



# **Results of Model Intercomparison - Predicted vs. Measured System Performance**

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**PV Performance Modeling Workshop  
Sandia National Laboratories, Albuquerque, NM  
September 22 & 23, 2010**

Sandia is a multiprogram laboratory operated by Sandia Corporation, a Lockheed Martin Company,  
for the United States Department of Energy's National Nuclear Security Administration  
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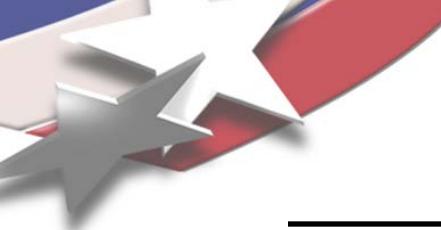




# Goals and Objectives

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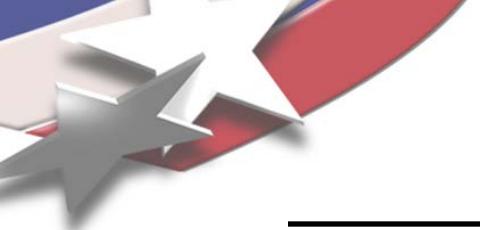
- **Blind modeling study to illustrate the variability expected between PV performance model results**
  - What is the modeling uncertainty?
  - Do certain models do better than others?
  - How can performance modeling be improved?
  - What are the sources of uncertainty?



# Exercise Participants

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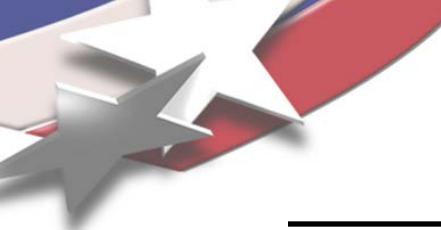
- **17 Individuals submitted modeling results**
- **25 model sets of model results (template files)**
  - Some individuals submitted several sets of results
  - One individual used TMY weather file
- **Modelers were from a wide sample of the market landscape (except module manufacturers)**
  - Integrators, consultants, academia, national labs, state government



# Models Used

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- **5-Parameter Model (Univ. of Wisconsin)**
  - Solar Advisor Model
  - Other implementations (array temperature model)
- **PVSyst (V. 5.20, 5, and not specified)**
- **Sandia Photovoltaic Array Performance Model**
  - Solar Advisor Model (versions?)
  - PV Design Pro
  - Clean Power Research (PV Simulator <sup>TM</sup>)
  - Homemade versions
- **PWatts**
  - Solar Advisor, other?
- **PVForm**
- **Internal Models**
  - UC Boulder
  - SRCL



# Models Used

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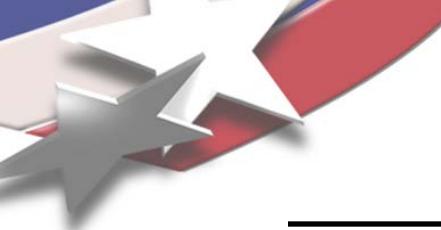
## Implementation

## Model Forms

	5-Par	5-Par Modified Temp	SAPM	PVSyst	PVWatts	Internal	Other
SAM	***		*		*		
PVWatts					*		
PVForm							*
PVSyst				*****			
EES		***					
CECPV	*	*					
Internal			*			**	
Other			*				*

Total =

24

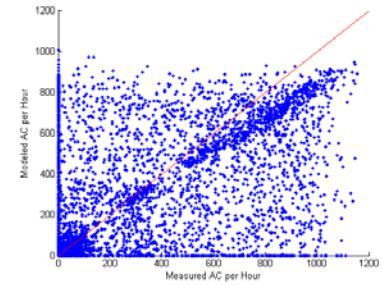


# Problems and Uncertainties

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- **Problems encountered include**
  - Missing data (month of Dec for System 1) caused some problems
  - Several results were not usable (time mismatch?)
  - Oversized inverters
- **Uncertainties encountered include:**

- Modules and inverters not in database
- Not sure how to set derate factors
  - Some guessed
  - Some did not include derate factors





# General Issues

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- Not all models were able to simulate all systems.
- Some models (e.g., PVWatts on the web) cannot accept user-supplied weather data (SAM can)
- Not all participants included details about assumptions (e.g., derate factors)

- Each system has different set of models applied...

