## Renewables



# OPERATIONAL FORECASTING IMPLICATIONS OF INTEGRATED WIND, SOLAR AND ENERGY STORAGE

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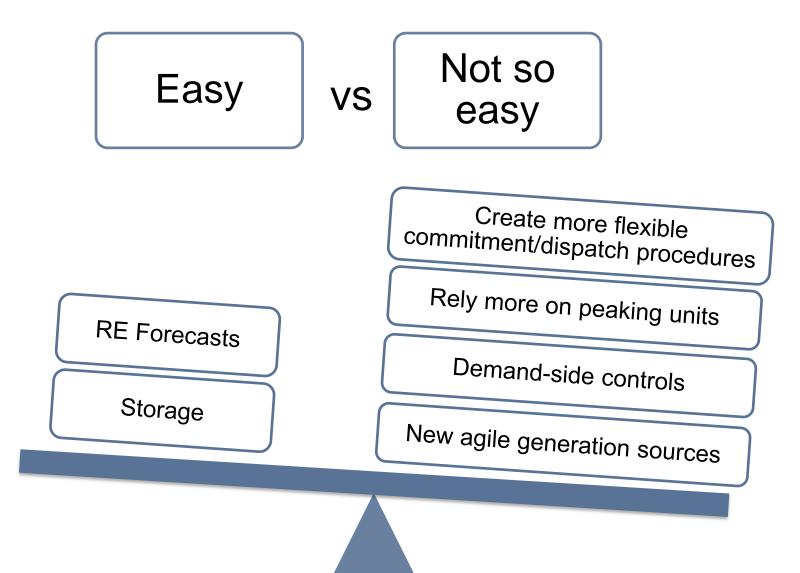


### **DEFINITION OF THE PROBLEM**

Uncertainty associated with wind and solar energy resources can be a costly issue to deal with.

- Reliability concerns on the transmission system due to wind/solar ramp rates, uncertainty with scheduling generation, peak/minimum load issues while meeting base generation operating constraints
- Profit concern for market participant due to non-optimized energy sales or taking penalties from off-taker

### SIMPLE SOLUTION: FLEXIBILITY!



### **OPPORTUNITY**

Issued Feb. 15, 2018, FERC Order 841 requires electricity markets to create an energy storage participation model that allows a resource to "provide all capacity, energy, and ancillary services that the resource is technically capable of providing in the RTO/ISO markets, ... be dispatched and set the wholesale market clearing price as both a wholesale seller and wholesale buyer, ...and account for the physical and operational characteristics through bidding parameters or other means."

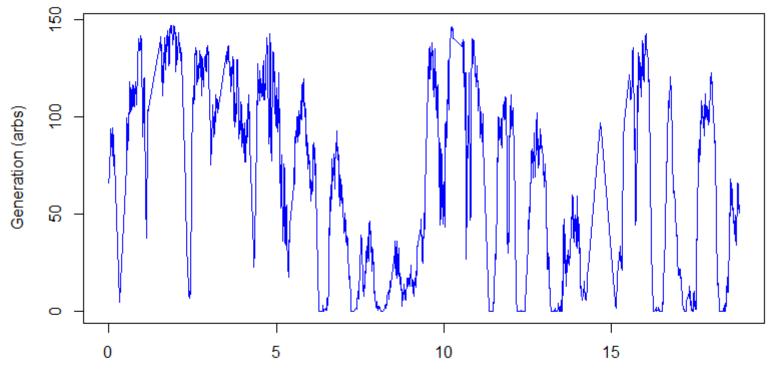


#### **Planning Studies**

Much can be done up front to simulate wind and solar generation and forecasts to determine storage capacity sizing, ramping needs, and revenue expectations Operational Forecast Even a simple day-ahead deterministic forecast can help lead to higher revenue from the storage solution

