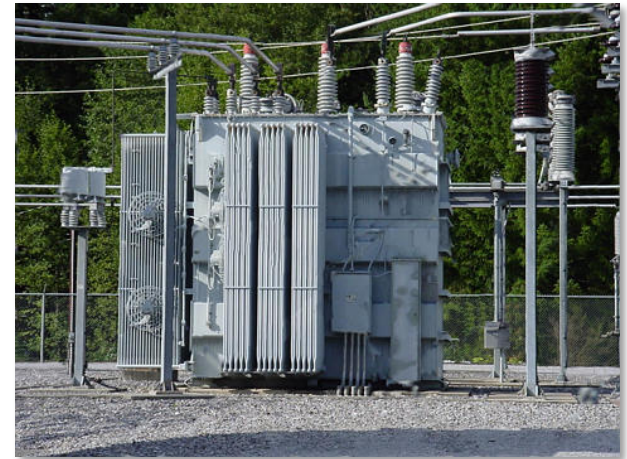
# Fuel Price Hedge Value

- Definition
  - Benefit that distributed PV generation has no fuel price uncertainty
- Methodology
  - Fuel price hedge value is calculated by determining how much it would cost to eliminate the fuel price uncertainty associated with natural gas generation



# T&D Capacity Value

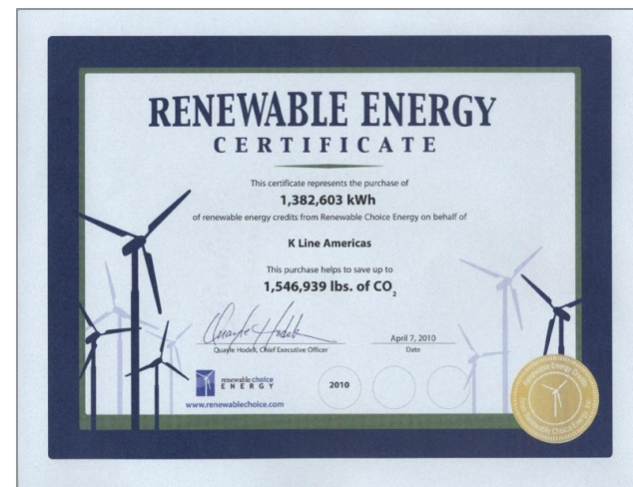
- Definition
  - Benefit that distributed PV generation provides in reducing the burden on the T&D system and thus delaying the need for capital investments in the T&D system
- Methodology
  - T&D capacity value equals the expected long-term T&D system capacity upgrade cost, divided by load growth, times financial term, times a factor that represents match between PV system output (adjusted for losses) and T&D system load



