

# Geographic smoothing of solar PV: Results from Gujarat

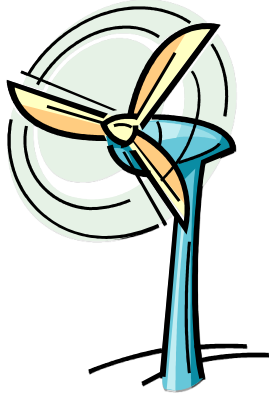


AMS 2016

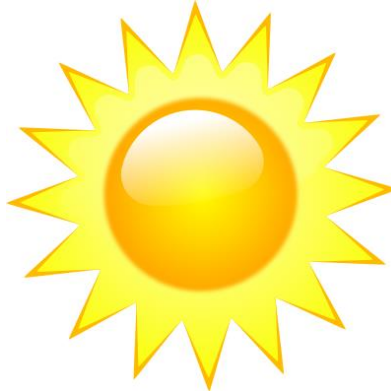
Kelly Klima, Jay Apt

**Many forms of renewable energy exist.  
Some are variable, requiring smoothing.**

Wind



Solar



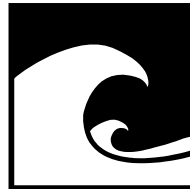
Biomass



Geothermal



Wave



Hydropower



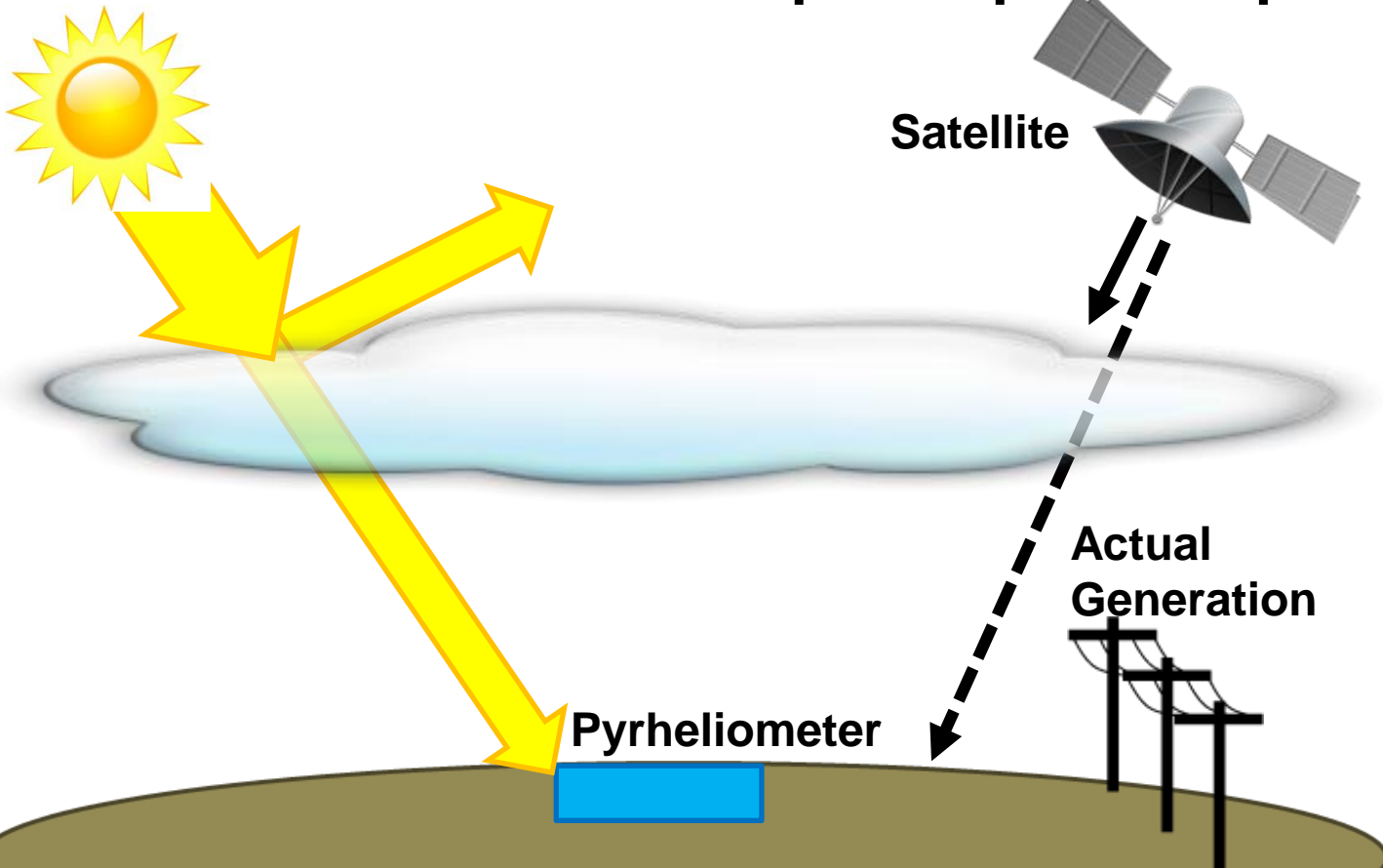


# Can solar PV be smoothed?

- Examining Irradiance Data
  - Correlation measured at two locations decreases as the distance between the sites increases. **Long & Ackerman, 1995; Barnett et al., 1998; Lave & Kleissl, 2010, Hinkleman 2013.; Argonne National Labs 2013 etc.**
  - Changes in clear sky index for 23 locations show smoothing is likely for as few as 5 plants. **LBNL 2010.**
- Examining Generation Data
  - In Germany, 5-min ramps in normalized PV power may exceed +/- 50% for 1 plant but never exceed +/- 5% for 100 PV sites. **Wiemken et al., 2001.**
  - Correlation of real power output for three sites in Arizona is high, suggesting smoothing might not work here. **Curtright & Apt, 2008.**
  - Sites at hourly resolution show smoothing. **Rowlands 2014.**

