# Quick Start Guide to Using Historical and Forecasted Weather Information in PowerWorld Simulator

Thomas J. Overbye
O'Donnell Foundation Chair III
Texas A&M University
overbye@tamu.edu, Overbye@powerworld.com

**February 14, 2024** 





#### **Overview**



- The purpose of this presentation is to show the benefits of having weather information become a standard part of power flow analysis and more broadly electric grid planning, and to show how everyone can easily begin using weather data today (at least for North America)
  - The results also apply to related applications such as optimal power flow (OPF), contingency analysis, security-constrained OPF
- All the weather data in the presentation (hourly data for North America) going back to January 1940 is available for immediate download
- This presentation builds on the one I gave on 1/24/24, with more of a PowerWorld Simulator focus here
  - Slides from January are at smartgridcenter.tamu.edu/webinars/

#### **About Tom Overbye**



- Since 2017 been a professor in the Electrical and Computer Engineering Department at Texas A&M (TAMU) working in the power systems area
- Also the director of the Texas A&M Smart Grid Center
- From 1991 to 2016 was with University of Illinois (UIUC)
- Got all degrees from University of Wisconsin-Madison, and worked eight years as an engineer with Madison
- Taught many power systems classes over last 33 years and worked on a wide variety of research projects

#### **About Tom Overbye**



Started the development of the code that became PowerWorld during

graduate school

Co-founder of PowerWorld Corporation in 1996

- Goal is to make grid analysis as easy as possible
- Since both UIUC and TAMU encourage faculty
  to do consulting and/or have external business
  relationships, I have continued to work with the PowerWorld code
  including OPF, stability, visualization, GMD, HEMP, and now weather
- As was the case at UIUC, at TAMU my relationship with PowerWorld is covered by a management plan

#### Using Weather with PowerWorld Simulator



- Over the last 18 months PowerWorld has gained a lot of weather modeling related capability, and is continuing to gain more
- Currently
  - Past, present and future weather data can be loaded into Simulator
    - This can be done using \*.pww, \*.aux, or \*.csv files
    - Hourly past data is available from 1940 to five days behind real time;
       present data is available from measurements; future is hourly up to 16 days
  - The weather can impact the power system devices using PFW (Power Flow Weather or Power Flow Whatever) models; PFW models can be thought of like the stability models: they are applied to power system objects (e.g., a generator or line) and different classes of models can be defined
  - PFW models can be applied automatically in the Time Step Simulation, and applied (currently) on demand in the other applications like power flow

#### PowerWorld Simulator Version and Build Date



- The weather functionality is only available in Version 23, and is currently available as an add-on included in the base package
- Much of the weather does not require cases with geographic values,

but more can be done when available

- What is available depends on the build date
- The Simulator version and build date are available by selecting
   Window, About
- We desire your suggestions on what should be included moving forward



#### **Availability of Historical Weather Information**



- When this effort started we were using historical weather station measurements (mostly identified by their ICAOs [International Civil Aviation Organization], e.g. KLIT, KCLL)
  - We had lots of data, but much of it had missing values; we also only had surface wind values and no direct solar measurements
  - Such measurements at specific locations are very useful (e.g., at electrical substations)
- We are also now using ERA5 data, which is state-of-the art (fifth generation) reanalysis of global climate and weather since 1940
  - It is available hourly on a 0.25 degree grid and includes 10m and 100m wind, and solar global horizontal irradiance and direct horizontal irradiance
  - ERA5 comes from European Centre for Medium-Range Weather Forecasts (ECMWF), (ERA = ECMWF Re-Analysis) with more details on ERA5 available at rmets.onlinelibrary.wiley.com/doi/10.1002/qj.3803

#### **Easy Power Flow Access to ERA5**



- ERA5 is available worldwide about five days behind real-time
- We convert it to pww format files, and place it at electricgrids.engr.tamu.edu/weather-data/
- Currently we provided data for most of North America and then smaller files for just Texas
  - For each hour the pww files store eight weather values (temperature, dew point, cloud cover percent, wind speed (10m), wind direction (10m), wind speed (100m), global horizontal irradiance, and direct horizontal irradiance
  - The North America pww files have 38,497 data points; with 8 values per hour, this is about 220 MB per month, or about 225 GB for the total set
- This data is public so it can be freely used and shared

## Eelectricgrids.engr.tamu.edu/weather-data/



#### **Weather Data**

This dataset contains historical and forecast weather data for Texas and North America. The historical data starts from 1940 and extends to almost present (5 days from current date). The list of weather values include, temperture, dew point, wind speed, wind direction, wind speed at 100m, cloud cover, global horizontal irradiance, and direct horizontal irradiance for a 0.25 degree latitude and longitude grid across much of North America.

