

# A Review of Measured/Modeled Solar Resource Uncertainty

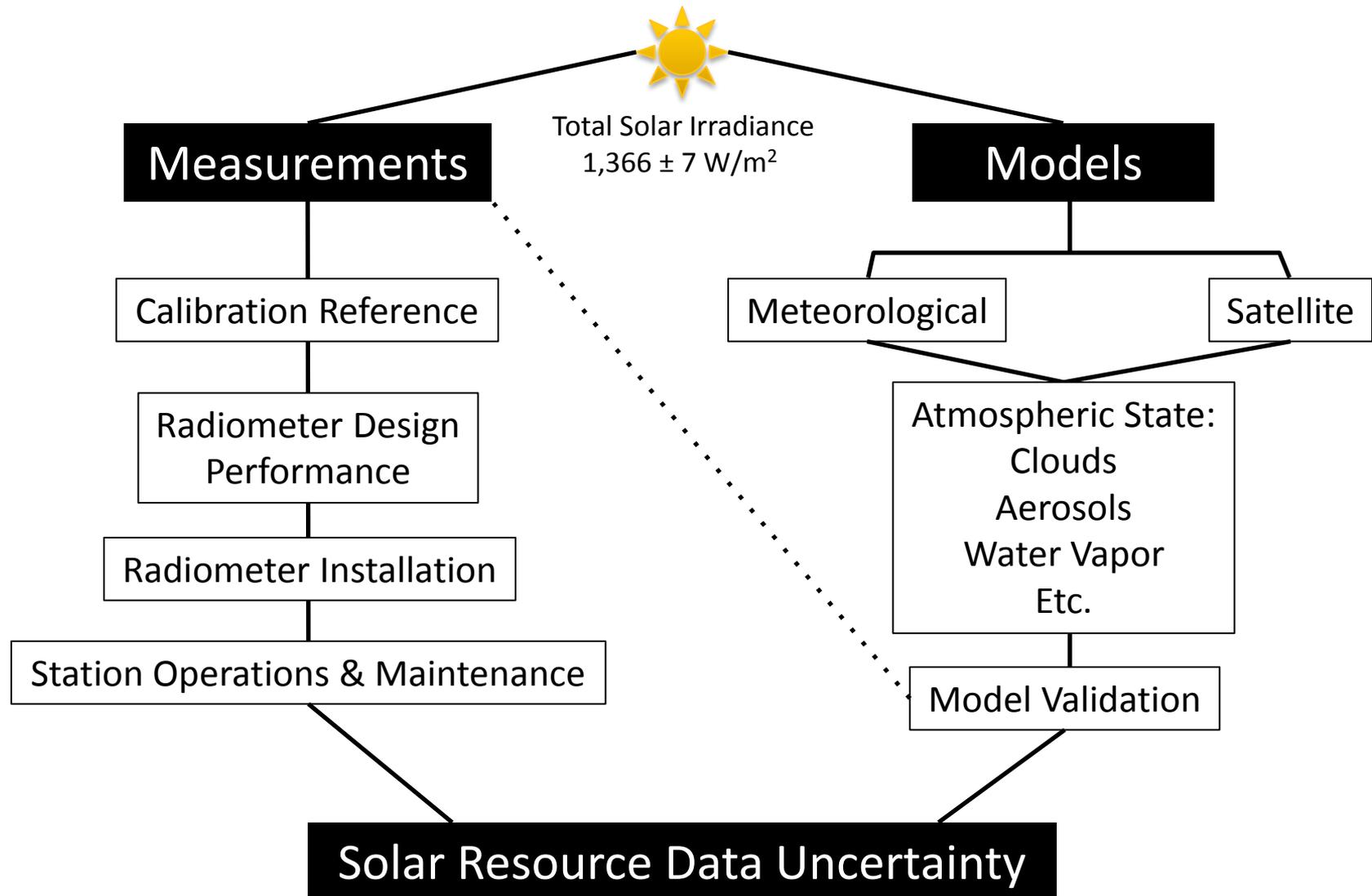


Presented at the 2013 Sandia PV  
Performance Modeling Workshop

Santa Clara, CA      May 1-2, 2013

Tom Stoffel

# Getting to PV Performance Model Input Uncertainty



# Solar Radiation Components

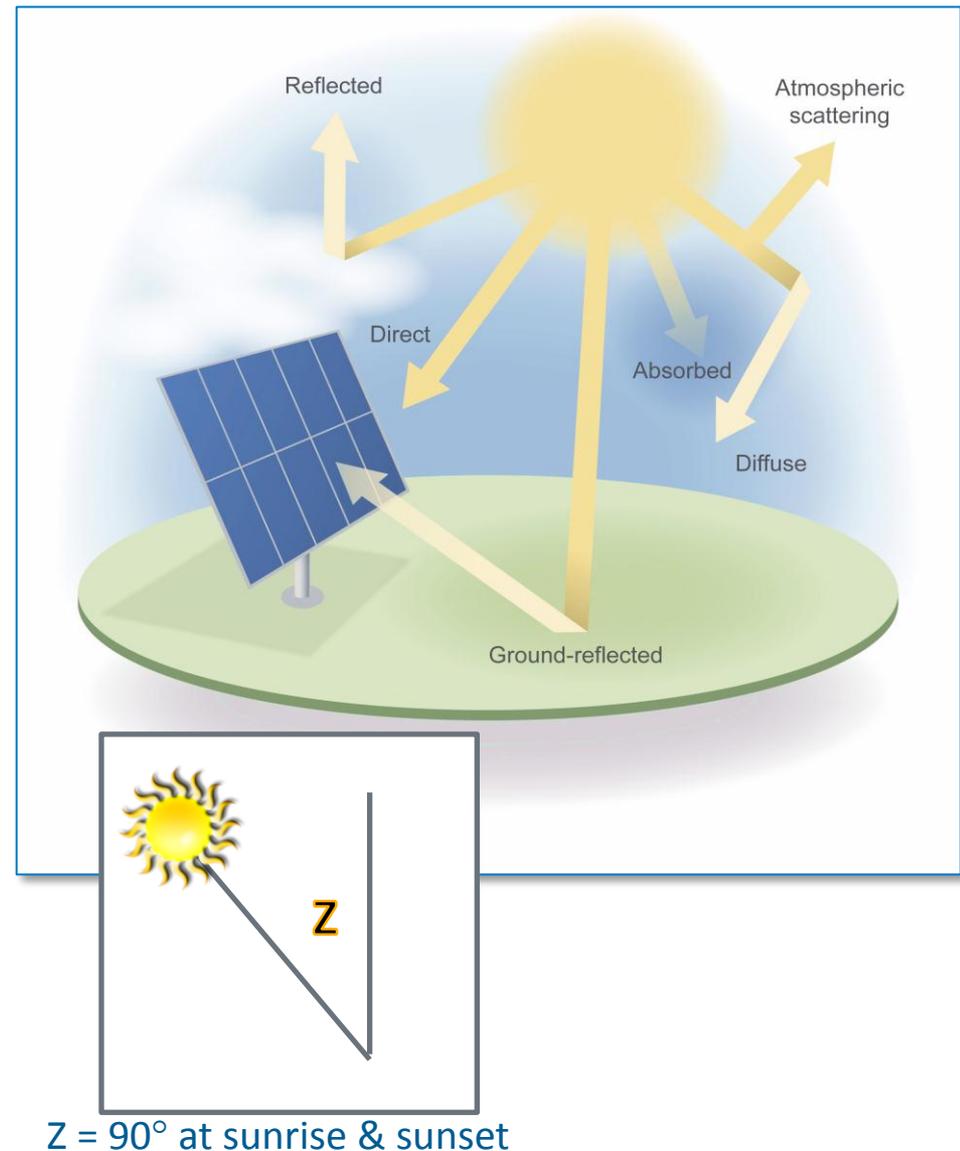
## Radiation from the sky dome

- **Directly** from the sun
- Everywhere **except** the sun
- **Entire** sky
- Available to **PV Module/Array**

## We call it

- Direct Normal Irradiance (DNI)  
*Beam*
- Diffuse Horizontal Irradiance (DHI)  
*Sky*
- Global Horizontal Irradiance (GHI)  
*Total Hemispheric*
- Plane-of-Array (POA)

$$\text{GHI} = \text{DNI} * \text{Cos} (Z) + \text{DHI}$$



## Key Concepts:

**Uncertainty** estimates require a **reference**

**Model** performance is limited by the *uncertainty* of the **measurements** used for development and validation

**Uncertainty** varies with **location** and **time-scale**



# Uncertainty with Respect to a Reference

Standard for the *Watt per square meter*

World Radiometric Reference (WRR)

**Uncertainty:  $\pm 0.3\%$  for  $\text{DNI} \geq 700 \text{ W/m}^2$**

World Standard Group



NREL Standards



NREL Broadband Outdoor Radiometer Calibrations



# Instrumentation

## Present Day

### Direct Normal

Measured by a *Pyrheliometer* on a sun-following tracker



### Global Horizontal

Measured by a *Pyranometer* with a horizontal sensor



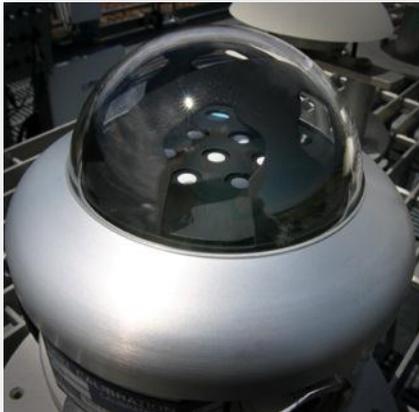
### Diffuse

Measured by a shaded *Pyranometer* under a tracking ball



$DNI = (GHI + DHI) / \cos(Z)$   
Single Instrument

Measure 2 of 3 components by  
*Internally Shaded Sensors*  
or a *Rotating Shadowband Radiometer*