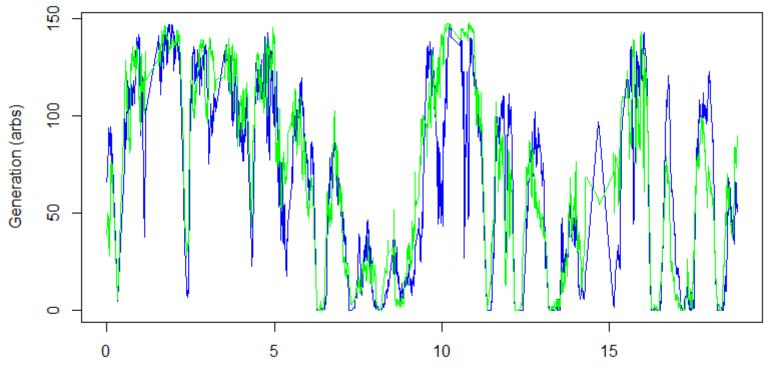


Wind Farm 1



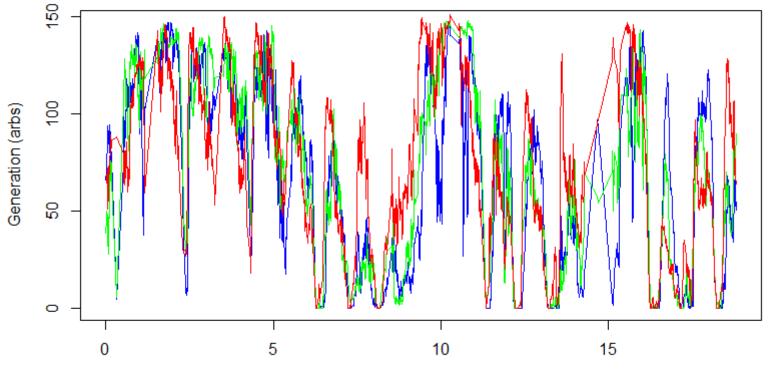


Wind Farms 1 and 2





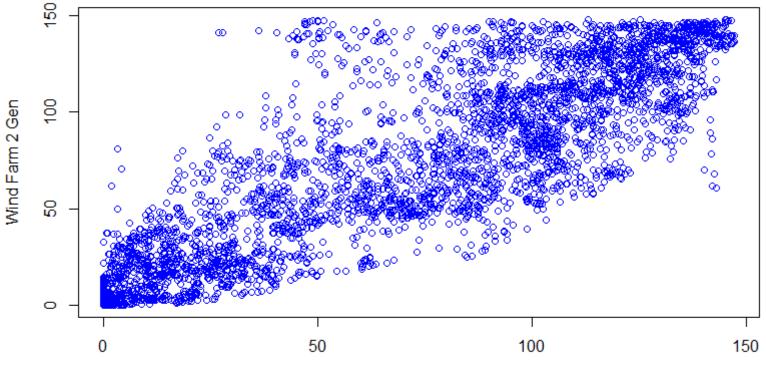
Wind Farms 1, 2 and 3





5 Minute Data

R = 0.86

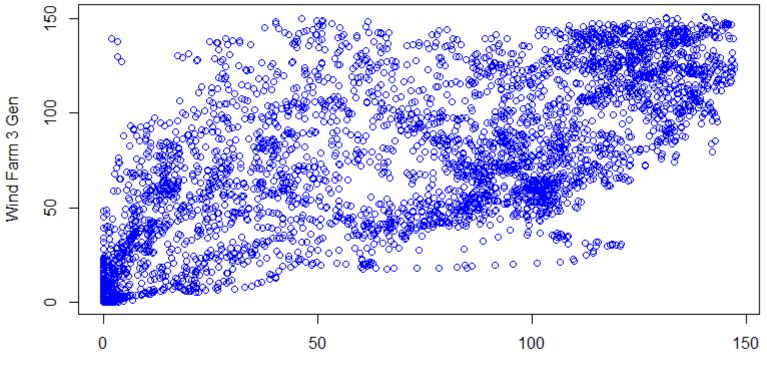


Wind Farm 1 Gen



5 Minute Data

R = 0.69

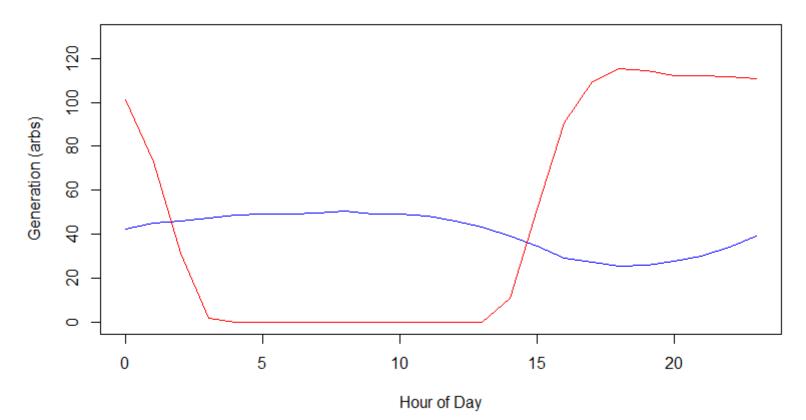


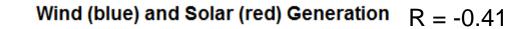
Wind Farm 1 Gen