 $Please\ contact\ Thomas\ Overbye\ (overbye\ @tamu.edu)\ or\ Farnaz\ Safdarian\ (fsafdarian\ @tamu.edu)\ for\ any\ questions\ regarding\ this\ data.$ 

#### View Available Weather for Download

#### References

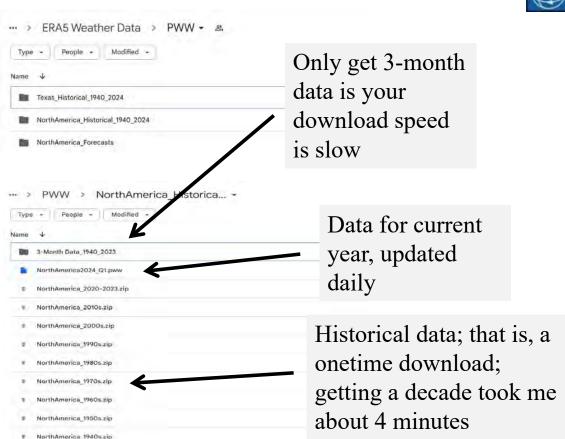
If you use these datasets in publications, please cite the following papers, and acknowledge the ERA5 data as described below:

T. J. Overbye, F. Safdarian, W. Trinh, Z. Mao, J. Snodgrass, and J. Yeo, "An <u>Approach for the Direct Inclusion of Weather Information in the Power Flow," Proc. 56th Hawaii International Conference on System Sciences (HICSS), January 2023;</u>

F. Safdanan, M. Stevens, J. Snodgrass, T. J. Overbye, "<u>Detailed Hourly Weather Measurements for Power System Applications</u>," 2024 IEEE Texas Power and Energy Conference (TPEC), College Station, TX, Feb. 2024.

Hersbach, H., Bell. B., Berrisford, P., Biavati, G., Horānyi, A., Muñoz Sabater, J., Nicolas, J., Peubey, C., Radu, R., Rozum, I., Schepers, D., Simmons, A., Soci, C., Dee, D., Thépaut, J-N. (2023): ERA5 hourly data on single levels from 1940 to present. Copernicus Climate Change Service (C3S) Climate Data Store (CDS), DOI: 10.24381/cds.adbb2d47 (Accessed on 23-01-2024)

Please refer to <u>How to acknowledge cite and reference data published on the Climate Data Store</u> for complete details on citing the ERA5 data.



#### Reducing the Geographic Footprint

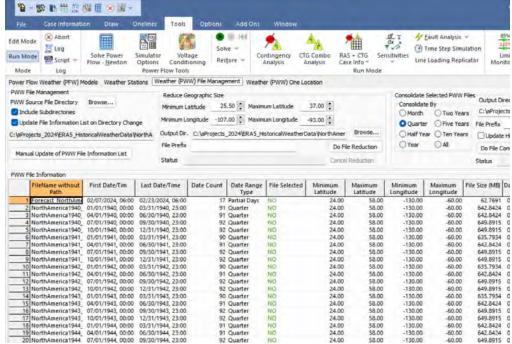


- Using data for all of North America is not usually recommended
  - Smaller footprints use less memory, down quicker and require less computation

We are supplying data more most of North America to make sure all data is

available for subsequent reduction

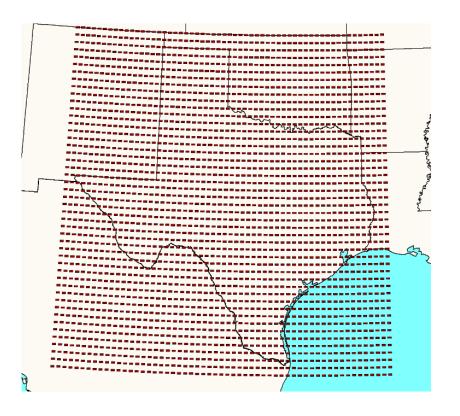
- PowerWorld has a tool to make it easy to reduce the footprint by specifying a new geographic rectangle
- At Tools, Weather, Weather Models and Information on the Weather PWW File Management page