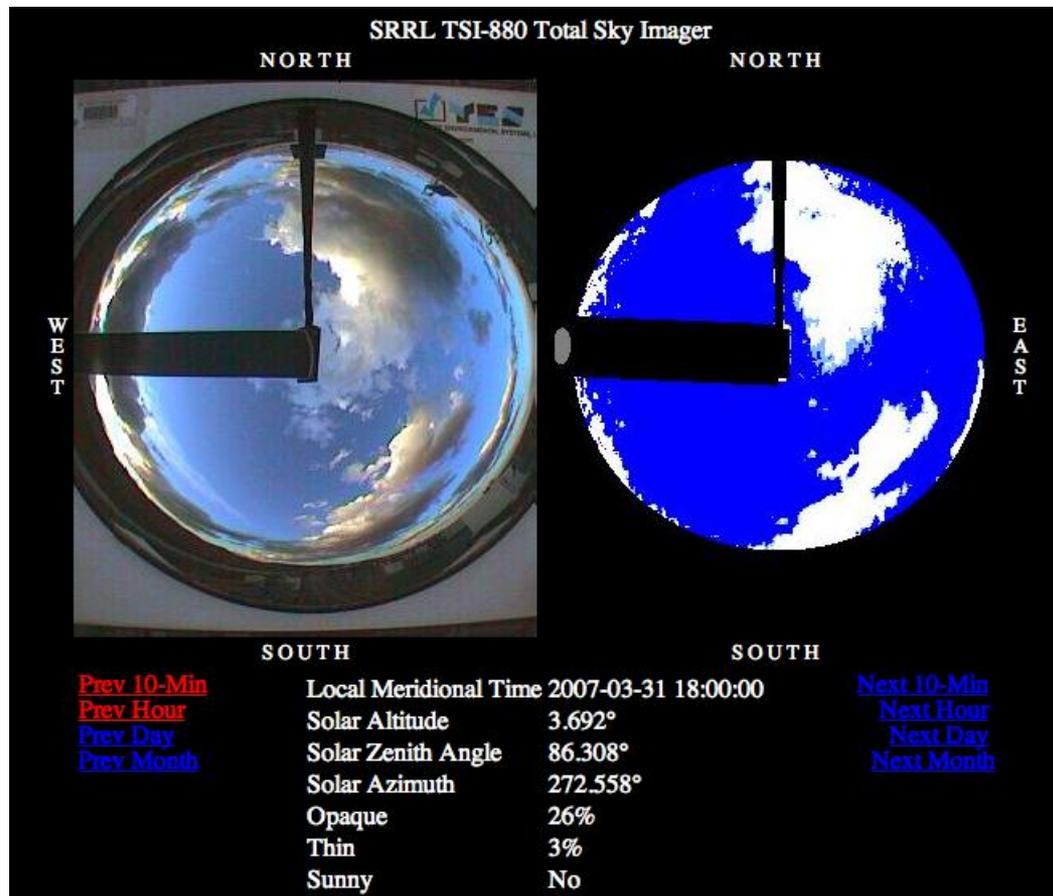


# Surface Observations of Clouds



[http://www.nrel.gov/midc/srri\\_bms](http://www.nrel.gov/midc/srri_bms)

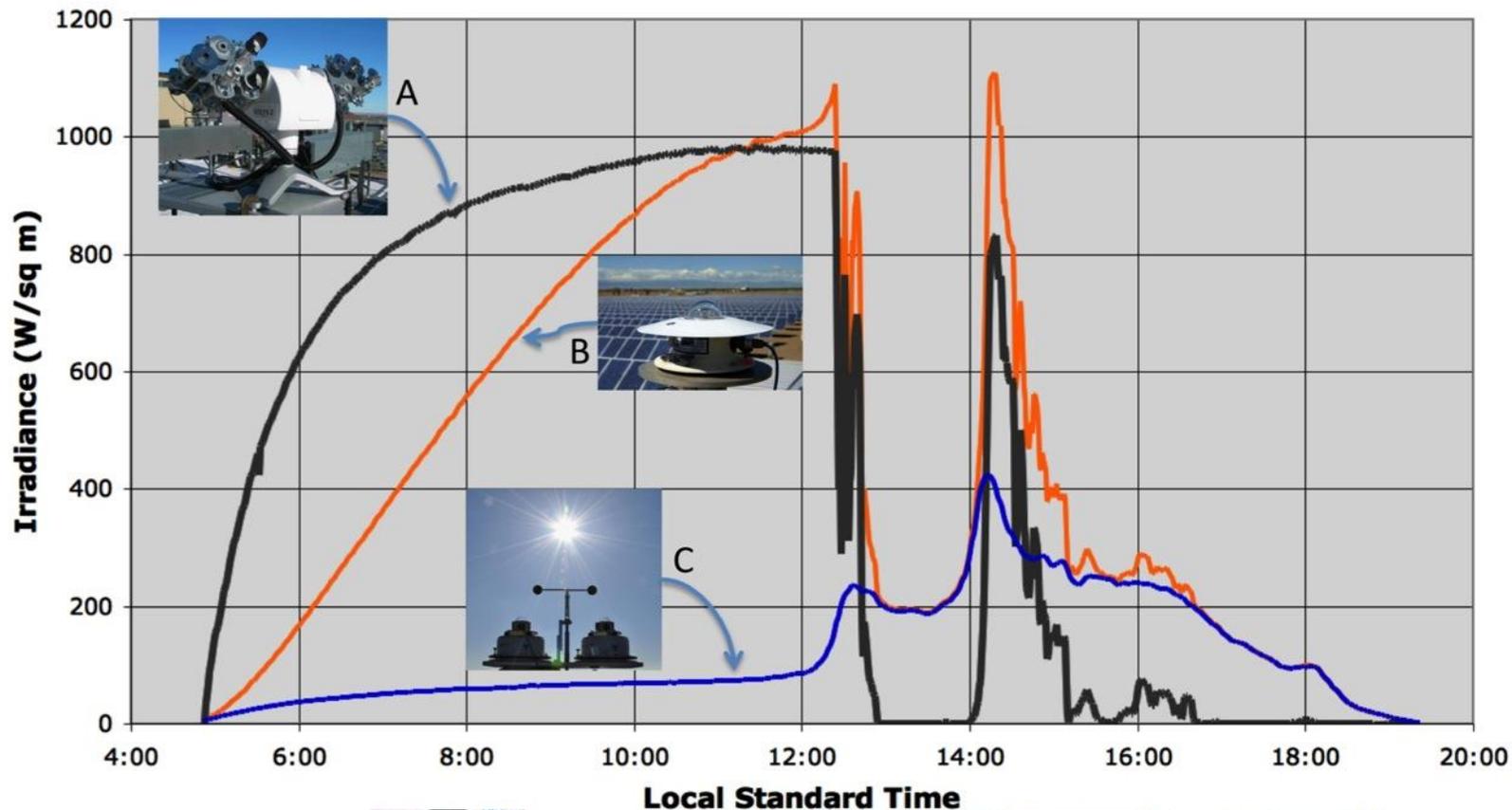
## Sky Imaging



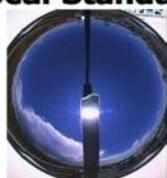
National Weather Service used trained observers from 1930's to mid-1990's to report cloud amounts & types by layer before today's automation

# Clear – Partly Cloudy – Overcast

1-minute



Sky Images:



A: DNI – Pyrheliometers

B: GHI – Pyranometer

C: DHI – Shaded Pyranometers

# Radiometers: Searching for *Cheap, Fast, & Accurate*

## *Pyrheliometers – DNI\**

**\$3,000 to \$35,000**  
**0.1 to 1 sec for 1/e**  
**±0.5% to ± 3%**



CPV



Model CH1 © 2006 Kipp & Zonen

**CHP1**  
**Kipp & Zonen**



**MS-56**  
**EKO Instruments**

## **Absolute Cavity Radiometers**

**Model AHF (upper)**

**The Eppley Laboratory, Inc.**

**Model PMO6 (lower)**

**World Radiation Center**



**DR01**  
**Hukseflux Thermal Sensors**



**Normal Incidence Pyrhelioscope (NIP)**  
**The Eppley Laboratory, Inc.**

\* Michalsky, J. et al., An Extensive Comparison of Commercial Pyrhelioscopes under a Wide Range of Routine Observing Conditions  
Journal of Atmospheric and Oceanic Technology, Vol 28, pp. 752-766

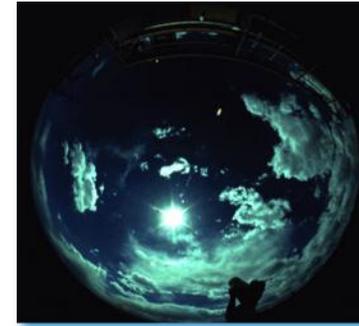
# Radiometers: *Cheap, Fast, & Accurate*

## *Pyranometer\* – GHI, DHI, POA*



*Pyranometers with Ventilators*

\* Wilcox & Myers (2008) *Evaluation of Radiometers in Full-Time Use at the National Renewable Energy Laboratory Solar Radiation Research Laboratory*  
[www.nrel.gov/docs/fy09osti/44627.pdf](http://www.nrel.gov/docs/fy09osti/44627.pdf)



*Fish-Eye Field of View*

**\$200 to \$7,000**  
**10  $\mu$ s to 5 sec**  
 **$\pm$  4% to  $\pm$  8+%**

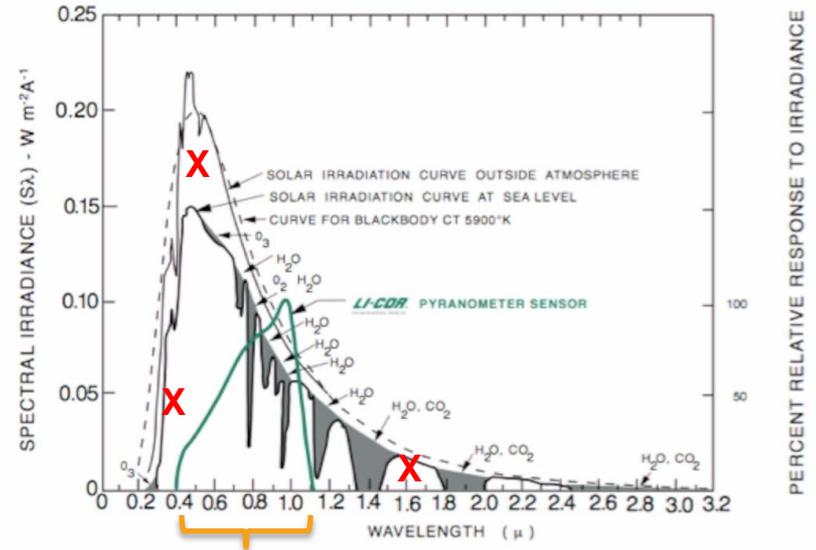
# Photoelectric Detectors

**\$200 to \$500**  
**10  $\mu$ sec for 95%**  
 **$\pm 5\%$  to  $\pm 8\%$**   
 (Sub-hourly)

## Cheap-Fast-Reduced Spectral Response



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



Typical photodiode detector (left) and spectral response of LI-COR pyranometer (right).