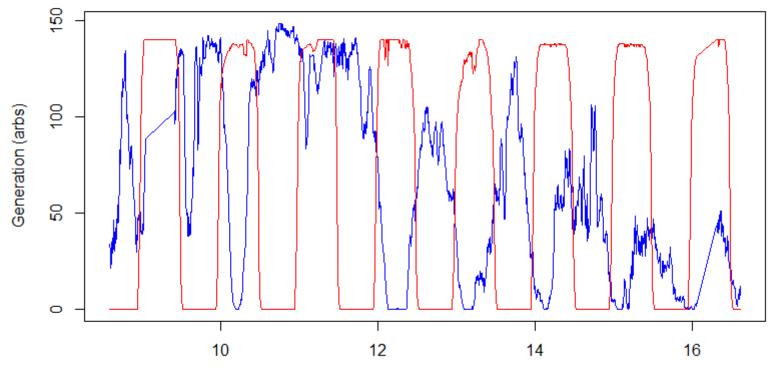


#### **FORECASTING FOR COMBINED PLANTS** R = -0.86

#### **Diurnal Cycle of Colocated Wind & Solar Generation**

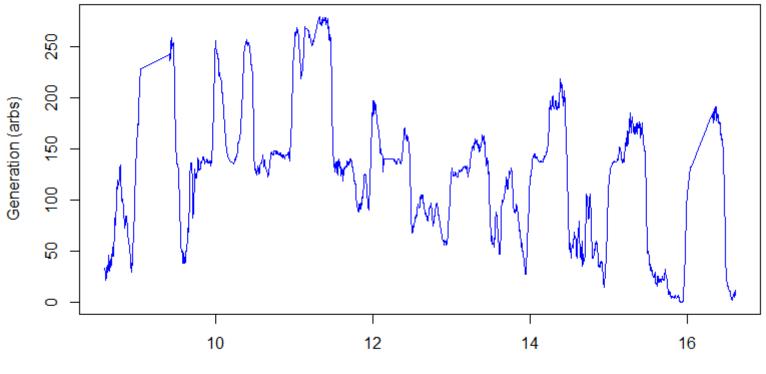






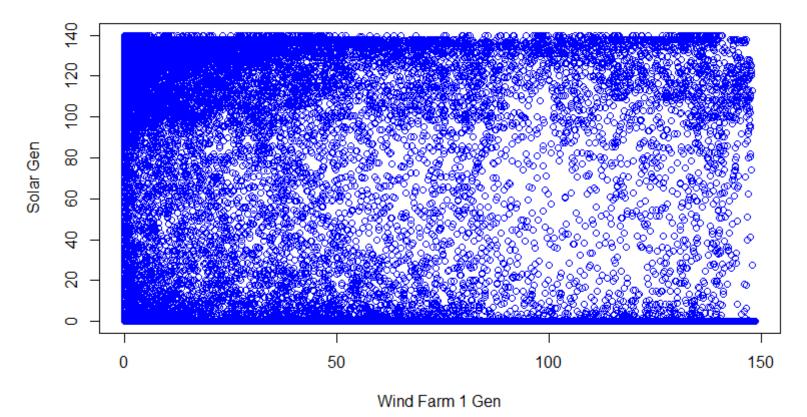


#### Sum of Wind and Solar Generation



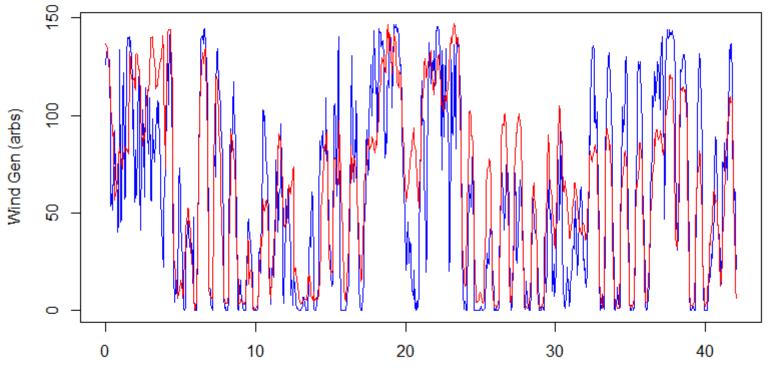


Wind vs Solar Generation R=-0.14



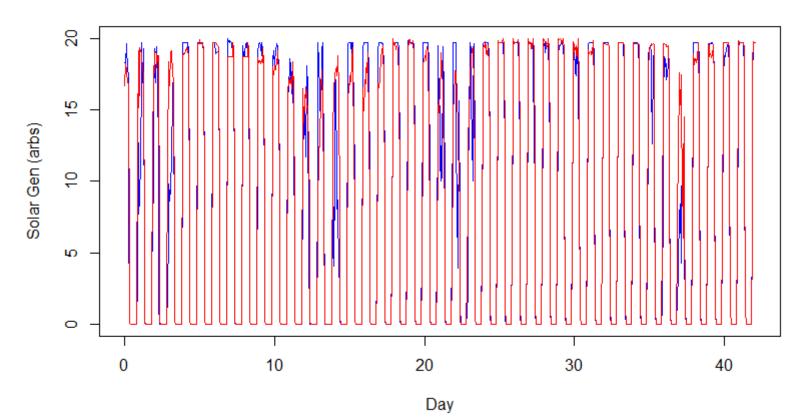