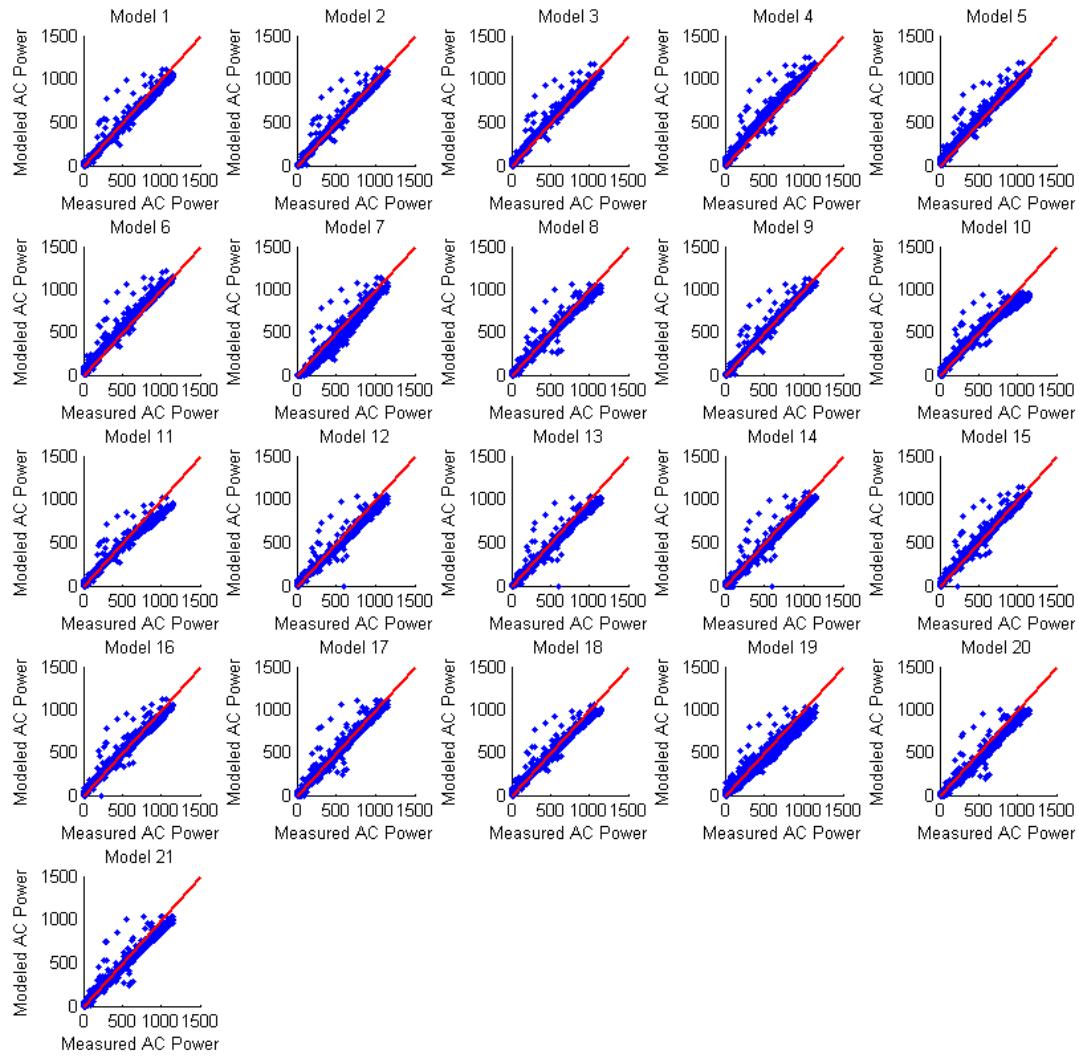


# Comparison Methods

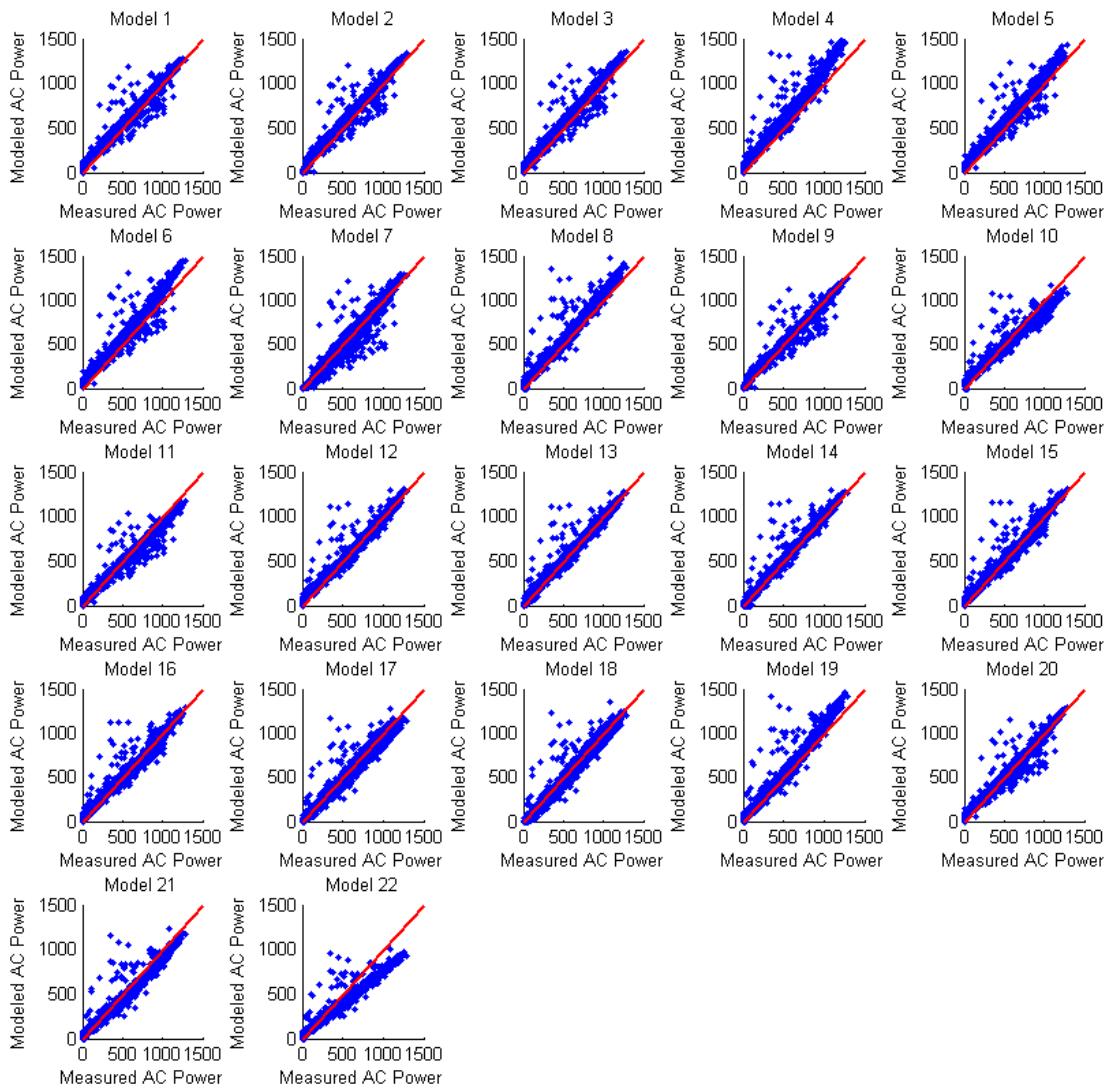
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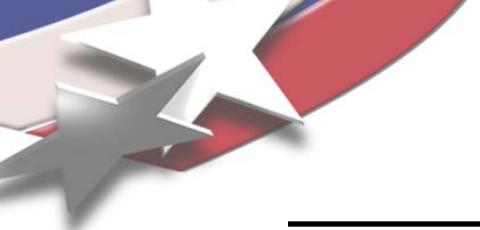
- Hourly Energy Comparisons
- Monthly Energy Comparisons
- Annual Energy Comparisons
- Module Temperatures