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



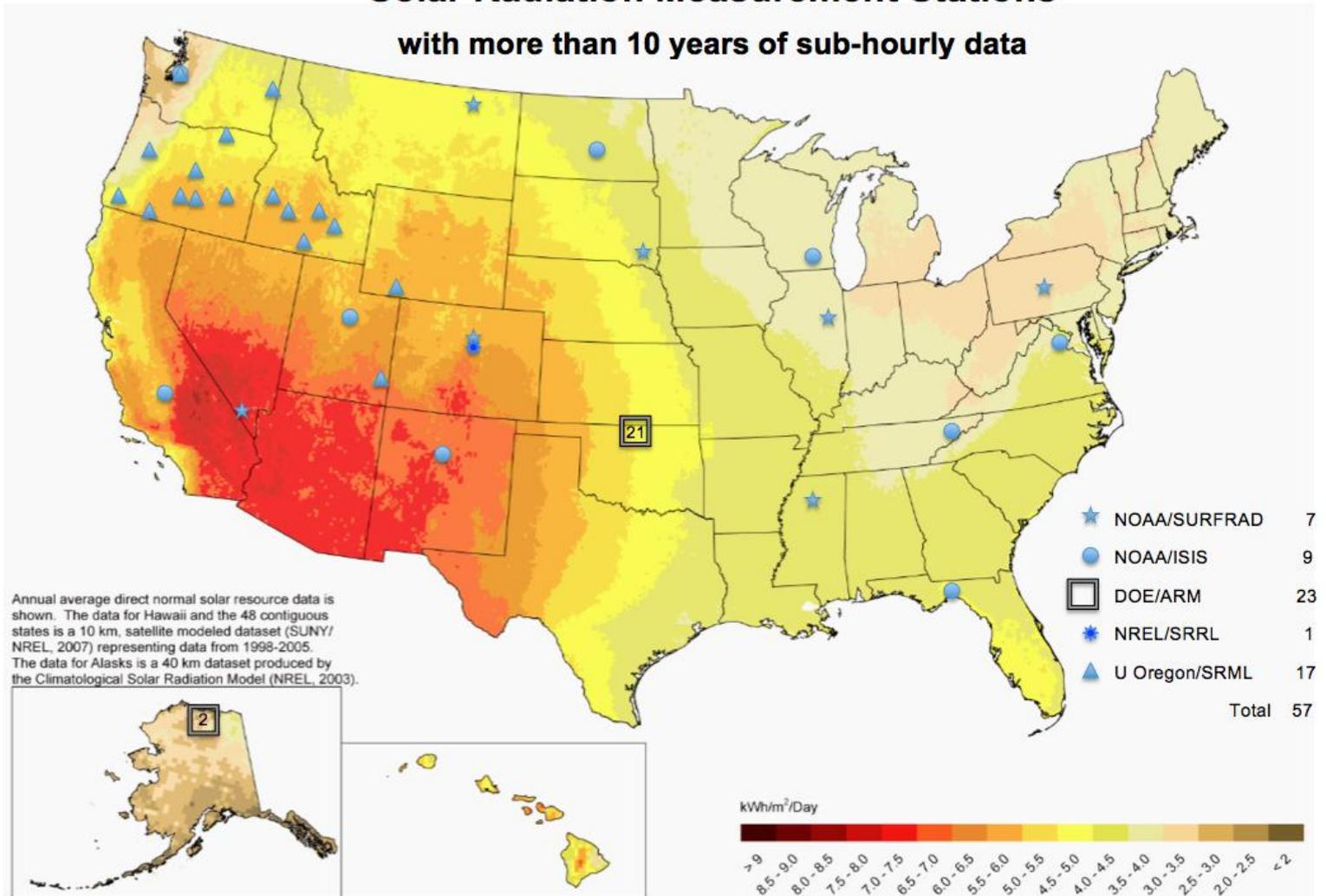
[eko-eu.com](http://eko-eu.com)



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

# Solar Measurement Stations

## Solar Radiation Measurement Stations with more than 10 years of sub-hourly data



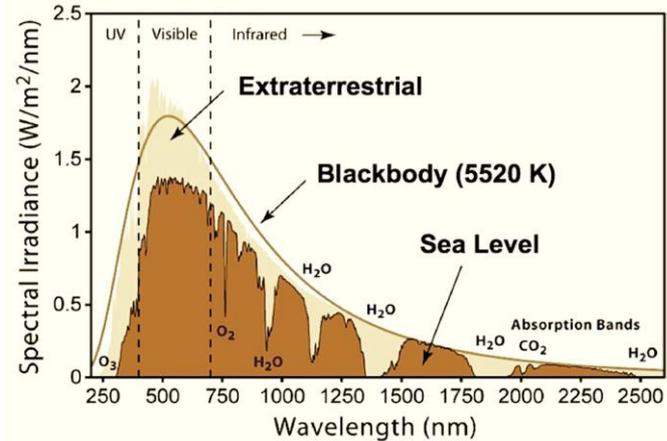
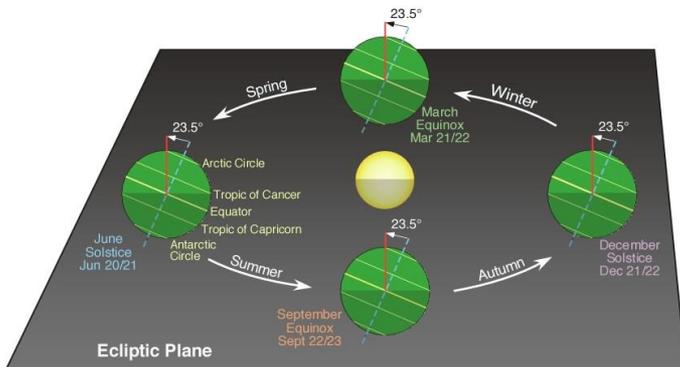
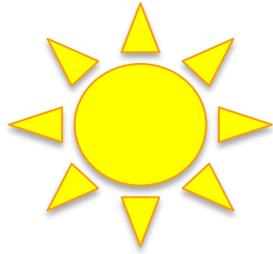
T Stoffel 5/12/2012



# Modeling Solar Radiation

## Step 1. Top of Atmosphere

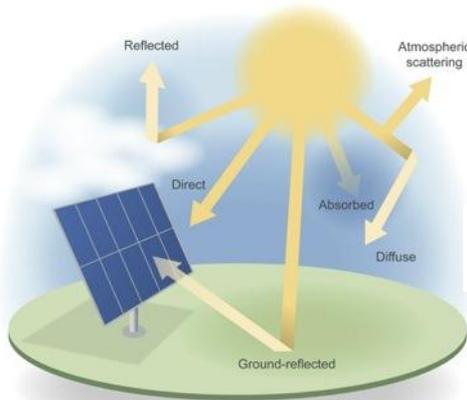
Total Solar Irradiance (TSI):  $1366 \pm 7 \text{ W/m}^2$



Sun-earth distance:  $\sim 3\%$  less TSI in summer

## Step 2. Through a Clear-Sky Atmosphere

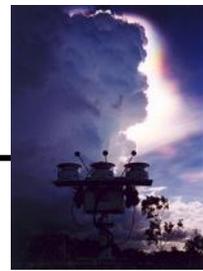
Absorbing & Scattering:  
Gases, water vapor, **aerosols**



## Step 3. Effects of Clouds

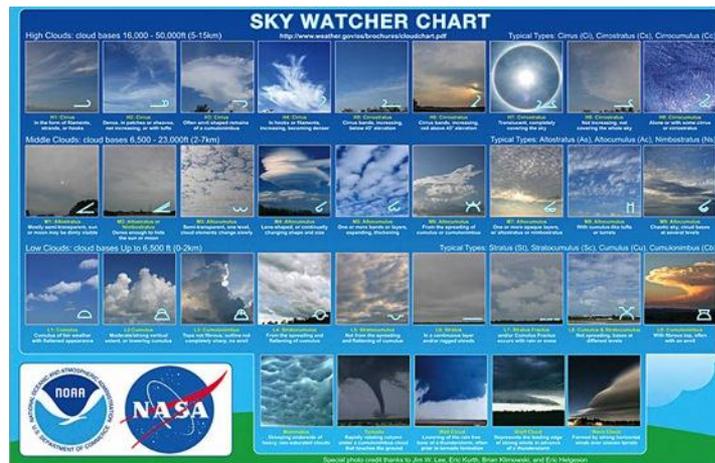
- Empirical Relationships – Cloud Index
- Physical Properties – Radiative Transfer