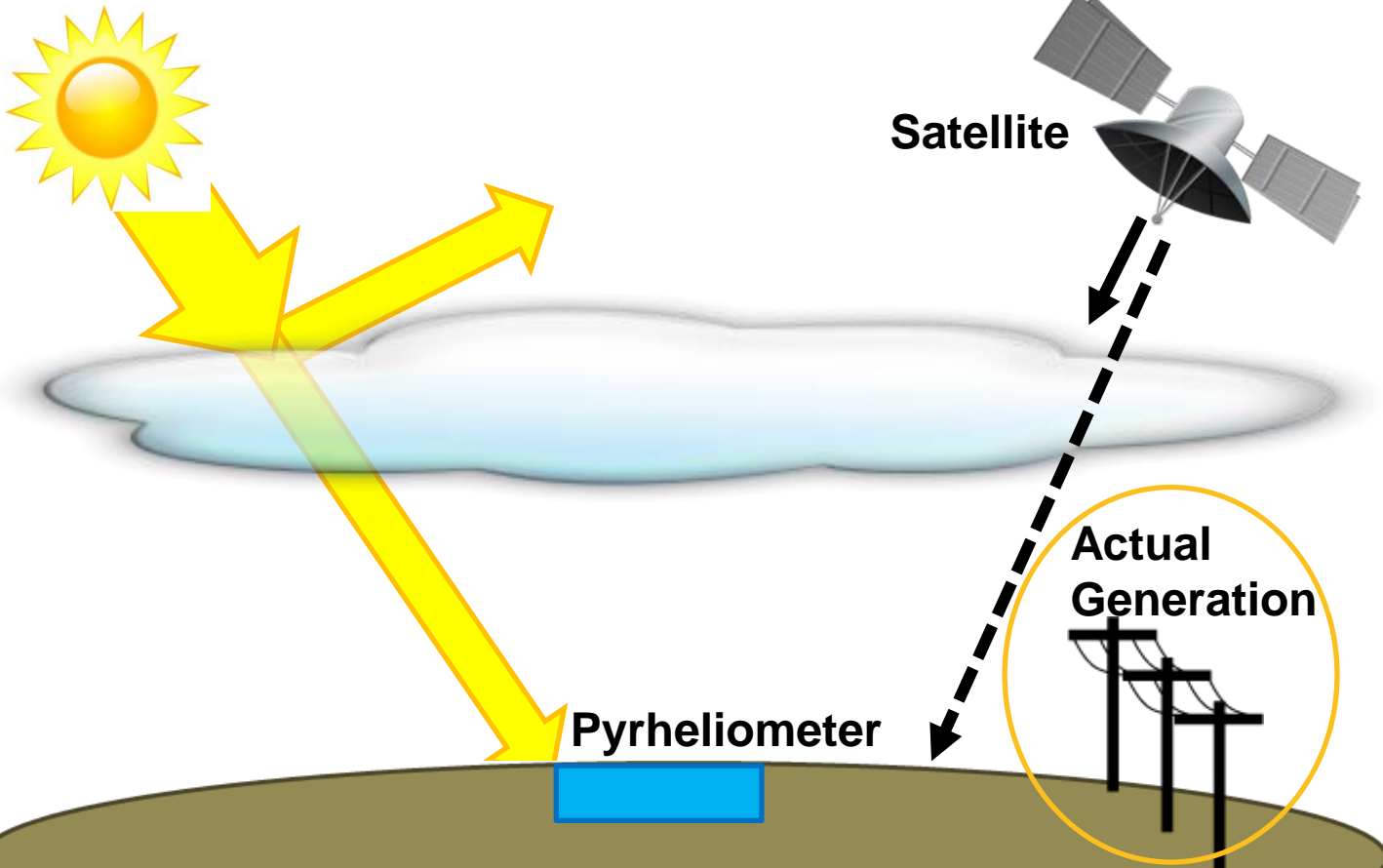


**We can measure solar data at several points between the sun and the power plant output.**

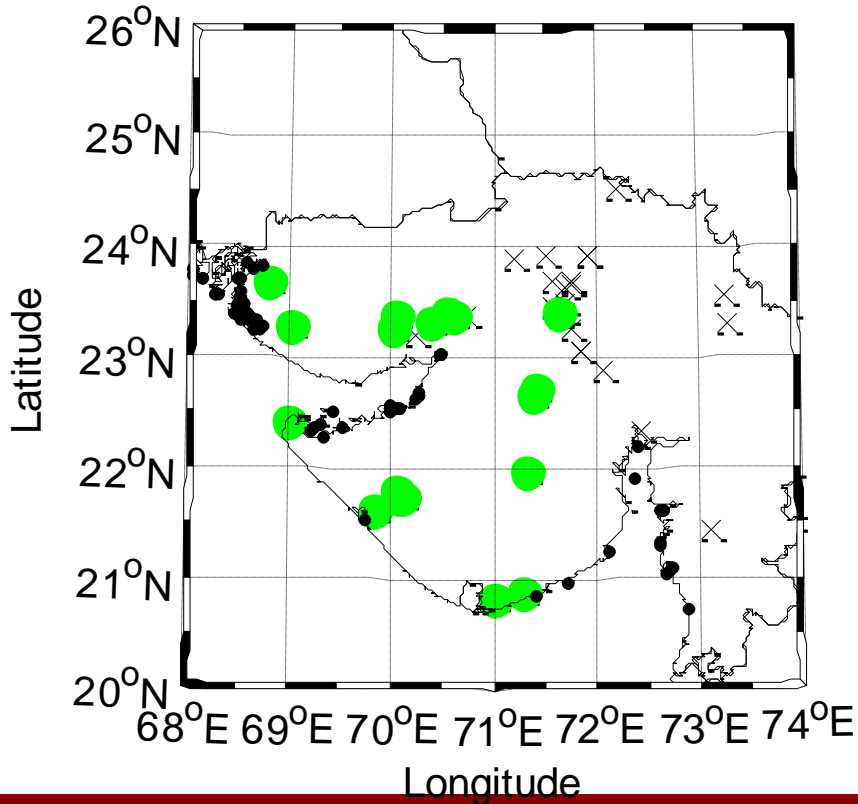




**In this study we examined actual generation data.