# Hourly Comparisons (System 1)



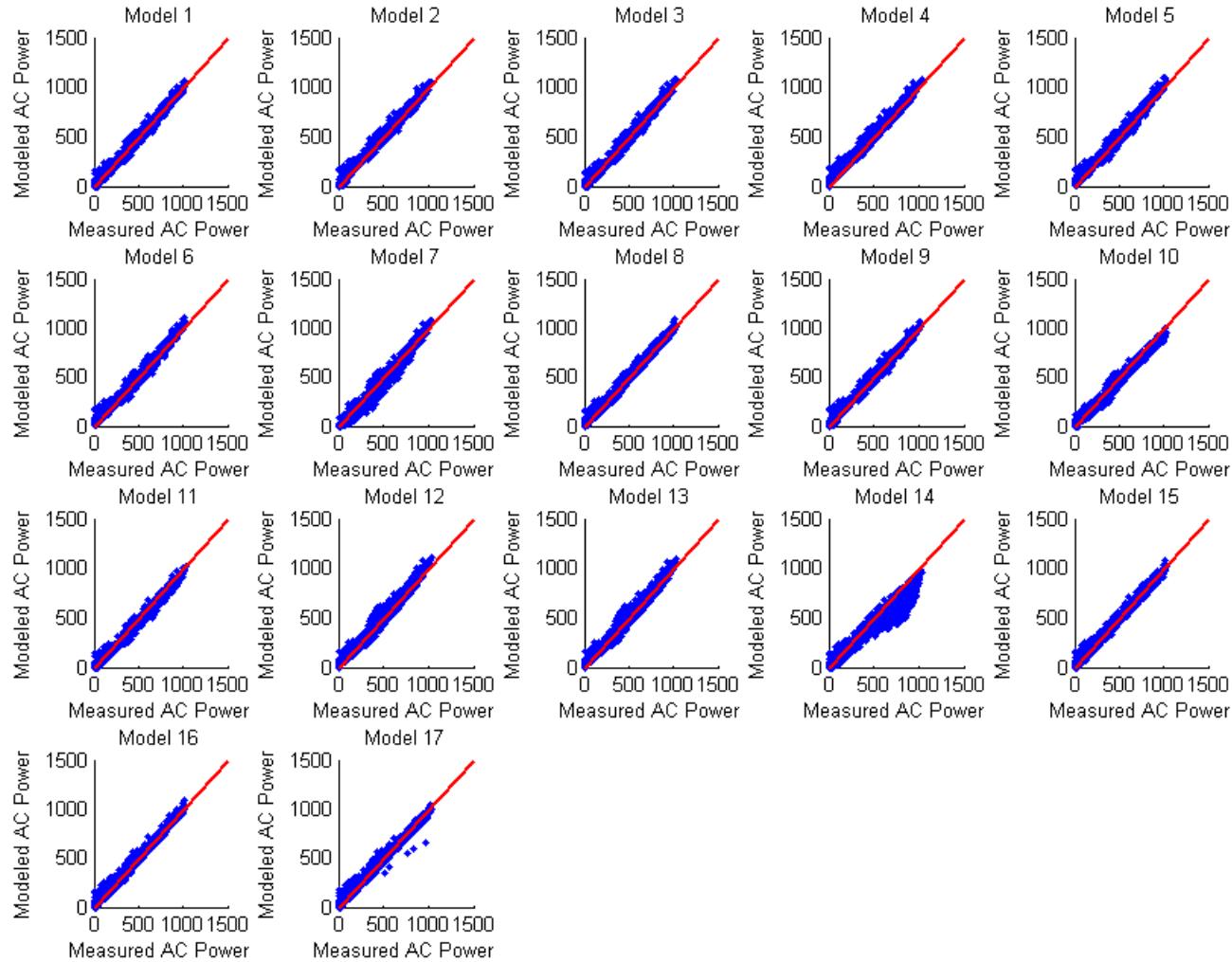
# Hourly Comparisons (System 2)

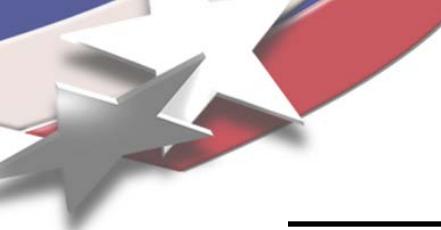




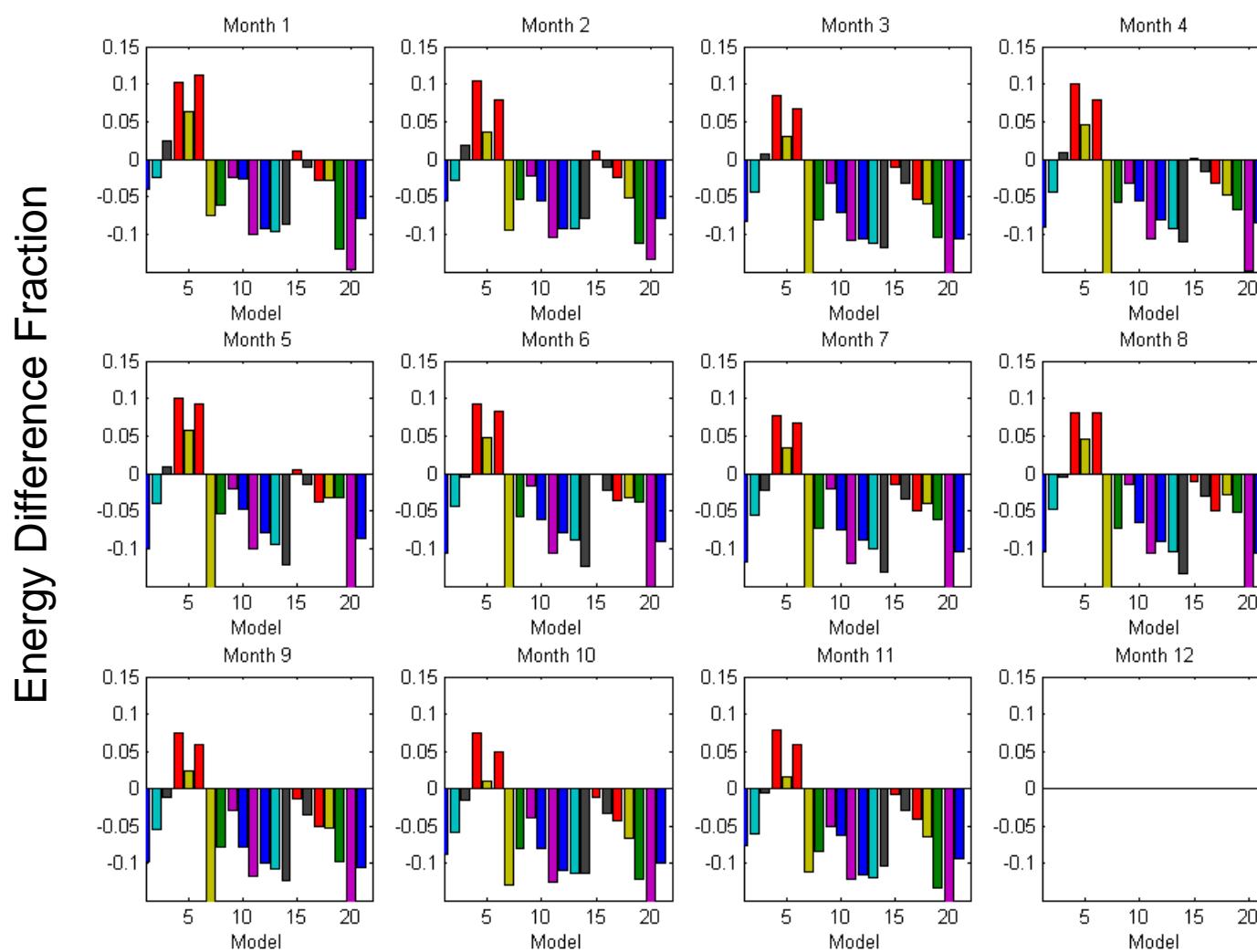
# Hourly Comparisons (System 3)