# Ground-Based Models for Point Data



## 1930's to 1990's Human Observers

- Amount (tenths)  
Total  
Opaque
- Types
- Layers



## National Solar Radiation Database (NSRDB)

*METSTAT* Model

Evaluation:\*

31 stations  
1999-2000

## 1990's - Present Automated Surface Observing System (ASOS)

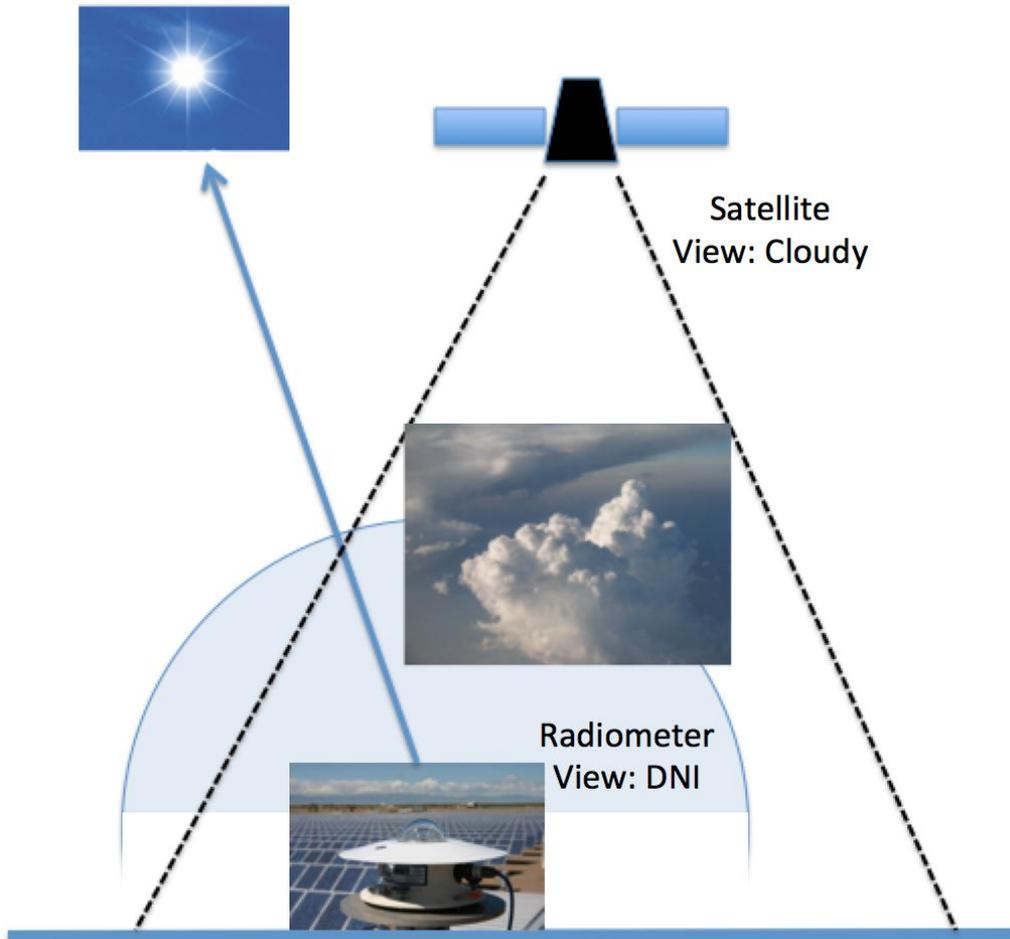
- Amount (oktas)
- Total < 12,000 ft



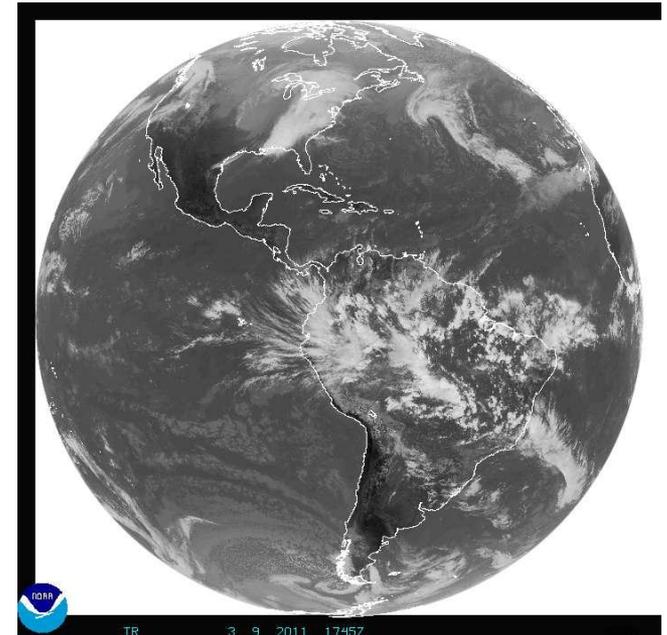
	GHI		DNI	
	MBE	RMSE	MBE	RMSE
Hourly (W/m <sup>2</sup> )	±50	100	-100 to +150	200
Monthly Mean Daily Total	-13% to +15%	2 to 22%	-32% to +16%	7% to 36%

\*Myers, D., Wilcox, S.; Marion, W.; George, R.; Anderberg, M. (2005). "Broadband Model Performance for an Updated National Solar Radiation Database in the United States of America." Proc. Solar World Congress, International Solar Energy Society, 2005.

# Satellite-Based Models for Gridded Data



GOES E/W pixel = 1 km @ 30-minute snapshots



Geostationary Operational Environmental Satellite (GOES)

Estimates of GHI and DNI are comparable to ground-based Meteorological models (Myers et al. 2005)

# National Solar Radiation Database (NSRDB)

## Solar Resource Data Evolution

1952-1975 SOLMET (1)  
ERDA/SERI, NOAA, 1979

TMY

(1)  
38 *Measurement*  
Stations  
1977-80



1961-1990 NSRDB (2)  
DOE/NREL, NOAA, 1994

TMY2

(2)  
239 *Modeled*  
Locations  
1961-1990



1991-2005 NSRDB (3)  
DOE/NREL, NOAA, 2007

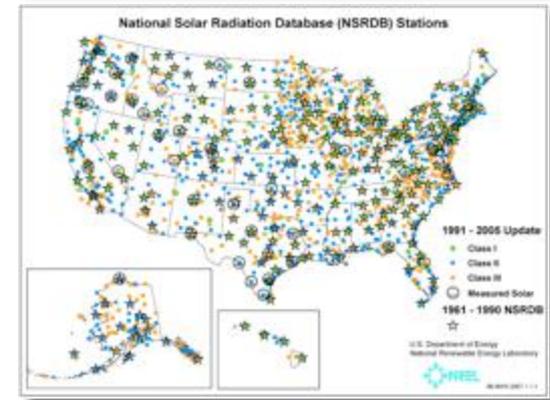
TMY3

2005-2010 NSRDB (4)  
DOE/NREL, NOAA, 2012

(3,4)  
10 km x 10 km  
*Modeled*  
1998-2010



(3,4)  
1,454 *Modeled*  
Locations  
1991-2010



# NSRDB Classifications and Uncertainty Levels\*

To increase the number of sites for 1961-1990 from **239** to **1,454** for 1991-2010

Based on model *input data* availability:

- **Class I** – All hours 1991-2010 (242 sites)
- **Class II** – Significant periods of interpolated, filled or otherwise lower-quality\*\* input data (618 sites)
- **Class III** – At least 3 years of continuous input data (594 sites)

- Wilcox, S. (2012) *National Solar Radiation Database Update 1991-2010: User's Manual*, NREL/TP-5500-54824, 479pp. [www.nrel.gov/publications](http://www.nrel.gov/publications)

\*\* Generally a result of ASOS – automated – cloud cover data.

# NSRDB 1991-2010 Uncertainty Estimates

Hourly uncertainties for modeled data range from 8% under optimal conditions to more than 25% for less-than-optimal input data.\*

Meteorological (METSTAT) and Satellite-based (SUNY) Model Uncertainties - Hourly

Model	Uncertainty Source	GHI or DHI	DNI
METSTAT	Optimum Basis	10	16
	Data Filling	8	8
	Cloud Derivation	4	4
	ASOS Data	22	22
	<b>RSS UNC</b>	<b>25.8</b>	<b>28.6</b>
SUNY	Optimum Basis	8	15
	Time Shifting	2	2
	Snow Cover	5	5
	<b>RSS UNC</b>	<b>9.6</b>	<b>15.9</b>



Conservative Estimates



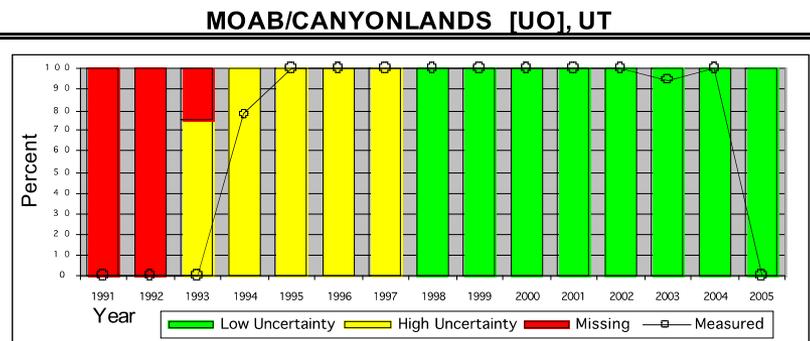
$$RSS\ UNC = (U_{opt}^2 + U_{add1}^2 + U_{add2}^2 \dots)^{1/2} (\pm\%)$$

\* Wilcox, S. (2012) National Solar Radiation Database Update 1991-2010: User's Manual, NREL/TP-5500-54824, 479pp.  
[www.nrel.gov/publications](http://www.nrel.gov/publications)

# NSRDB Uncertainties

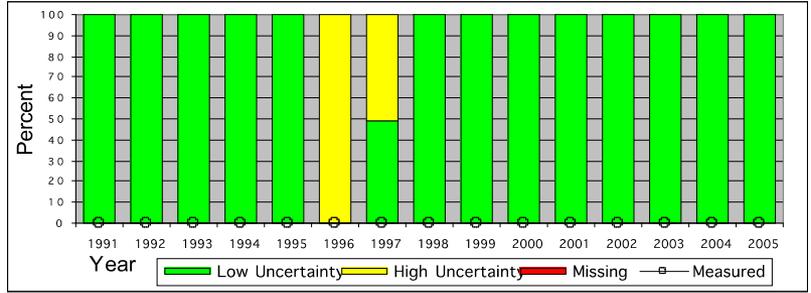
Data Quality Summaries are Available for All Sites

<b>724776</b>
Class III (with some measured)
Solar Coordinates
Latitude: 38.58°
Longitude: -109.54°
Elevation: 1000 m
Meteorological Coordinates
Latitude: 38.75°
Longitude: -109.75°
Elevation: 1388 m
Time Zone: -7

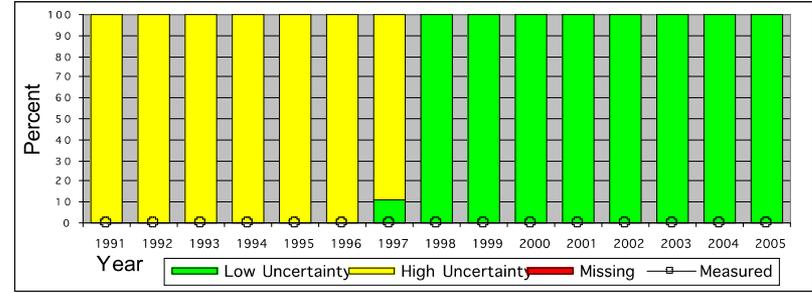


**Green:** Proportion of “low” uncertainty data  
**Yellow:** Proportion of “high” uncertainty data  
**Red:** Proportion of missing data  
**Black Line:** Percentage of measured data