**



# We examined generation data from 50 power plants in Gujarat (eastern India).



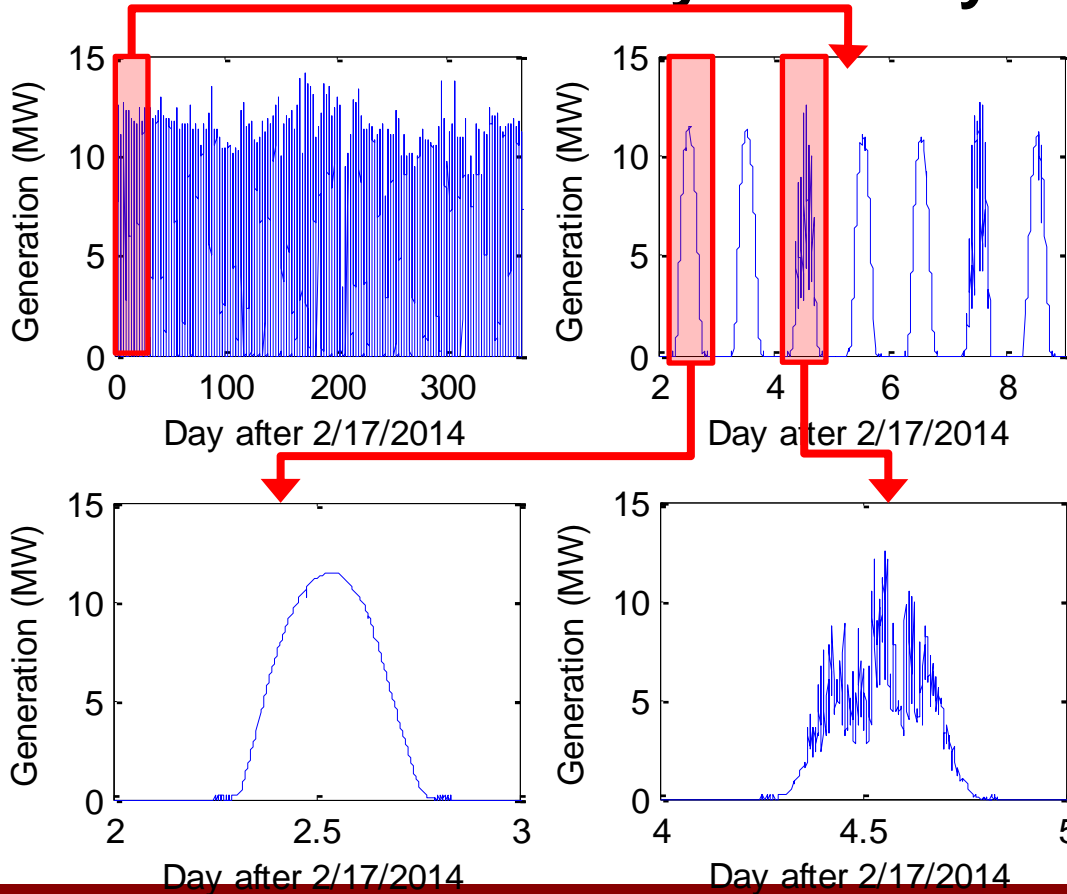
**Green** = Plants used in rest of presentation

5-221 MW of installed capacity; changed over time.

Source: Gujarat State Load Dispatch Center, downloaded every minute.