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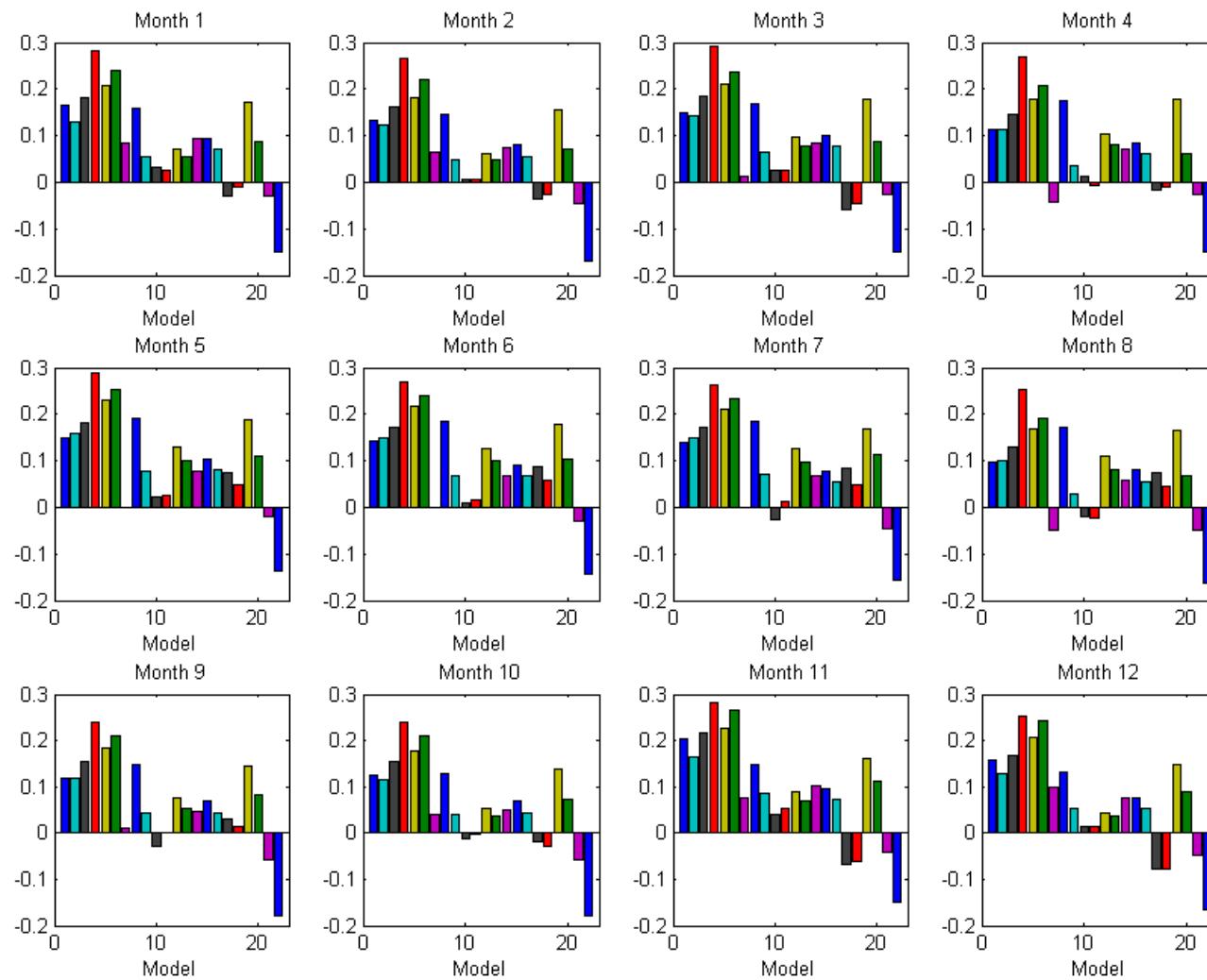