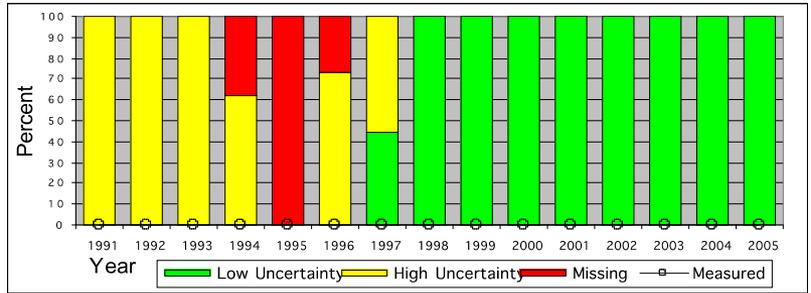
Typical Class I Site (Tucson, AZ)



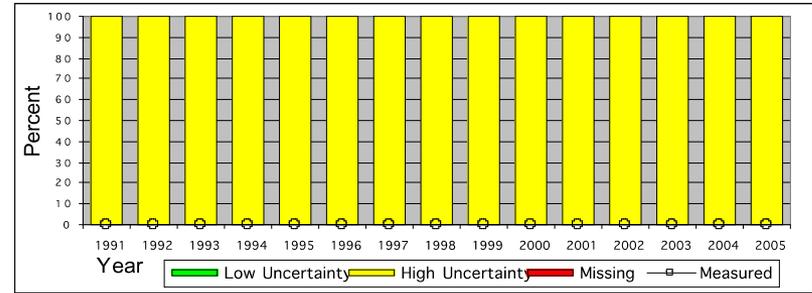
Typical Class II Site (Stillwater, OK)



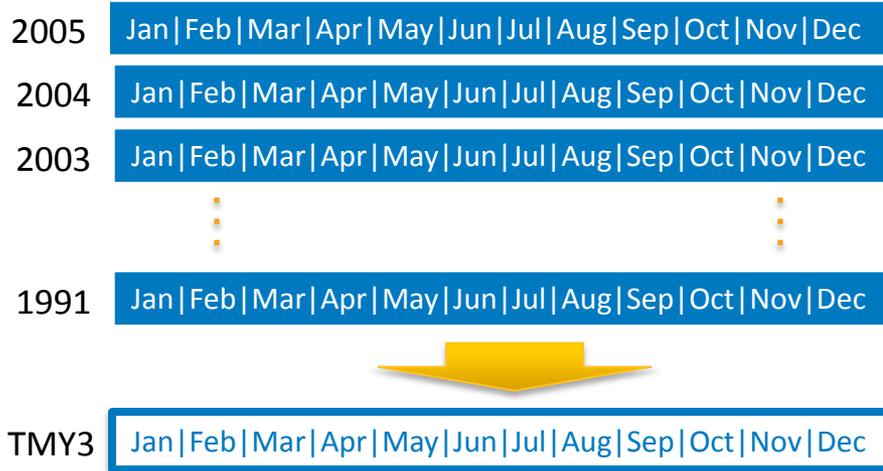
Typical Class III Site (Sandburg, CA)



Typical Alaska Site (Sand Point, AK)

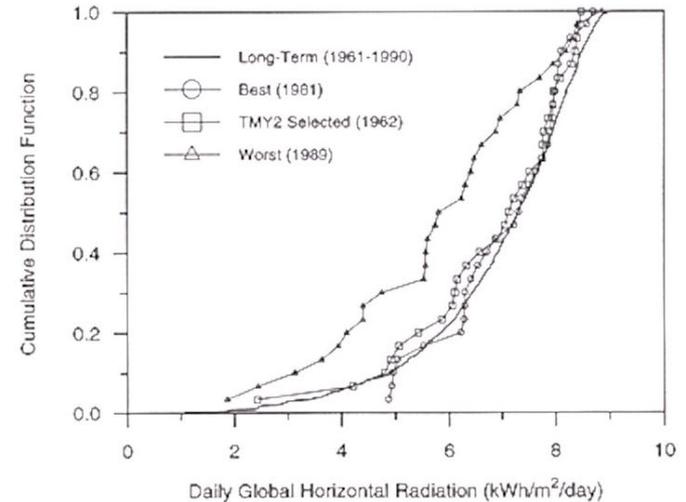


# Typical Meteorological Year (TMY3) Data



TMM Year 97 | 06 | 94 | 01 | 05 | 99 | 91 | 05 | 93 | 93 | 95 | 00

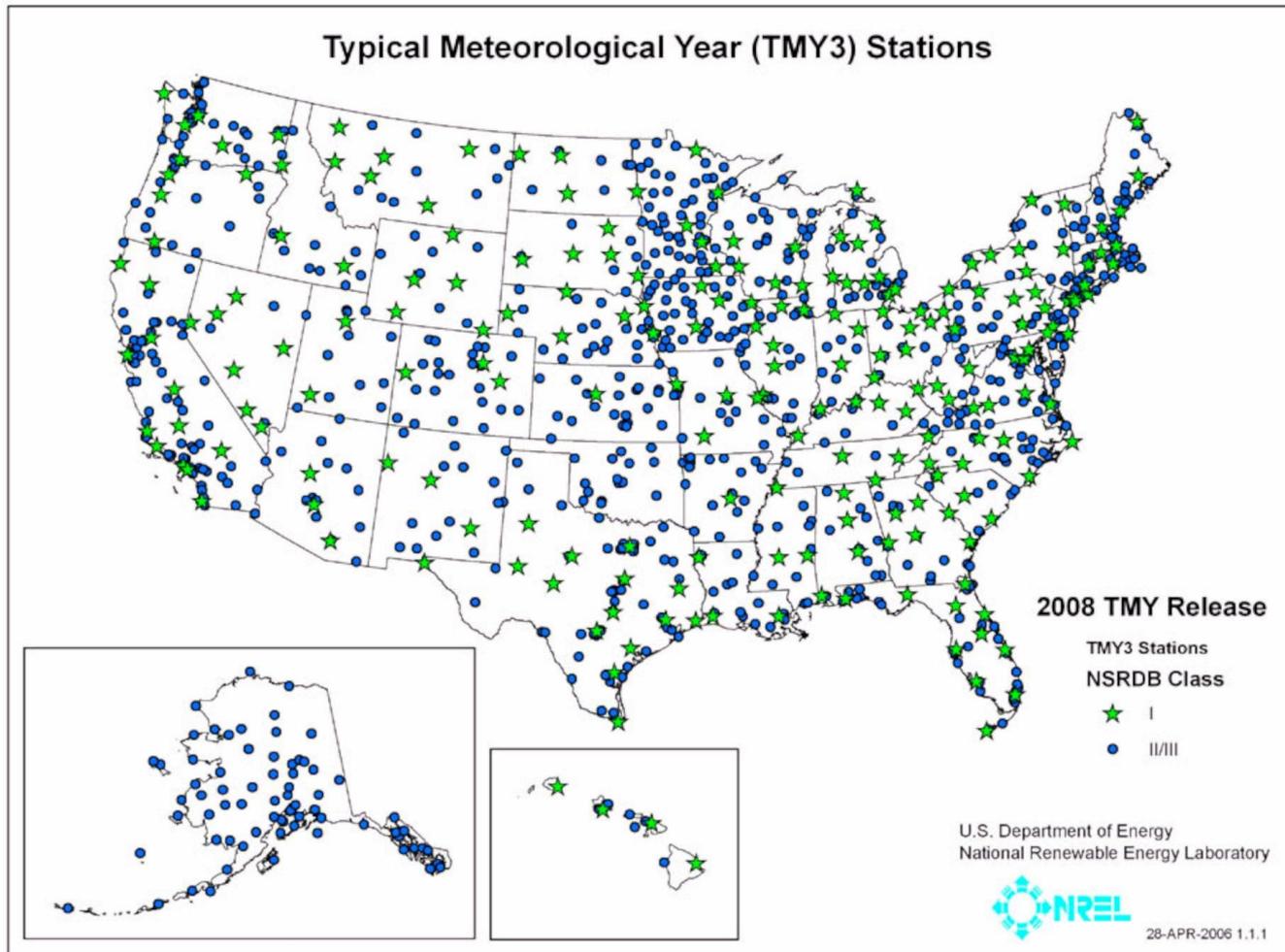
*Typical Meteorological Months (TMM)* of data are selected from the long term record using comparisons of Cumulative Distribution Functions (CDF) with Finkelstein-Schafer (FS) statistics of Weighted Scores\* (see table).