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Wind Fcst Vs Truth



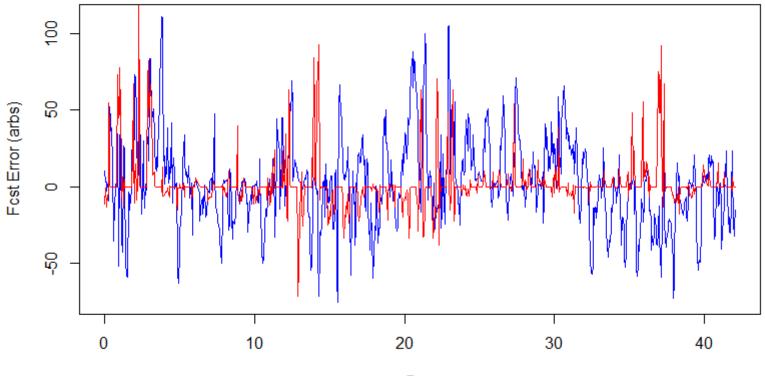


Solar Fcst Vs Truth



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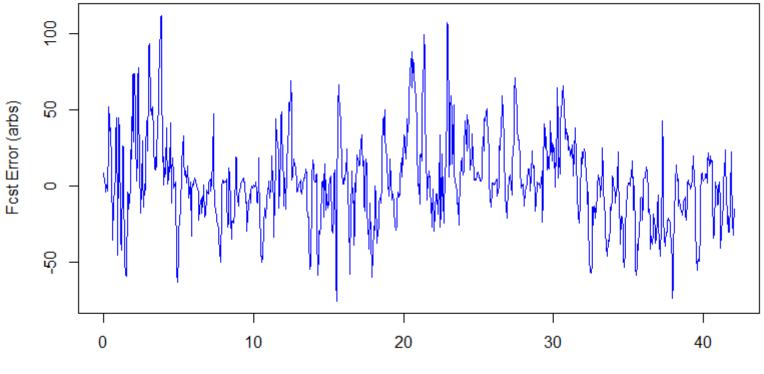
Wind Error (blue) Vs Solar Error (red) R = 0.03





Wind + Solar Error

MAE of Sum= 22; Sum of MAE's = 24





#### Questions?



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