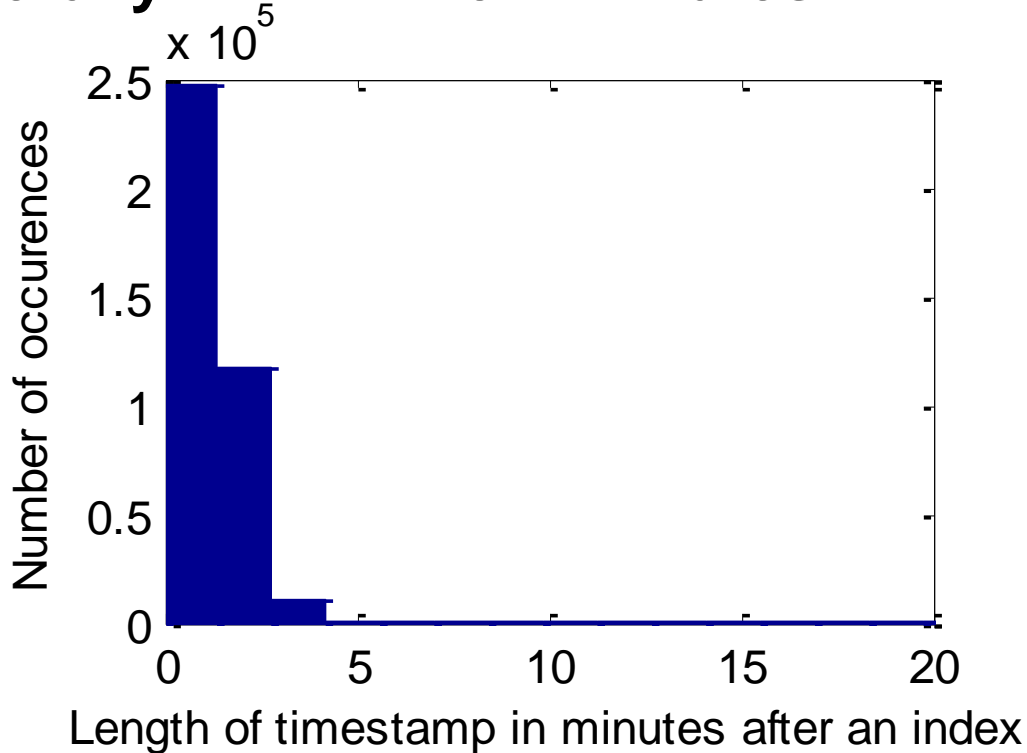


# Time series show sunny & cloudy days.





**Time stamp intervals were uneven, and generally within 1 to 2 minutes.**

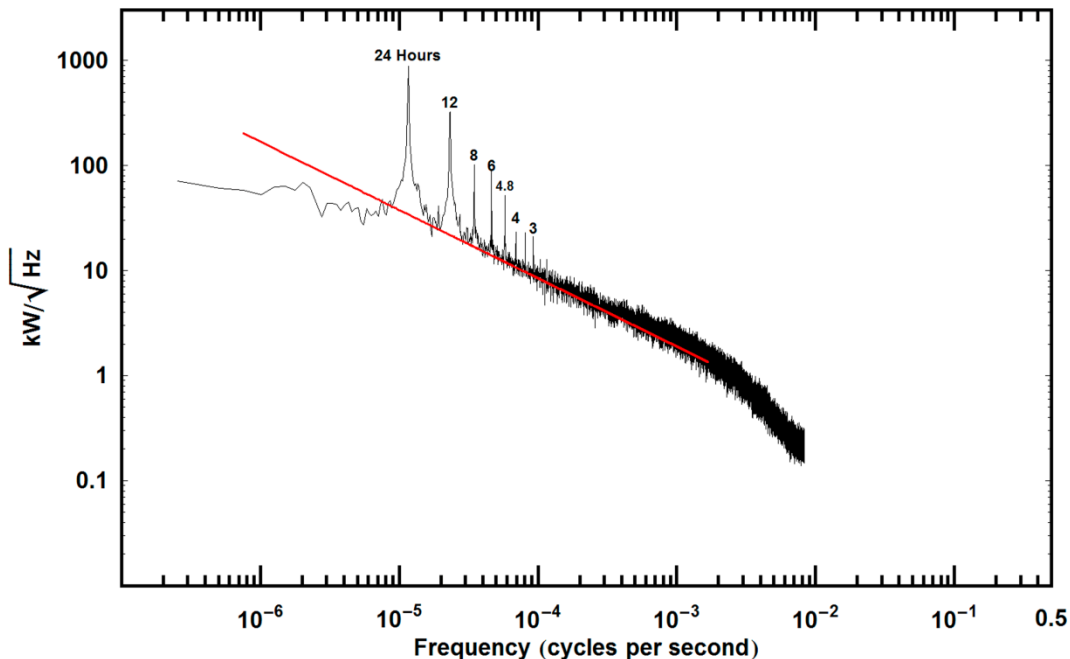






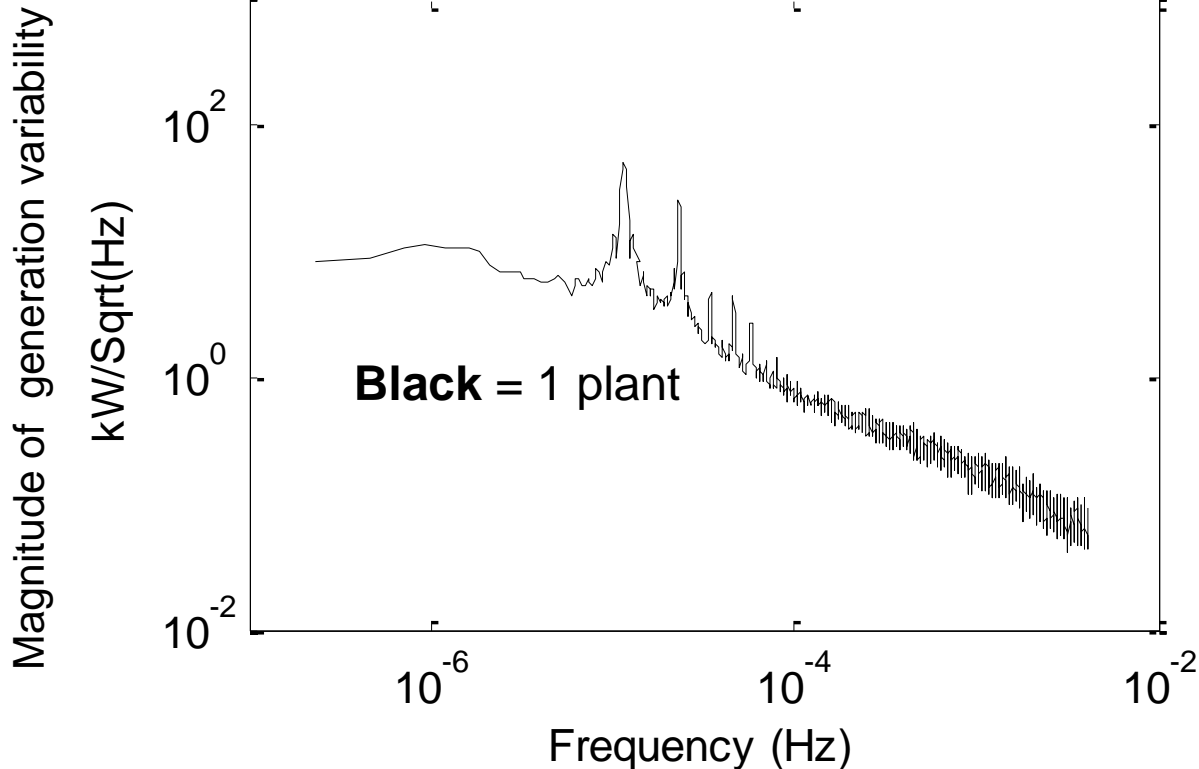
# To understand the variability, we looked in the frequency domain.