Index	NSRDB TMY
Max Dry Bulb Temp	1/20
Min Dry Bulb Temp	1/20
Mean Dry Bulb Temp	2/20
Max Dew Point Temp	1/20
Min Dew Point Temp	1/20
Mean Dew Point Temp	2/20
Max Wind Velocity	1/20
Mean Wind Velocity	1/20
Global Radiation	5/20
Direct Radiation	5/20

\*Hall, et al. (1978) Generation of Typical Meteorological Years for 26 SOLMET Stations, SAND78-1601

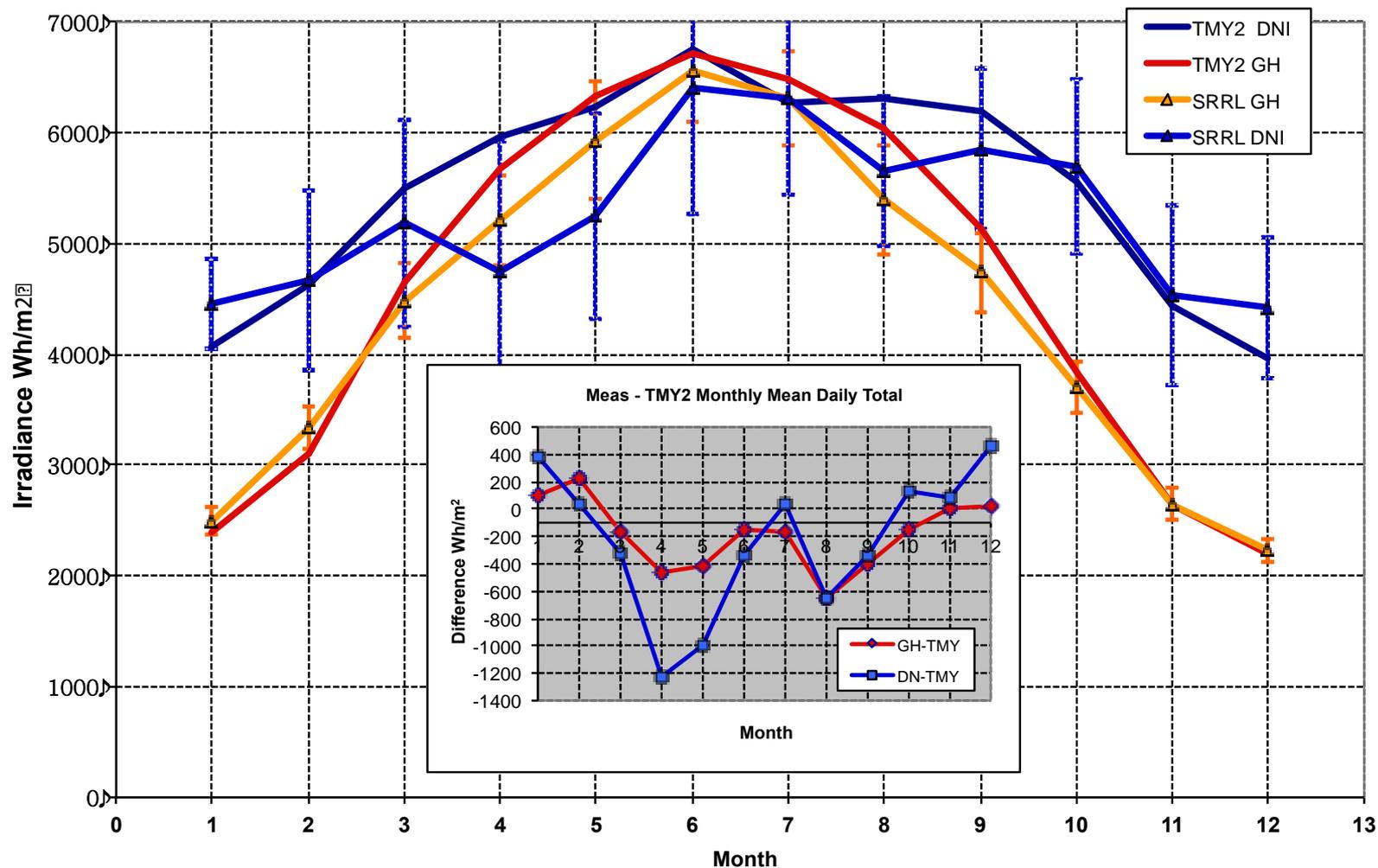
# TMY3 (1991-2005)



TMY3: 1,020 locations  
38 with measurements at times during 1991-2005

# How Typical for Golden, CO?

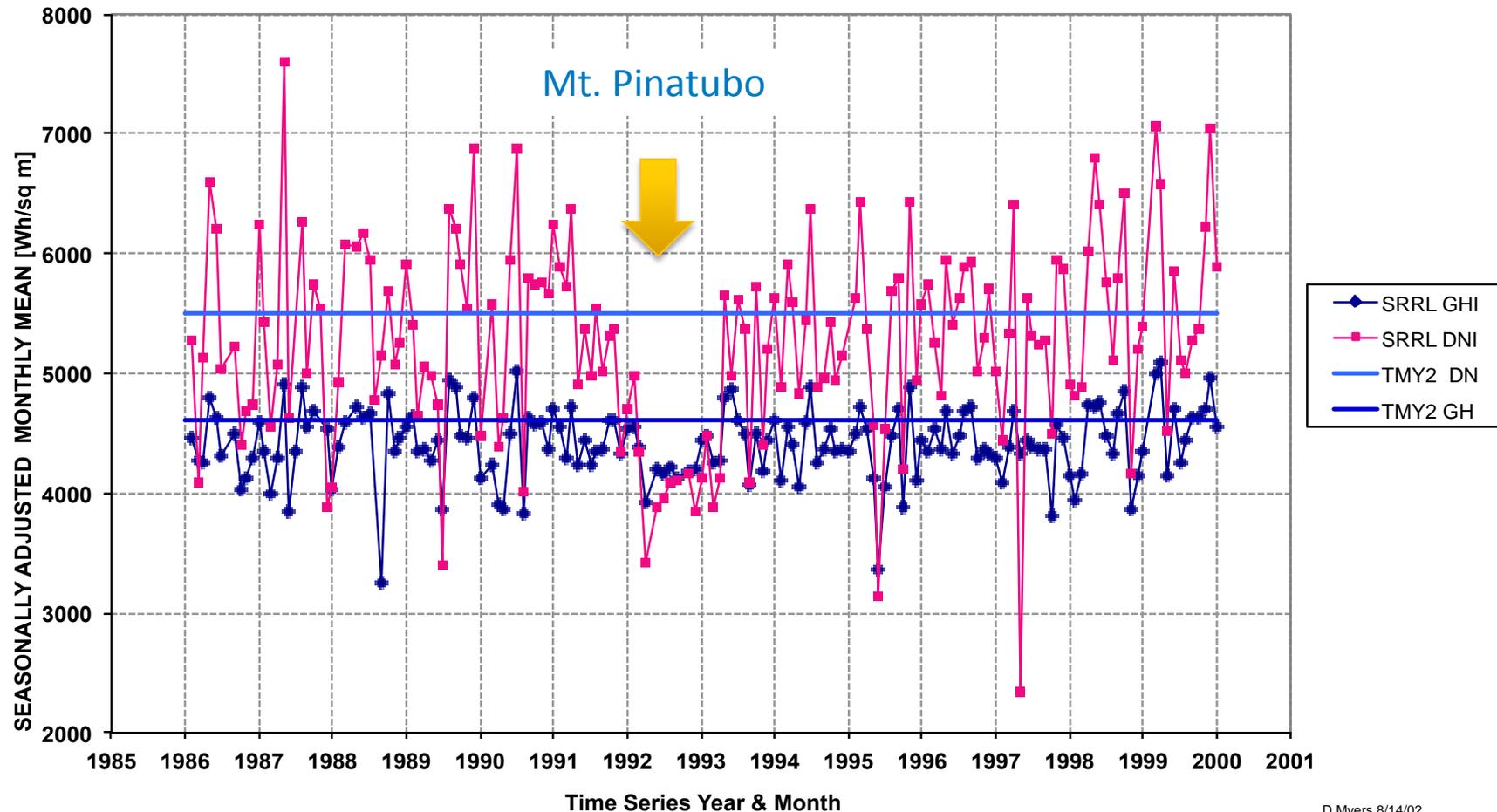
Monthly Mean Daily Totals BOULDER TMY2 vs SRRL 1986-2000 Data



D Myers 8/14/02

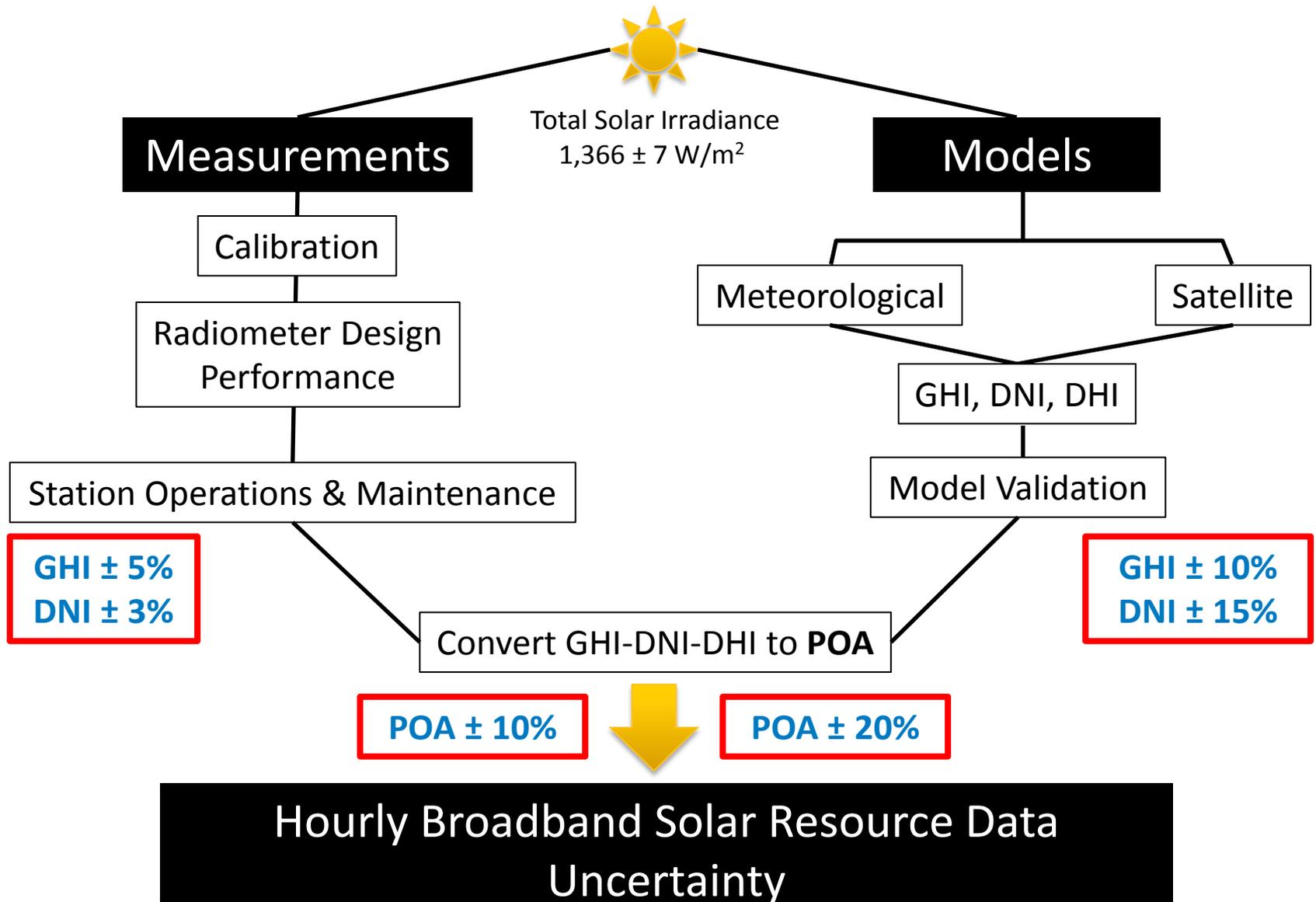
# How Typical for Golden, CO?