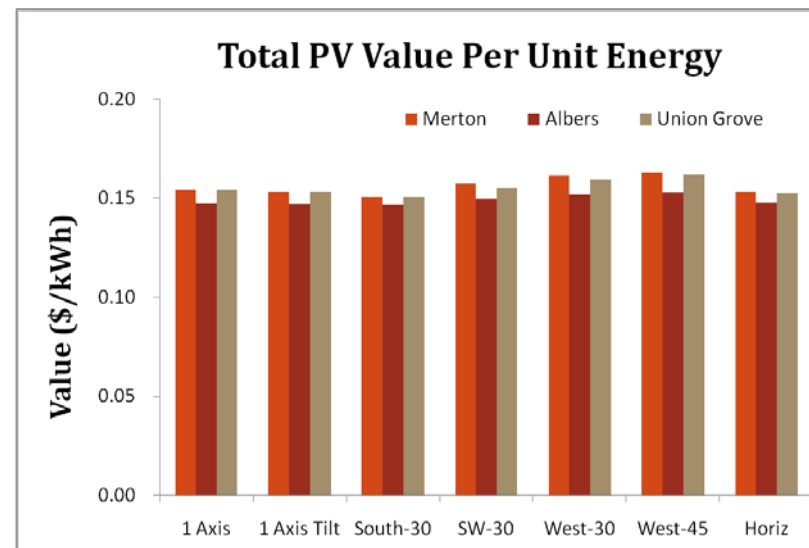
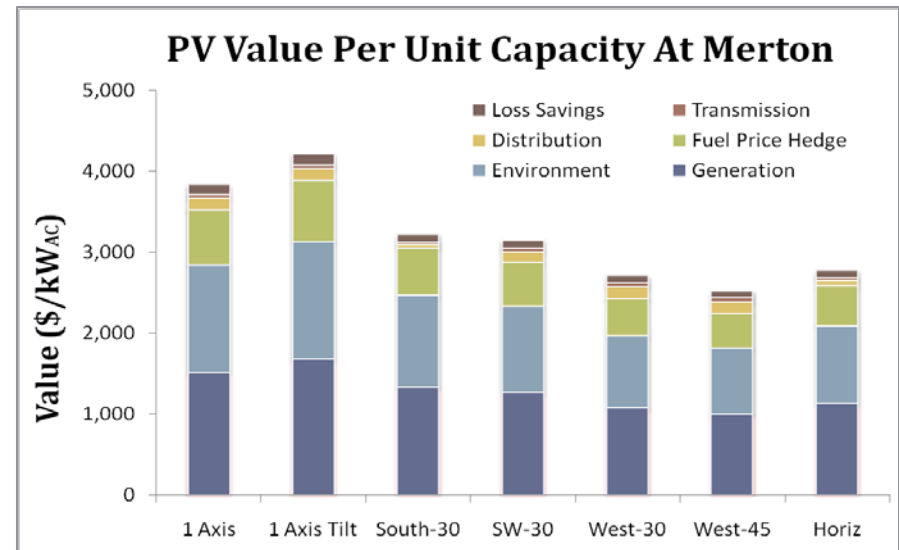
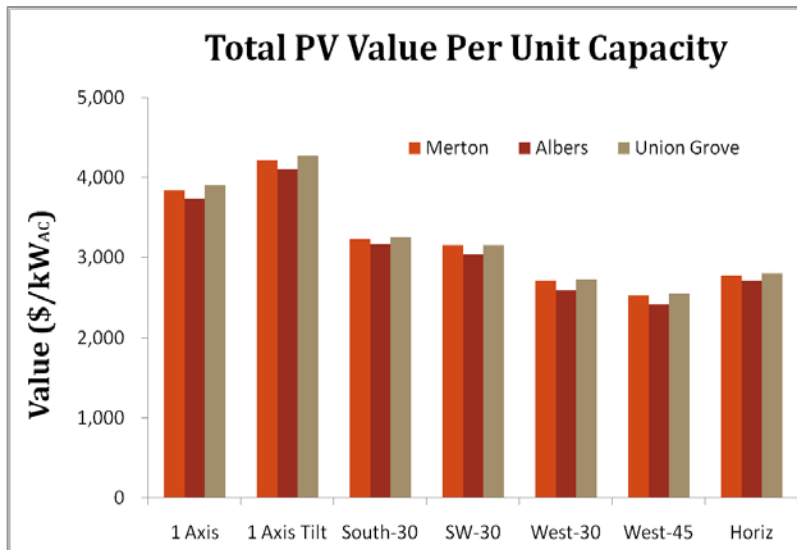


# Environmental Value

- Definition
  - Benefit that the environmental footprint of PV is considerably smaller than that of fossil-based generation
- Methodology
  - Environmental value equals PV output times REC price



# Graphing Results (in Excel)



## On-line Tutorial



[www.youtube.com/watch?v=3IKi0UjD008](http://www.youtube.com/watch?v=3IKi0UjD008)



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# Summary of Work Completed

- Enhanced spatial and temporal resolution of SolarAnywhere® for ***the entire state*** of CA
- Developed, validated, and patented approach to simulate ***both output variability and output***
- Developed web services to integrate PV modeling capabilities into distribution system tools
- Created ***full web-based*** tool to calculate economic value of a specific PV fleet configuration



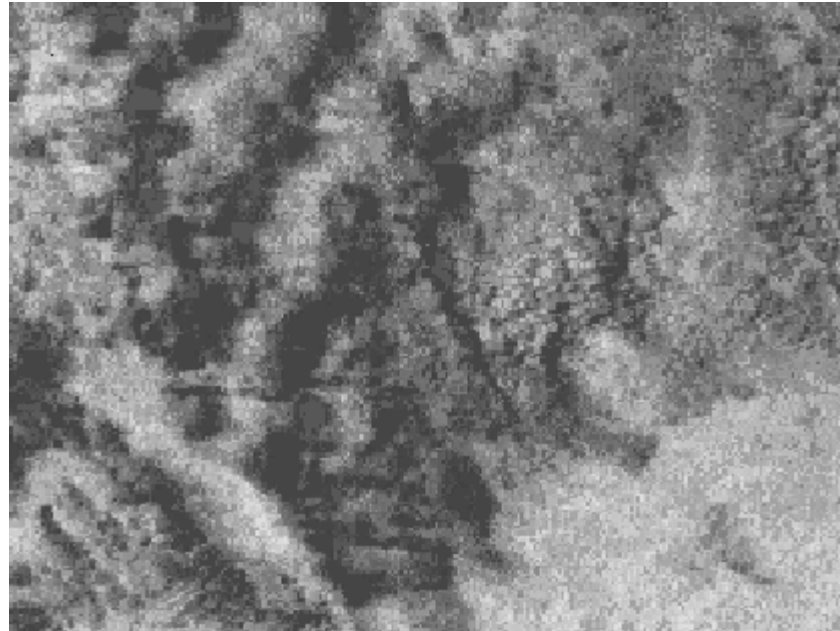
# Sneak Previews

Cool Stuff Under Development



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# Creating 1-Minute Data Sets Using Cloud Motion Vector Approach