Curtright & Apt 2007: Sample power spectral density (PSD) of a Tucson Electric Power Array; red line is  $f^{-1.3}$



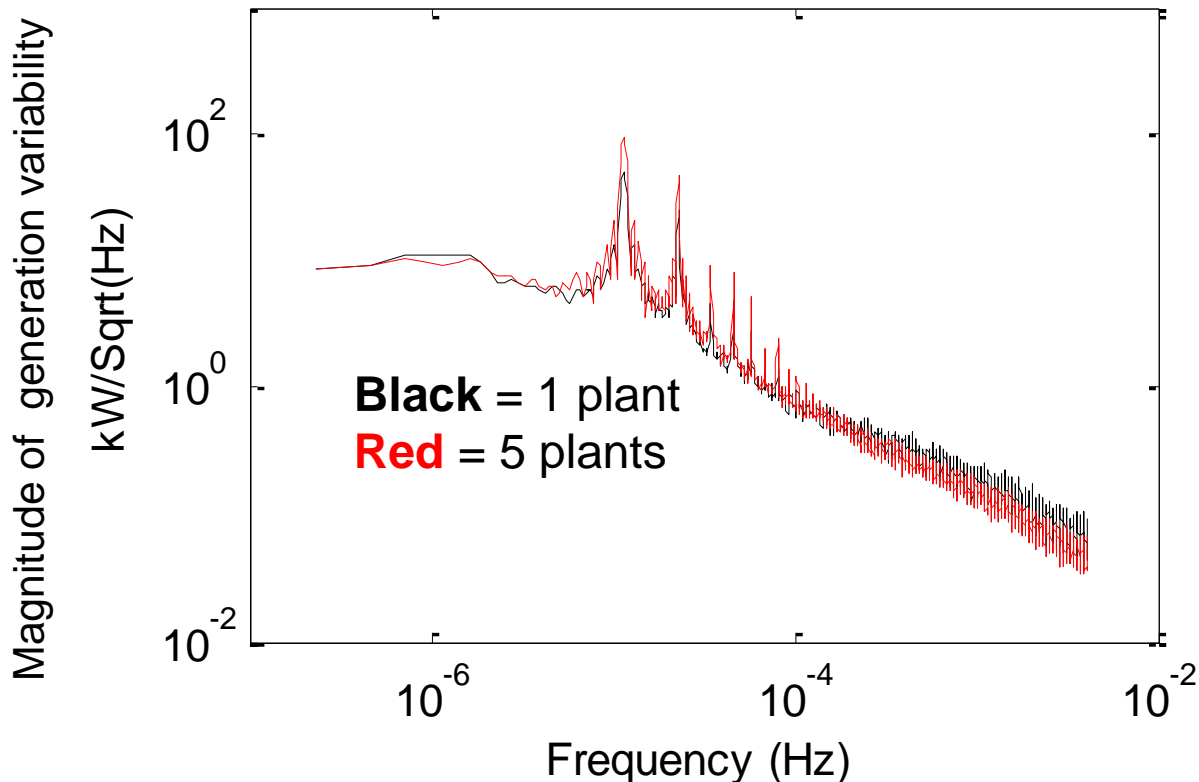


# The PSD for one Gujarat plant has a $f^{-1.3}$ spectra.



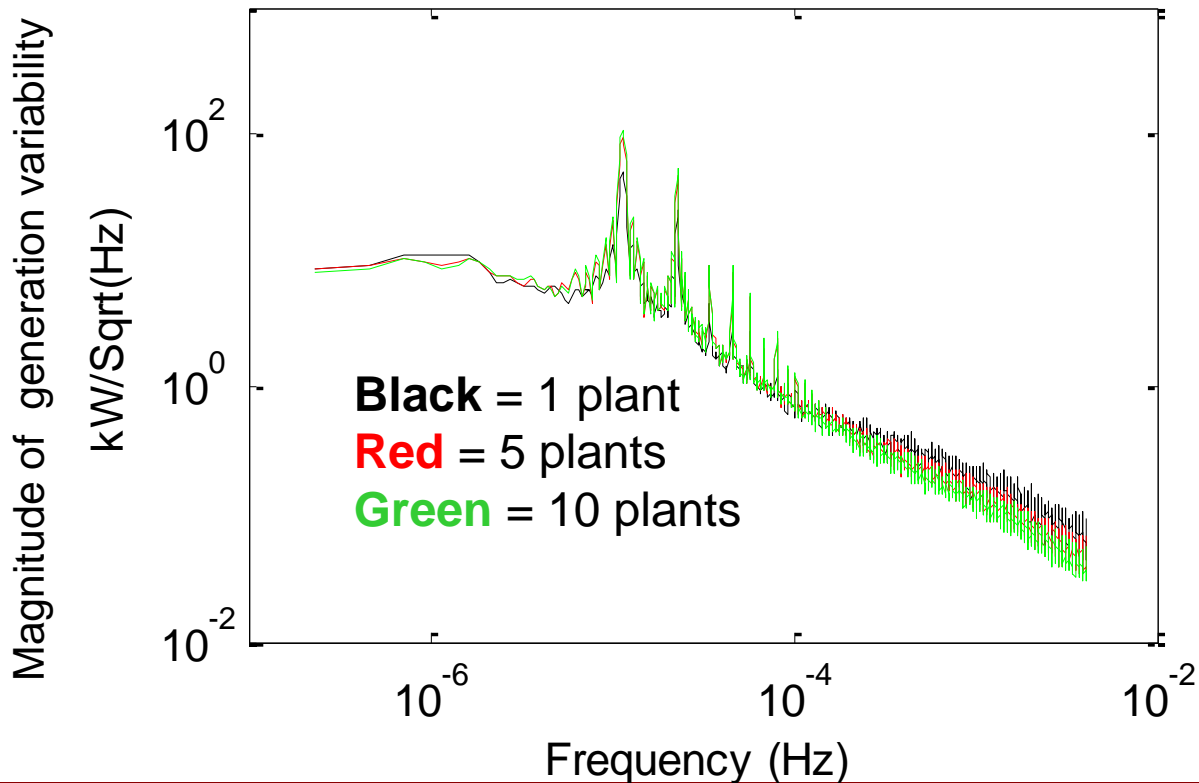


# Summing the generation of the 5 closest plants smoothens higher frequencies.



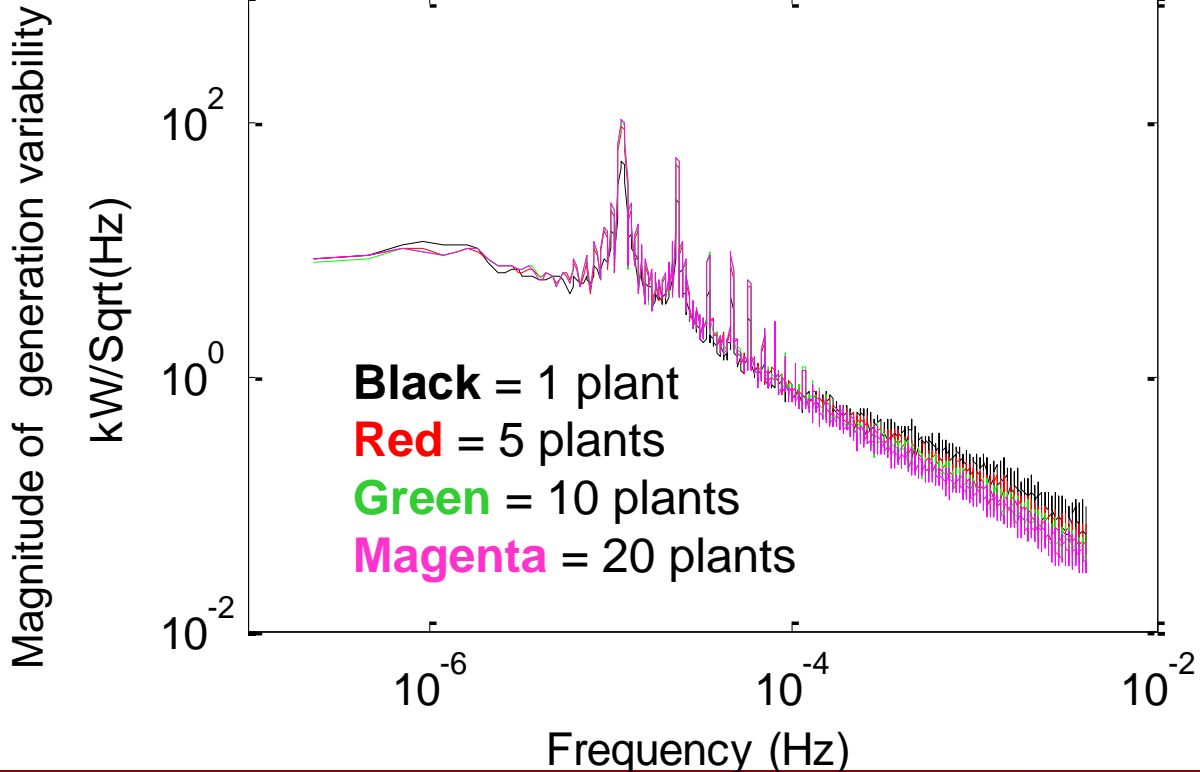


# There appear to be diminishing returns with adding plants together.



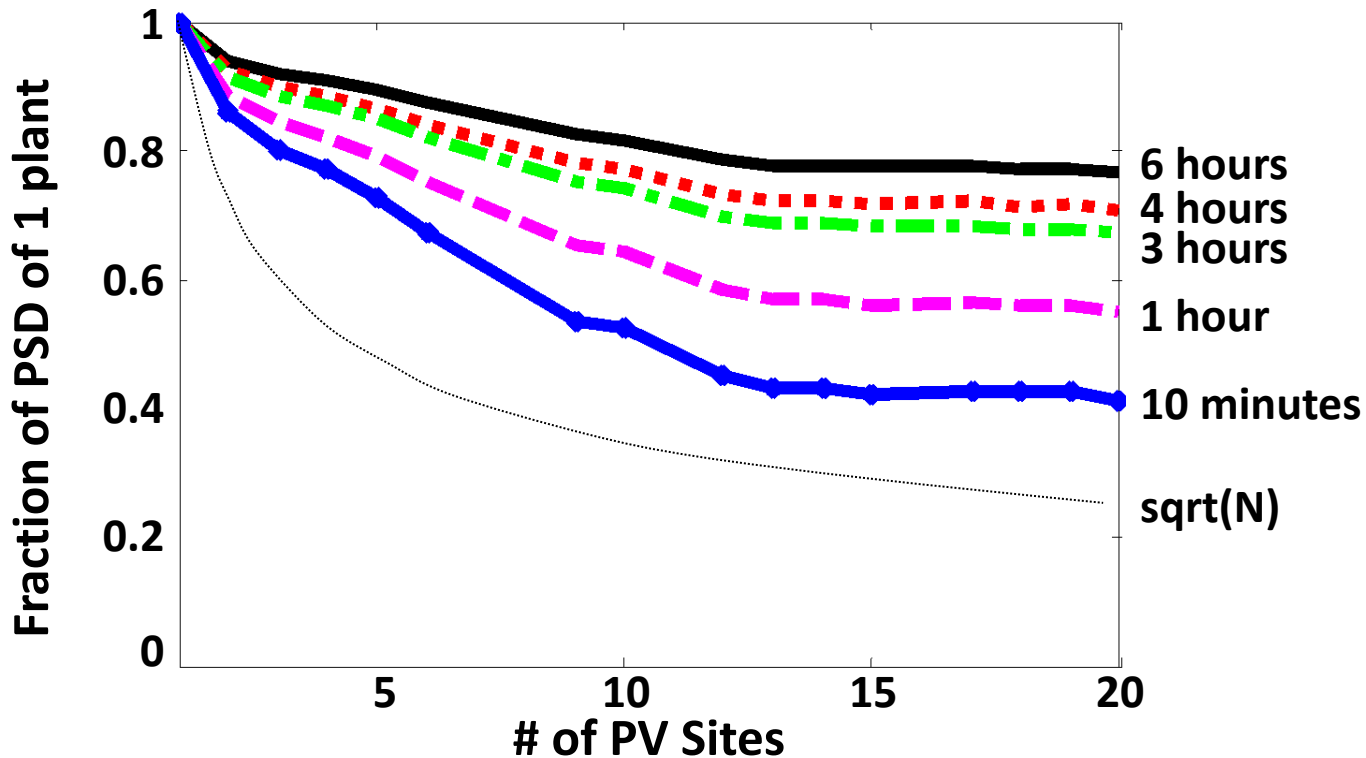