SEASONALLY ADJUSTED DIRECT and GLOBAL MONTHLY MEAN DAILY TOTALS  
Solar Radiation Research Laboratory 1986-2000  
Seasonal Index is MMDT / Avg [Monthly Mean/Annual Mean]



D Myers 8/14/02

# Getting to PV Performance Model Input Uncertainty



# Summary

- TMY data are intended for **performance comparisons** rather than system design
- TMY data products are based on **NSRDB**
- NSRDB 1991-2010 = Meteorological Model (1,454 sites) + Satellite Model (10 km x 10 km)
- TMY3 data available for **1,020 sites**
  - 38 have partial solar measurements
- **Uncertainty ( $U_{95}$ ) of GHI & DNI is site-dependent**
  - See NSRDB Data QA Tables
- **DNI  $U_{95} \cong 2 \times$  GHI  $U_{95}$**
- **POA  $U_{95} > U_{95}$  of DNI, GHI, DHI, and surface albedo**
- **Visit the Solar Prospector for more information**
  - [maps.nrel.gov/prospector](https://maps.nrel.gov/prospector)



# Solar Resources: References

## **Concentrating Solar Power: Best Practices Handbook for the Collection and Use of Solar Resource Data**

<http://www.nrel.gov/docs/fy10osti/47465.pdf> (PDF 7.5 MB)

## **Evaluation of Radiometers in Full-Time Use at the National Renewable Energy Laboratory Solar Radiation Research Laboratory**

<http://www.nrel.gov/docs/fy09osti/44627.pdf> (PDF 1.4 MB)

## **World Meteorological Organization's Commission for Instruments and Methods of Observation (CIMO) Guide**

<http://www.wmo.int/pages/prog/www/IMOP/CIMO-Guide.html>

## **U.S. Department of Energy Workshop Report: Solar Resources and Forecasting**

<http://www.nrel.gov/docs/fy12osti/55432.pdf> (PDF 5.0 MB)

## **Baseline Surface Radiation Network (BSRN). Operations Manual Version 2.1**

WCRP-121, WMO/TD-No. 1274 [McArthur L.J.B. 2005]

<http://www.bsrn.awi.de/en/other/publications/>

**Guide to the Expression of Uncertainty in Measurement.** Working Group 1 of the Joint Committee for Guides in Metrology. JCGM/WG 1 (2008). *Available on line at*

[http://www.bipm.org/utils/common/documents/jcgm/JCGM\\_100\\_2008\\_E.pdf](http://www.bipm.org/utils/common/documents/jcgm/JCGM_100_2008_E.pdf)

# Solar Resources: References

Hall, I., Prairie, R., Anderson, H., and Boes, E. (1978) Generation of Typical Meteorological Years for 26 SOLMET Stations, SAND78-1601, Sandia National Laboratories, Albuquerque, NM 87185.

Wilcox, S. M. (2012). National Solar Radiation Database 1991-2010 Update: User's Manual. 479 pp.; NREL Report No. TP-5500-54824\*.

Wilcox, S.; Marion, W. (2008). Users Manual for TMY3 Data Sets (Revised). 58 pp.; NREL Report No. TP-581-43156\*.

Perez R., P. Ineichen, K. Moore, M. Kmiecik, C. Chain, R. George and F. Vignola, (2002): A New Operational Satellite-to-Irradiance Model. Solar Energy 73, 5, pp. 307-317\*\*.

Perez, R. and R. Stewart, 1986. Solar Irradiance Conversion Models. Solar Cells, 18, pp. 213-223.

Perez, R., R. Seals, P. Ineichen, R. Stewart, D. Menicucci, 1987. A New Simplified Version of the Perez Diffuse Irradiance Model for Tilted Surfaces. Description Performance Validation. Solar Energy, 39, pp. 221-232.

\* Available from [www.nrel.gov/publications](http://www.nrel.gov/publications)

\*\* Available from [www.asrc.cestm.albany.edu/perez/directory/ResourceAssessment.html](http://www.asrc.cestm.albany.edu/perez/directory/ResourceAssessment.html)

# Solar Resources: References

## **Solar and Infrared Radiation Measurements**

A book by Frank Vignola, Joseph Michalsky, and Thomas Stoffel published by CRC Press as part of the Energy and the Environment Series (Abbas Ghassemi, Editor).

394 pages. ISBN 978-1-4398-5189-0      Catalog Number K12386

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

## **Solar Radiation, Practical Modeling for Renewable Energy Applications**

A book by Daryl R. Myers published by CRC Press as part of the Energy and the Environment Series (Abbas Ghassemi, Editor). 182 pages.

ISBN 978-1-4665-0294-9      Catalog Number K14452

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

[Backup Slides Follow...](#)

# How do we measure/model solar radiation?

**Ground based instruments** (radiometers, pyrhemimeters, pyranometers)

**Advantages:** accurate, high temporal resolution.

**Disadvantages:** local coverage, regular maintenance and calibration.

**Satellite based models** (geostationary, polar orbiters)

**Advantages:** global coverage, reasonably long time series,

**Disadvantages:** spatial and temporal resolution, complicated retrieval process, accuracy depends on information content of satellite channels.

**Numerical models** (global, regional, mesoscale)

**Advantages:** global coverage, long time series (reanalysis data), increasing computing capability results in increasing resolution.

**Disadvantages:** level of accuracy especially in cloud formation and dissipation (initialization and model physics issues).

**NOTE:** Methods that combine all 3 will ultimately provide the best solutions.

# Present Assessment of Measurements<sup>1</sup>

Uncertainty Source	Thermopile pyranometer	Semiconductor pyranometer	Thermopile pyrhelimeter	Semiconductor pyrhelimeter
Calibration <sup>a</sup>	3%	5%	2%	3%
Zenith response <sup>b</sup>	2%	2%	0.5%	1%
Azimuth response	1%	1%	0%	0%
Spectral response	1%	5%	1.5%	8%
Tilt <sup>c</sup>	0.2%	0.2%	0%	0%
Nonlinearity	0.5%	1%	0.5%	1%
Temperature response	1%	1%	1%	1%
Aging per year	0.2%	0.5%	0.1%	0.5%
Total U = Sum	8.9%	15.7%	5.6%	14.5%
Total U = RSS	4.1%	8.0%	2.7%	8.9%

*Assumes Perfect Installation, Operations, & Maintenance*

Clear Sky  
~5 sec Data  
Thermopile Radiometers:

**DNI ± 2.7%**  
**GHI ± 4.1%**

<sup>a</sup> Includes zenith angle response from 30° to 60°

<sup>b</sup> Includes zenith angle response from 0° to 30° and 60° to 90°

<sup>c</sup> This uncertainty is set to zero for un-tilted radiometers

<sup>1</sup> Reda, I., "Method to Calculate Uncertainties in Measuring Shortwave Solar Irradiance Using Thermopile and Semiconductor Solar Radiometers." NREL/TP-3B10-52194, July 2011.

# Broadband Outdoor Radiometer Comparisons (BORCAL)

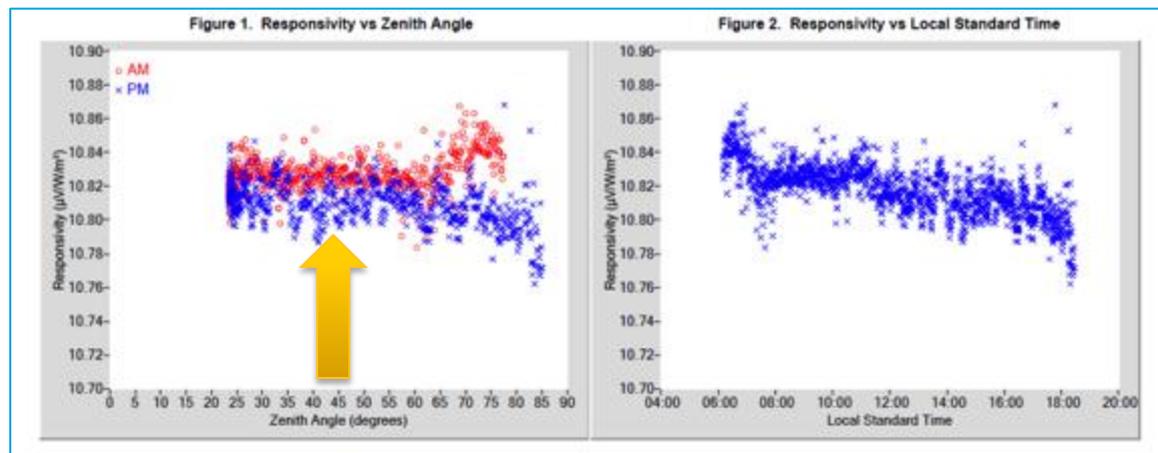
Manufacturer  
Provides a single  
Calibration Factor  
~45° SZA

Calibration Factors  
Vary with solar position  
(time of day)...

No two radiometers  
are alike...