# System 1 Comparison by Month



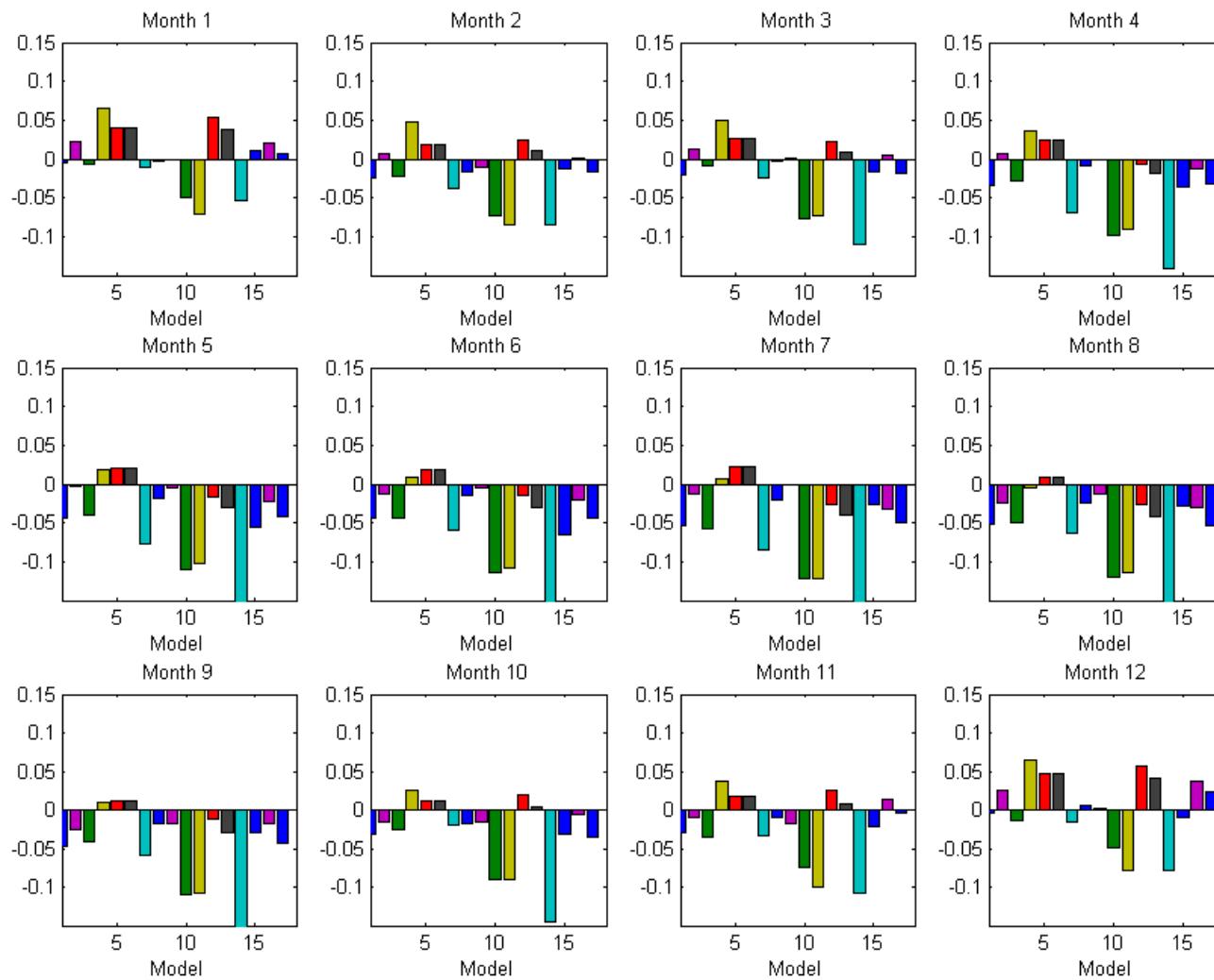
# System 2 Comparison by Month

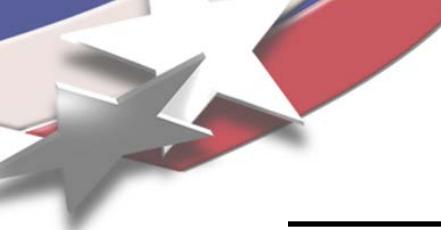
Energy Difference Fraction



# System 3 Comparison by Month

Energy Difference Fraction

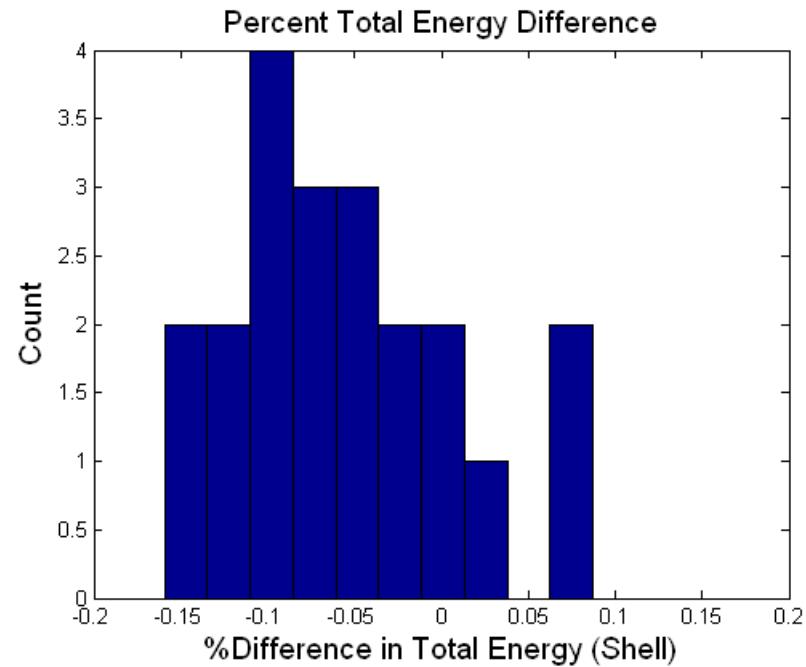
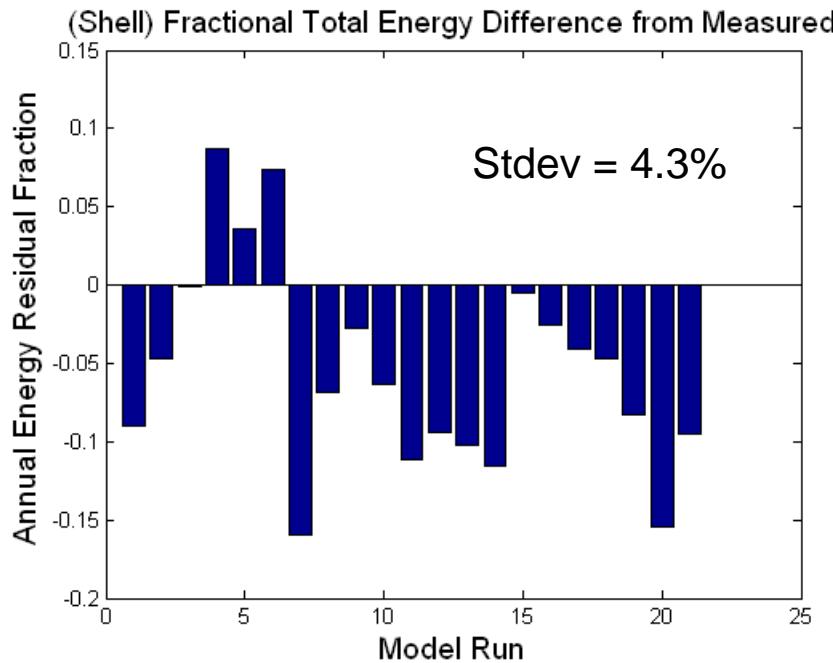




# Total Energy Residuals (System 1)

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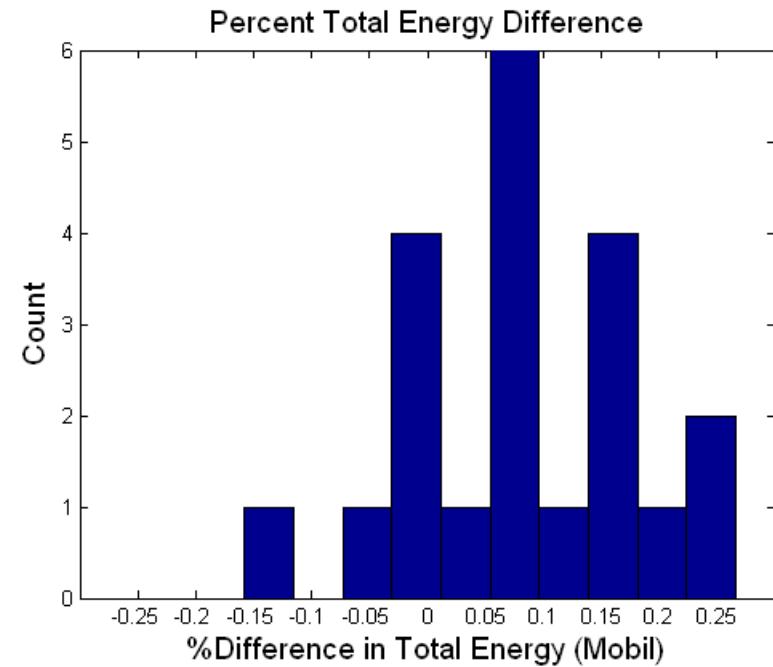
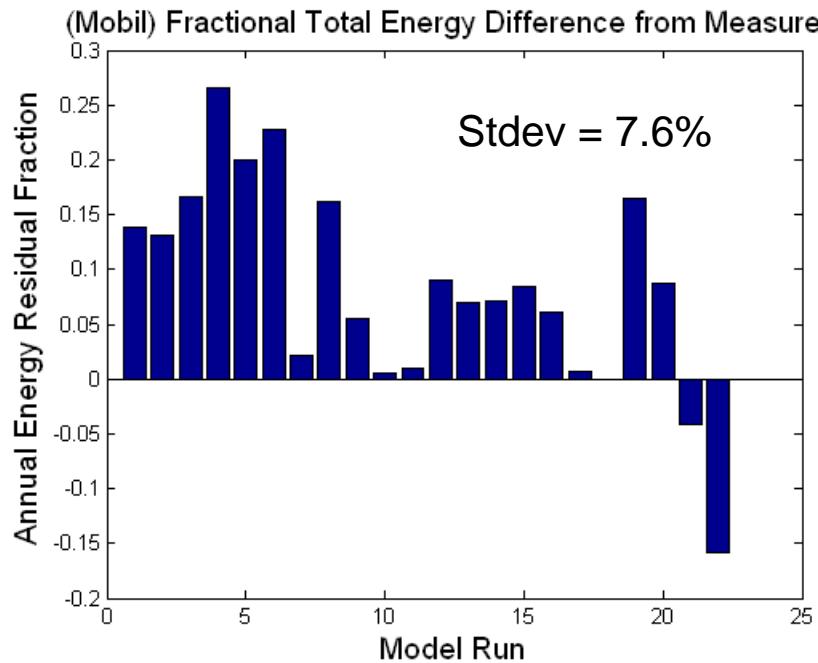
- Relative difference in total energy production:  
$$(\text{Energy}_{\text{mod}} - \text{Energy}_{\text{meas}}) / \text{Energy}_{\text{meas}}$$