# The amount of smoothing achieved with 20 plants is almost the same as with 10 plants.



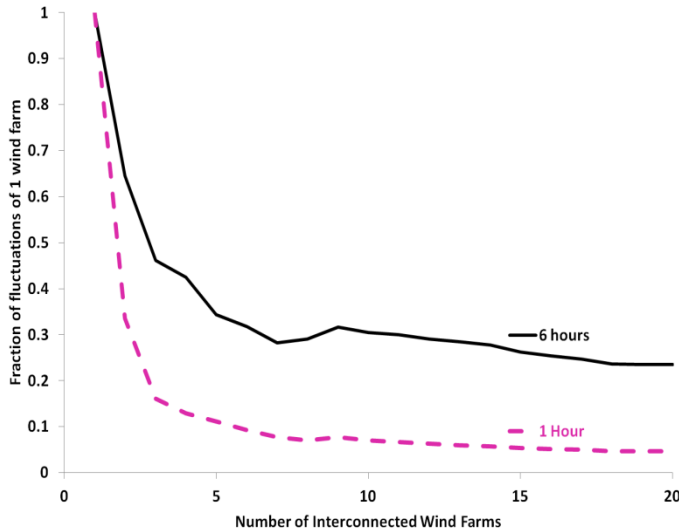


# Interconnecting a few solar plants achieves the majority of smoothing.

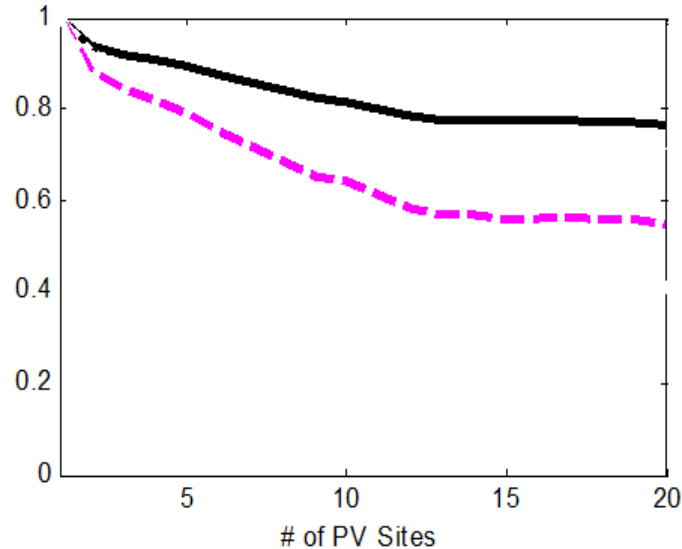


# MUCH less smoothing than for wind

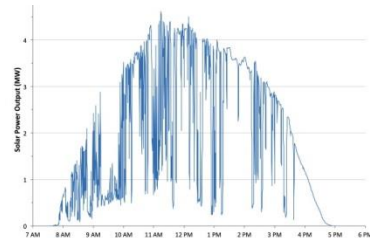
## Wind



## PV



That is probably because PV's deep power fluctuations lead to variability at many frequencies.





# Conclusions

- Interconnecting 20 Gujarat plants yields a  $f^{-1.66}$  spectrum and reduces fluctuations at frequencies corresponding to 6 hours and 1 hour by 23% and 45%, respectively. Half of this smoothing can be obtained through connecting 4-5 plants.
- The largest plant (322MW) showed an  $f^{-1.76}$  spectrum. This suggests that in Gujarat the potential for smoothing is limited to that obtained by one large plant.