## DNI - Kipp & Zonen CH1 Pyrheliometer

Calibration Factor

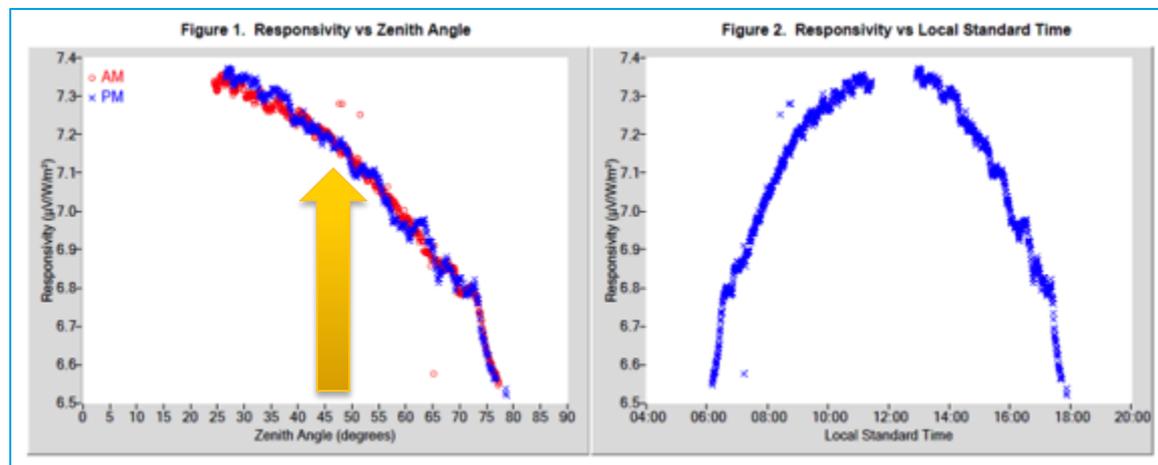


Solar Zenith Angle

Standard Time

## POA, GHI, DHI - Eppley PSP Pyranometer

Calibration Factor

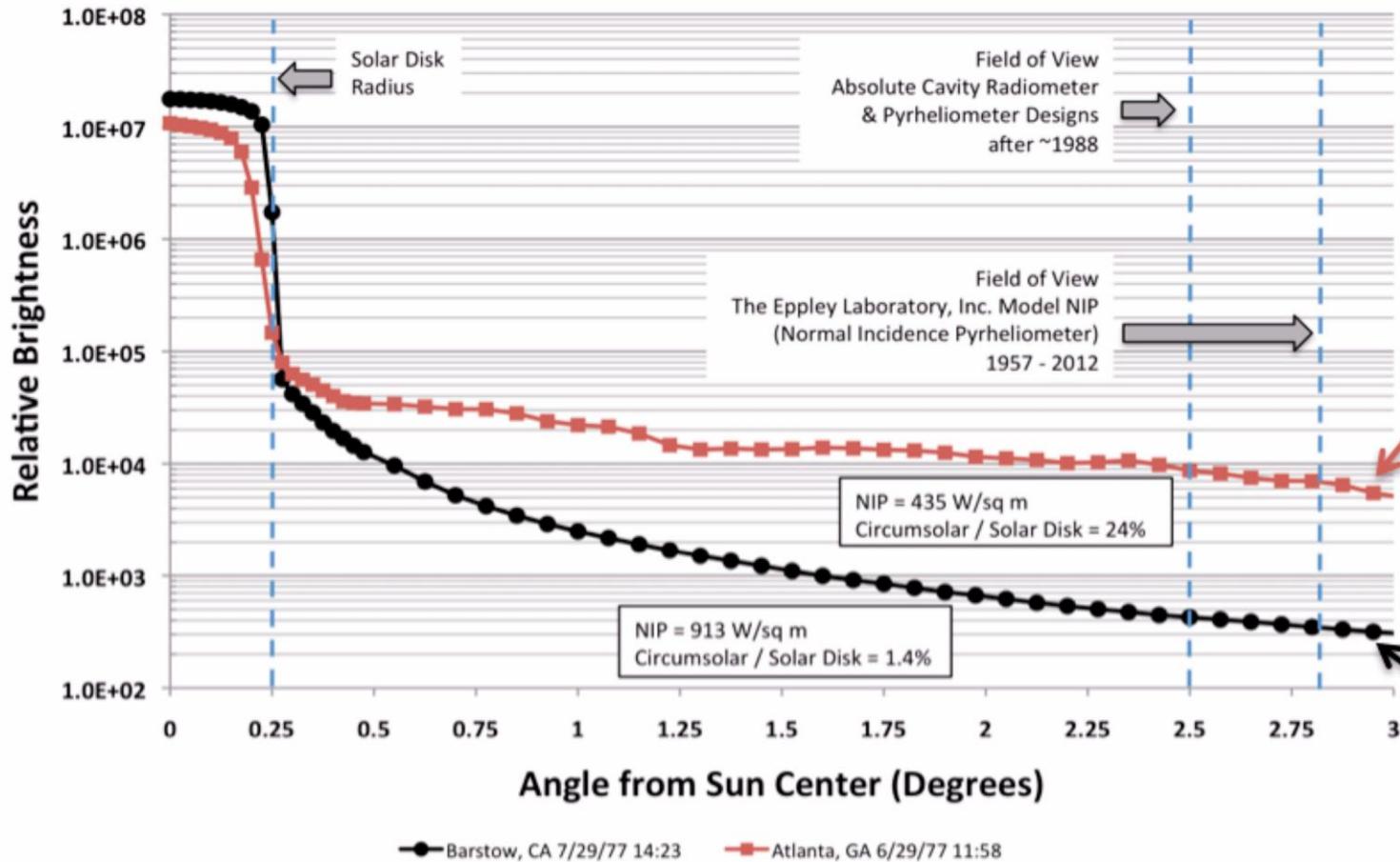


Solar Zenith Angle

Standard Time

# Circumsolar Radiation

## Circumsolar Telescope Measurements

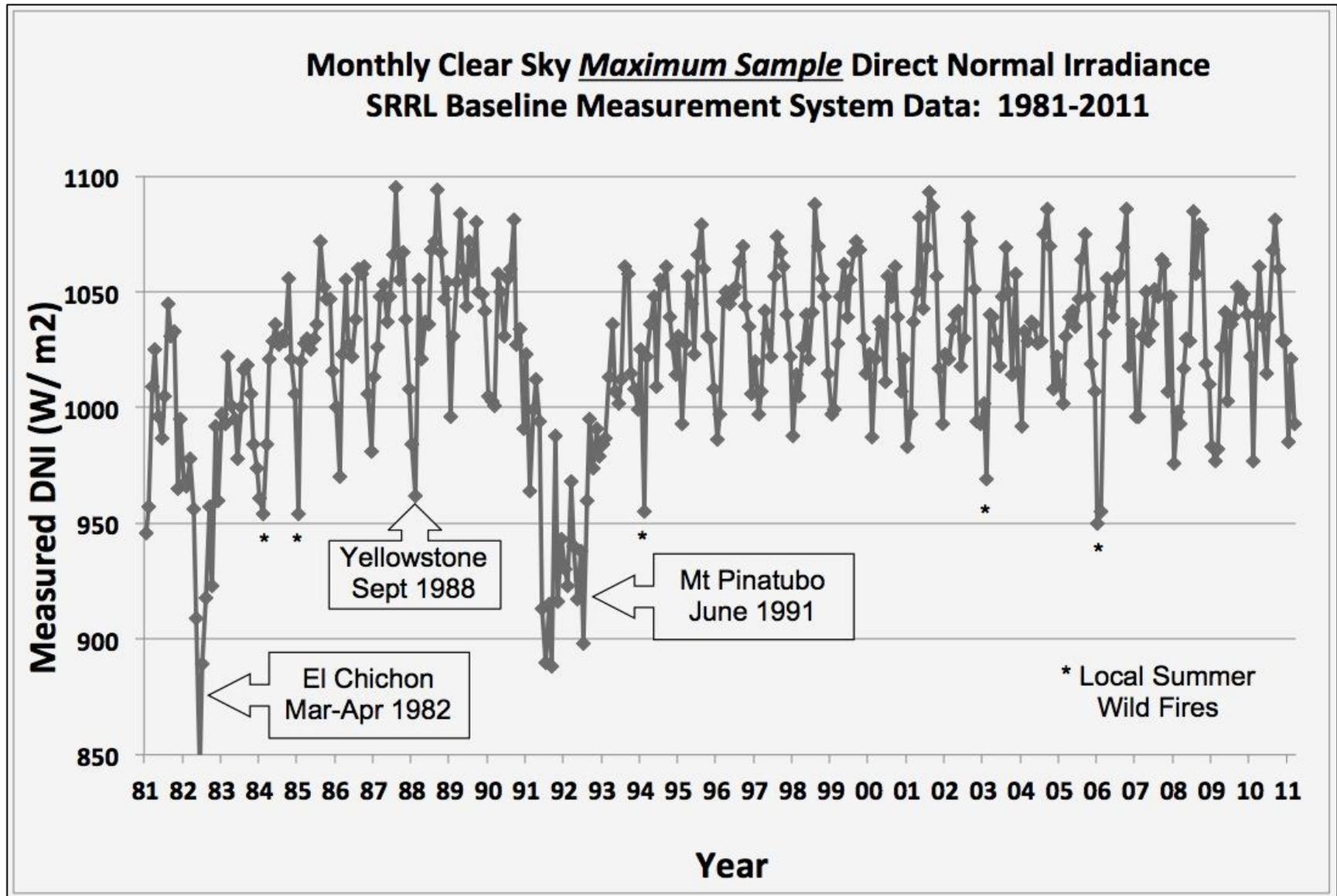


High DHI/GHI



Low DHI/GHI

# Accurate and Long-Term Measurements



# What impacts surface radiation

- **First order:**

- **(a) Clouds (Ice and water droplets)**

- Scatter solar radiation
- Ice clouds are more forward scattering than water clouds.
- Smaller droplets scatter more.

- **(b) Aerosols (mineral dust, soot etc.)**

- Most impact in clear sky situations.
- Absorb and scatter solar radiation (depends on aerosol type)

- **Second order:**

- **(a) water vapor and ozone**

- Absorb solar radiation.
- Elevation associated molecular scattering

- **(b) 3-dimensional clouds effects**

- **Cloud edge scattering with enhancement in surface radiation**

# How do satellites model surface radiation?

## • Empirical Approach:

- Build model relating satellite observations and ground measurements of solar irradiance.
- Use those models to obtain solar radiation at the surface from satellite observations of scene “brightness”.

## • Semi-Empirical Approach:

- Retrieve “cloud index” from visible radiance channel of satellite.
- Use clear-sky radiative transfer models and scale by cloud index.

## • Physical Approach:

- Retrieve cloud properties and aerosol information from multi-channel observations from satellites.
- Use the information in a radiative transfer model to compute surface irradiances.