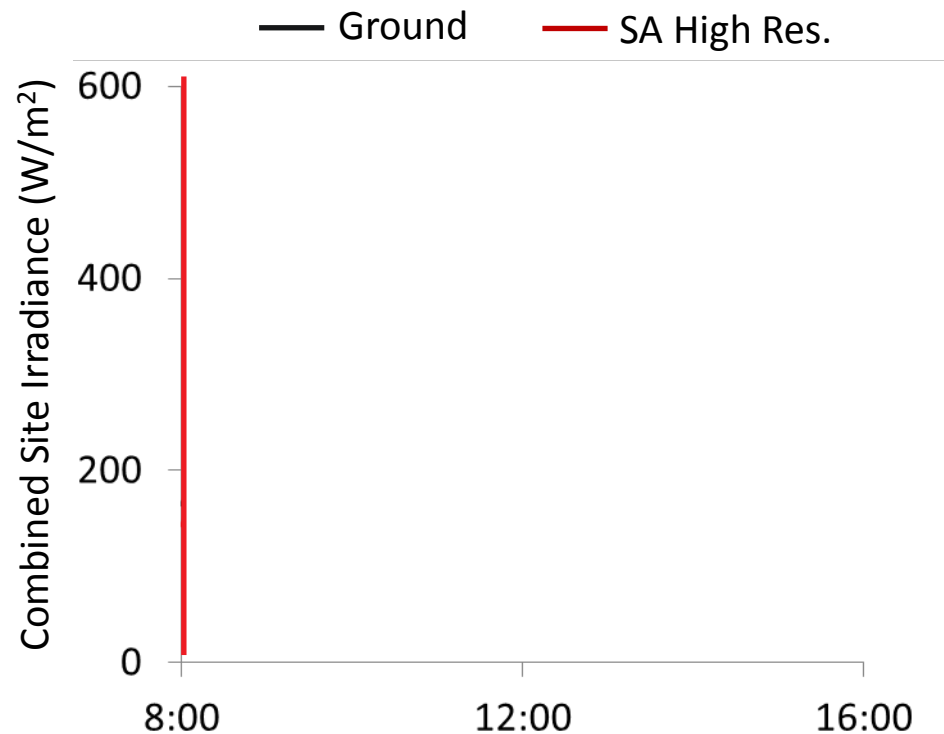
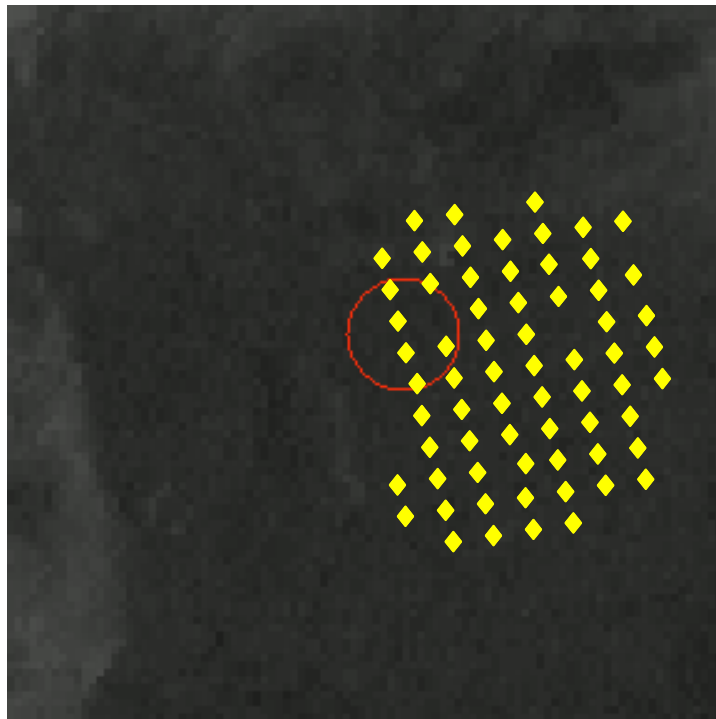
0 10 20 30  
**Minutes**



**Clean Power Research®**

# Measured Data From SMUD's 66 Sensor Network vs. Simulated Data on Highly Variable Day

Nov. 18, 2011



Clean Power Research®



# Thank you

*Questions?*

Contact: Tom Hoff

[tomhoff@cleanpower.com](mailto:tomhoff@cleanpower.com)

[cleanpower.com](http://cleanpower.com)



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