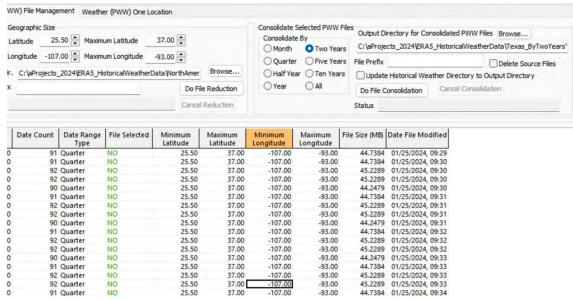


#### **Example: Texas PWW Files, Stored Every Two Years**



The Texas pww files have 2679 grid points; each file stores two years of data with a size of 367 MB; total set (1940-2024) is 15 GB



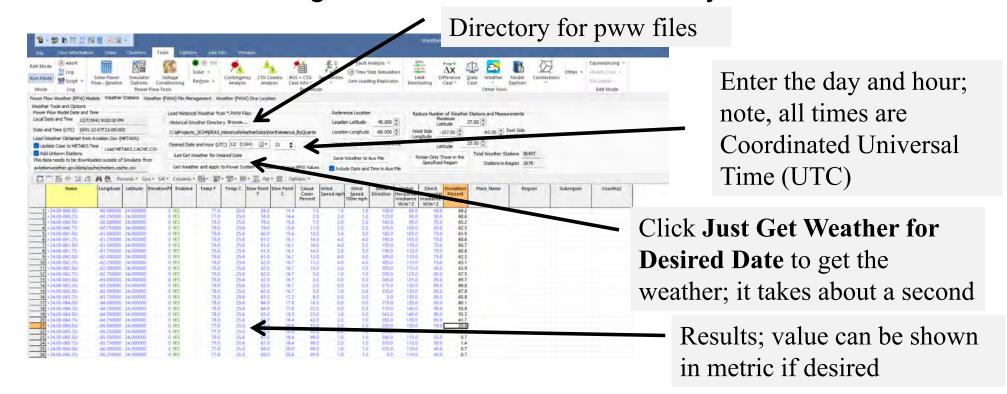


Tool for reducing or consolidating pww files

#### Viewing Weather for an Hour



Goto Tools, Weather, Weather Models and Information,
 Weather Stations Page to view the weather for any valid time



#### Available ERA5 Fields in PowerWorld



- The ERA5 dataset has hundreds of different values; currently we are using eight of them
  - Surface temperature, surface dew point
  - Wind speed at 10m, wind direction at 10m
  - Wind speed at 100m
  - Total cloud cover (which takes into account all the layers)
  - Total sky direct short-wave (solar) radiation at surface (fdir); used to get the direct horizontal irradiance and the Direct Normal Irradiance (DNI)
  - Surface short-wave (solar) radiation downwards (ssrd); this is used with the direct horizontal irradiance to get the Diffuse Horizontal Irradiance
  - Derived values like humidity are also available
  - Other values could be used, like 10m wind gusts and icing estimates

#### **PWW File Format**



- The Power Weather (\*.pww) files use a binary format to store weather information for a set of time points and a set of weather stations
- The format is relatively general
  - The timepoints can be either uniformly spaced (e.g., hourly) or individually specified (as is the case with forecasts)
  - The weather stations do not need to be on a uniform grid
  - The data (e.g., the weather measurements) can be stored as either bytes or words (two bytes)
- Header information gives the file's time range and geographic range
- Format will be public, though currently just available by request to Overbye@tamu.edu