# Contact Information

- Kelly Klima [kklima@andrew.cmu.edu](mailto:kklima@andrew.cmu.edu)
- Jay Apt [apt@cmu.edu](mailto:apt@cmu.edu)

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# References

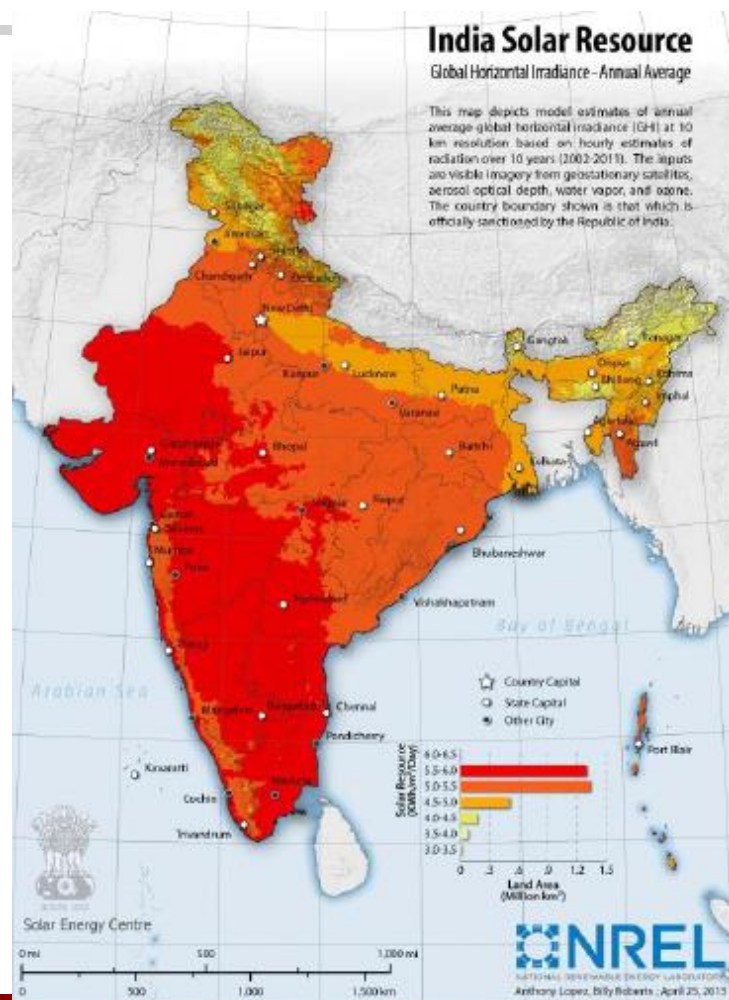
- Melillo JM, Richmond TC, Yohe GW. 2014. Climate Change Impacts in the United States: The Third National Climate Assessment. U.S. Global Change Research Program. doi:10.7930/J0Z31WJ2
- Curtright, A.E.; Apt, J. (2008). The character of power output from utility-scale photovoltaic systems. Progress in Photovoltaics: Research and Applications. 16(3), 241–247.
- Mills, A.D.; Wiser, R.H. (2010). Implications of Wide-Area Geographic Diversity for Short- Term Variability of Solar Power. Technical Report LBNL-3884E.
- Long, C.N.; Ackerman, T.P. (1995). Surface Measurements of Solar Irradiance: A Study of the Spatial Correlation between Simultaneous Measurements at Separated Sites. Journal of Applied Meteorology. 34(1), 1039–1046.
- Barnett, T.P.; Ritchie, J.; Foat, J.; Stokes, G. (1998). On the Space–Time Scales of the Surface Solar Radiation Field. Journal of Climate. 11(1), 88–96.
- Lave, M.; Kleissl, J. (2010). Solar variability of four sites across the state of Colorado. Renewable Energy. 35(12), 2867–2873.
- Hinkleman, L. (2013). Differences between along-wind and cross-wind solar irradiance variability on small spatial scales. Solar Energy. 88(1), 192–203.
- Argonne National Labs 2013
- Lave, M.; Kleissl, J.; Arias-Castro, E. (2012). High-frequency irradiance fluctuations and geographic smoothing. Solar Energy. 86(8), 2190–2199.
- Rowlands, I.H.; Kemery, B.P.; Beausoleil-Morrison, I. (2014). Managing solar-PV variability with geographical dispersion: An Ontario (Canada) case-study. Renewable Energy. 68(1), Pages 171–180.



# Extra slides

# NREL calculated solar data from 2002-2011.

- SUNY model: created for U.S. observations
- $1^\circ \times 1^\circ$
- Calculated direct normal irradiance, direct horizontal irradiance, and global horizontal irradiance
- Values almost as high as Arizona.





# We compared NREL calculated irradiance with generation data in Arizona.

- Pairwise correlation, Actual vs NREL. Values are given as: GHI correlation, (DNI correlation)

Springerville (1/1/2004- 12/31/2005)	Cimarron (10/12/2010- 12/31/2005)	NREL SUNY	NREL Metstat	8am-8pm LT	10am-6pm LT	Noon-4pm LT
✓		✓		0.79, (0.60)	0.79, (0.61)	0.79, (0.61)
✓			✓	0.77, (0.60)	0.76, (0.6)	0.76, (0.6)
	✓		✓	0.75, (0.69)	0.44, (0.41)	0.19, (0.35)

- This suggests that we might be able to use the NREL insolation data to predict generation data in India.





# Since correlations were not 1-1, we decided to use actual generation data.

- **Data Locators:** IITB's Rangan Banjee & Rhythm Singh
- **Data Source:** State Load Dispatch Center for Gujarat, India
- **Download and Conversion Advisors:** Eric Brundick, Terrence Wong, Joe Jewell, Jeremy Boulton, Eric Morganson.