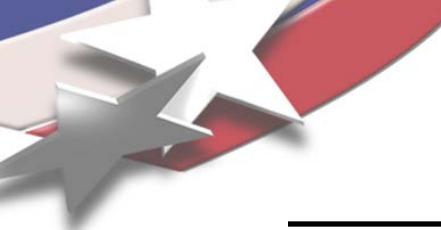
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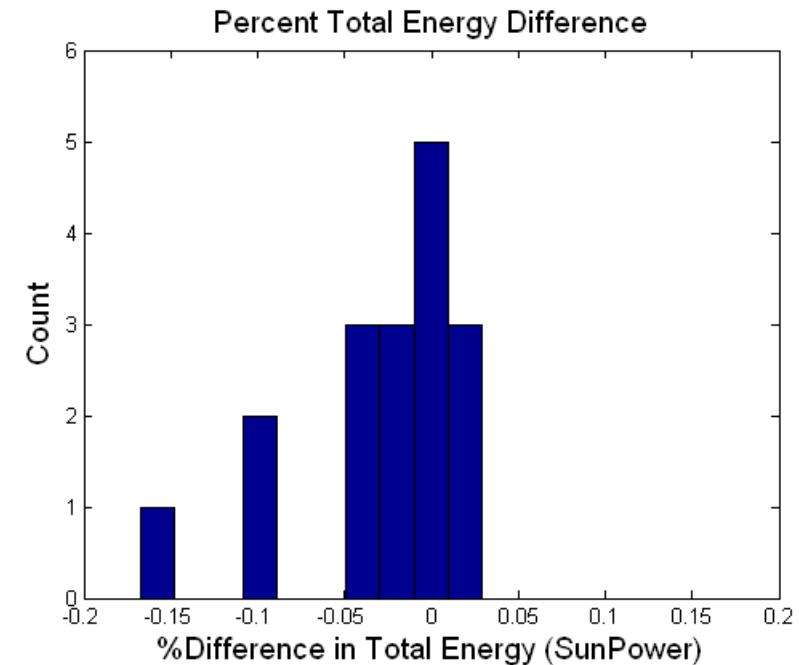
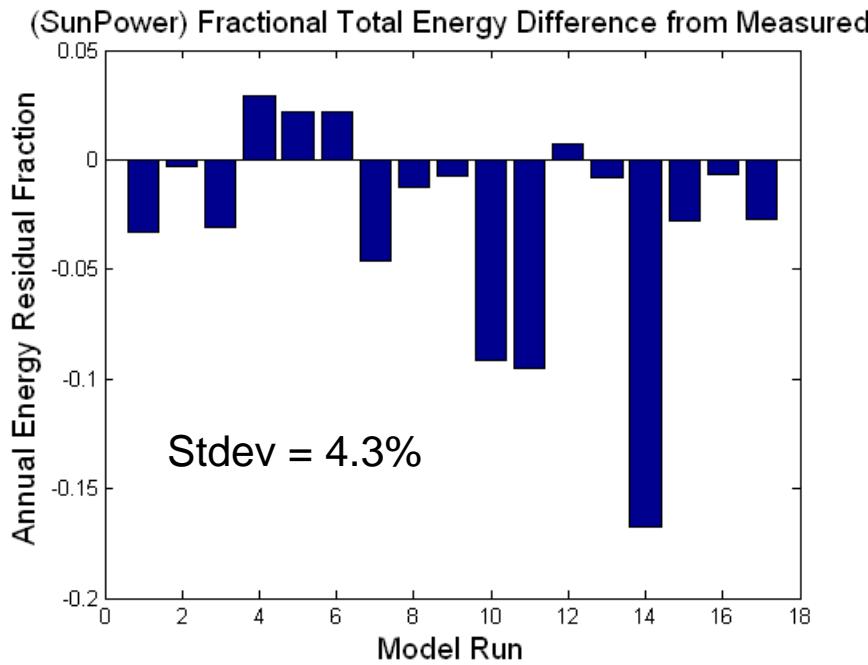
Inverter load = ~18 W