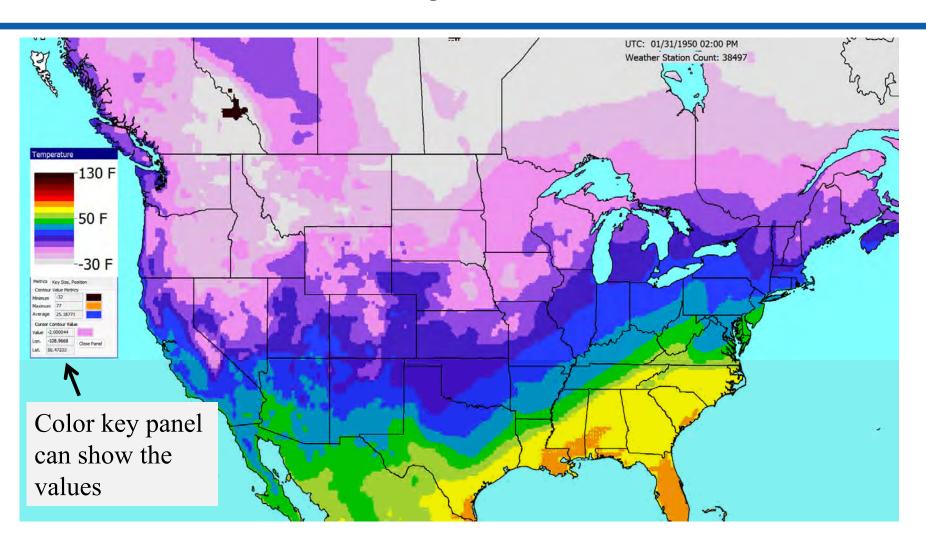
#### Visualizing the Weather



- With its relatively new "Spatial Data" contours, PowerWorld makes it
  very easy to visualize the weather
  - Spatial data contours visualize geographically specified data that does not have a corresponding power grid component; added initially for geomagnetically induced current (GIC) electric fields, but also used with weather
  - Spatial data contours do not require that the electric grid have geographic information; so weather can be visualized with any PowerWorld case!
- To make this very easy PowerWorld has example \*.pwd files that have predefined contours
  - Available at www.powerworld.com/knowledge-base/simple-weather-example
- The pww files include off-shore values; they are just not contoured

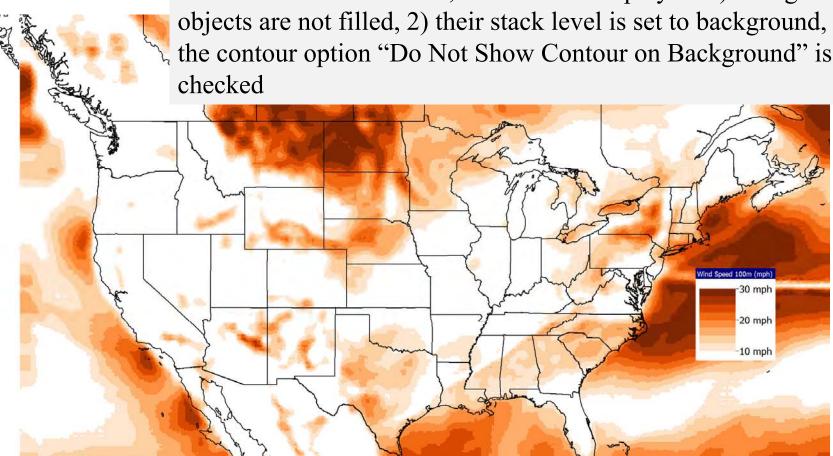
## Coldest Recorded Day in Seattle: Jan 31, 1950





## **Contour Example Including Oceans (1/31/50)**

To show the ocean values, redefine the display so 1) background objects are not filled, 2) their stack level is set to background, and 3) the contour option "Do Not Show Contour on Background" is not

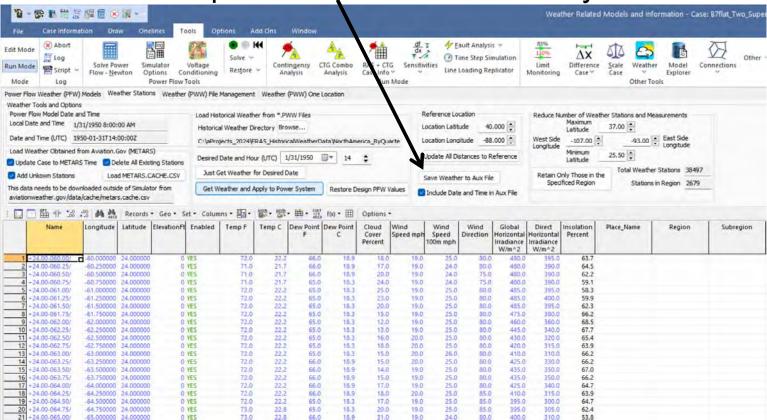




#### Saving Snapshot Weather in an Aux File



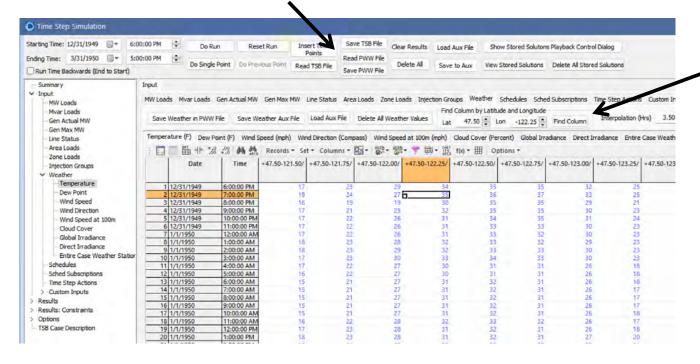
Weather for a particular hour can be easily saved in an aux file