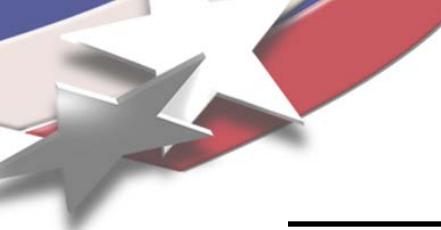


# Total Energy Residuals (System 3)

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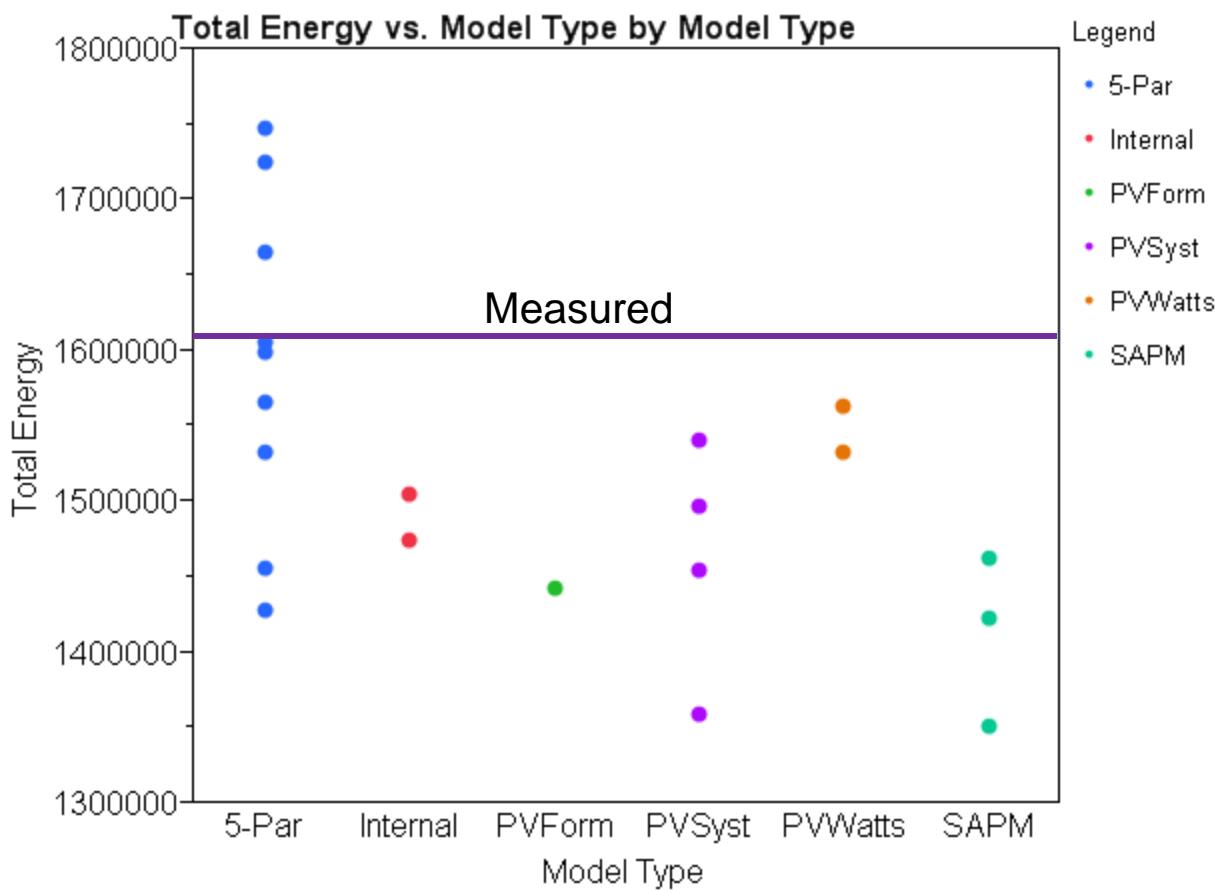
- Relative difference in total energy production:  
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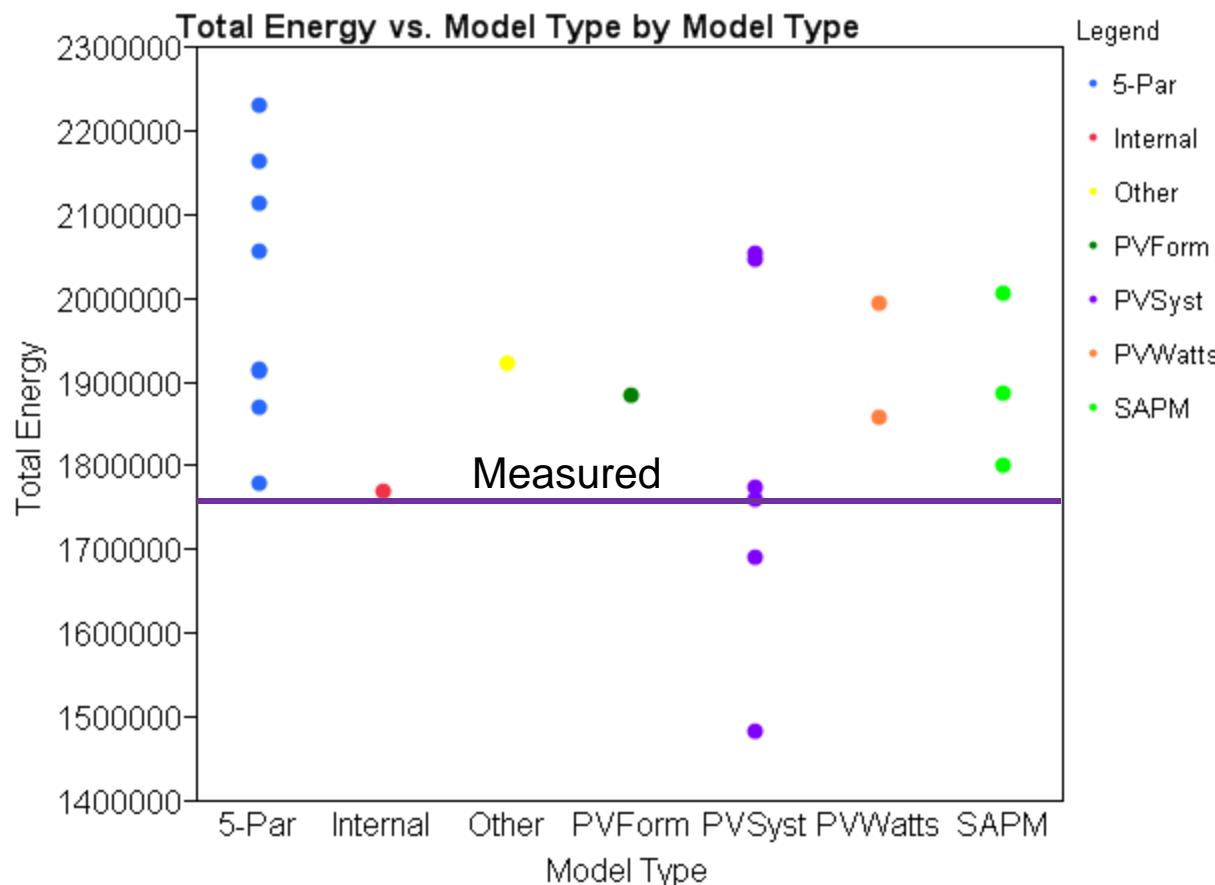


# System 1 Totals by Model Type

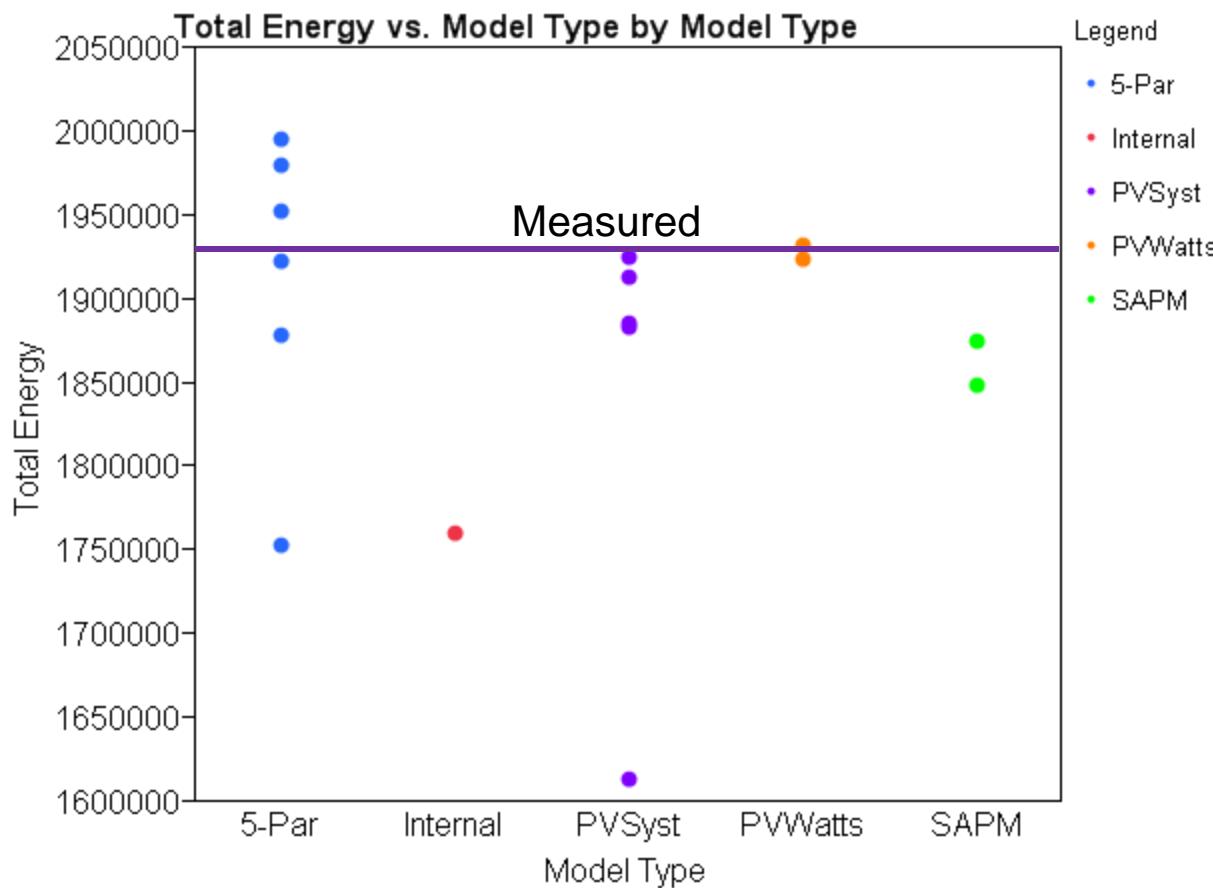
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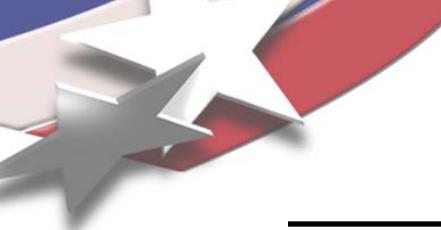


# System 2 Totals by Model Type



# System 3 Totals by Model Type



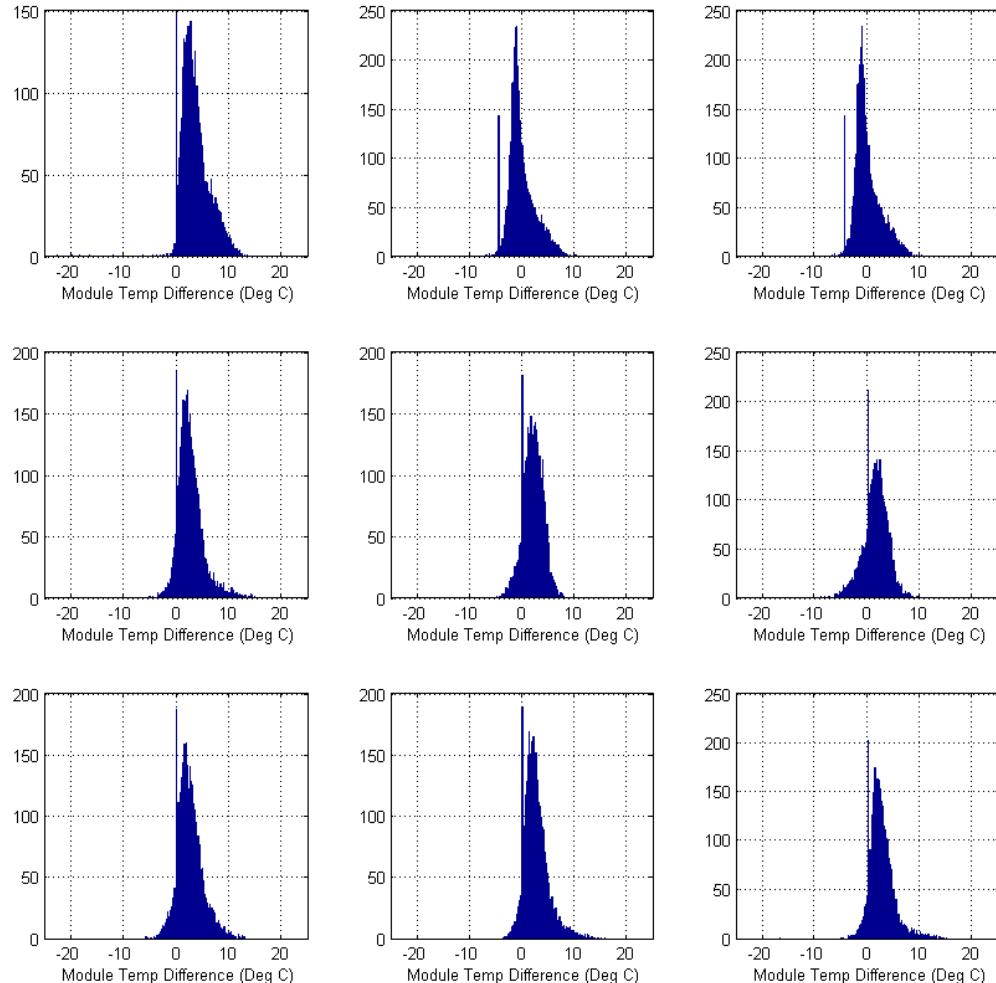


# Module Temperature Results

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- **Model Output: Module temperature or cell temperature?**
  - Module backside temperature is measured quantity

# Example Module Temperature Results System 3



- Most module temperature models appear to behave well.
- Mean bias error range: (-0.17 – 3.6 deg C)
- Stdev range: (2-2.5 deg C)



# Preliminary Conclusions

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- Large variation seen in model results
- Variation not entirely consistent across systems
- Uncertainty in assigning derates
- Discomfort when components are not included in database.
  - Is there comfort when the components are in the database???
- Residual analysis will help to uncover additional patterns in the models.