## Simulating Large Amounts of Weather Information

 To easily view and simulate many time values, the pww files can be loaded into the Time Step simulation (Tools, Time Step Simulation)

Select Read PWW File to load the desired file



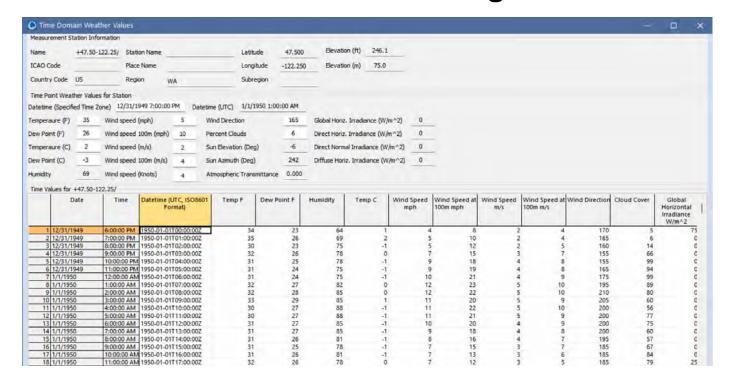
Allows a weather location to be easily located (Seattle here)

Like any
PowerWorld
case information
grid, the data can
be easily plotted
and exported

#### Seeing All Weather Data for a Location



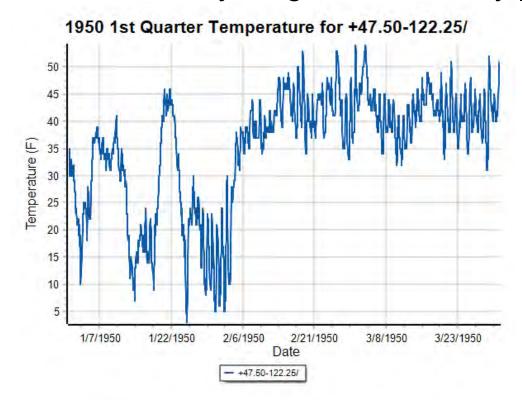
 To see all the weather data for a location, just right-click on the column and select Show Dialog

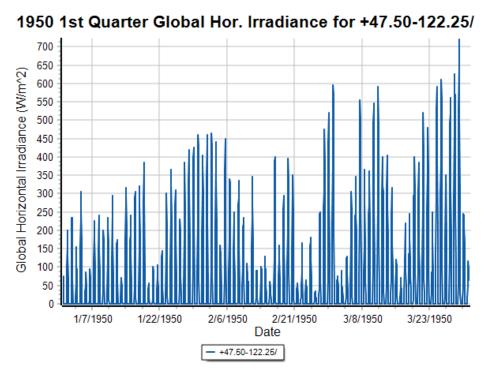


#### First Quarter 1950 Data for Seattle



Data for any range can be easily plotted





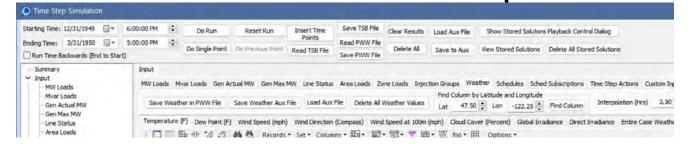
#### **Visualizing Time-Varying Data**

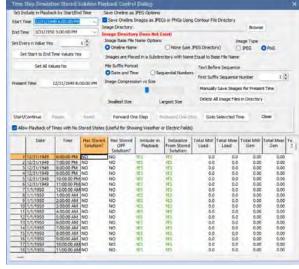


 In addition to graphs, in the Time Step Simulation the data for any time point can be easily visualized by right-clicking on the desired time and selecting Time Point Records, Apply Time Point (with Weather Update)

Movies can be easily created by using the Stored Solutions

Playback Control Dialog to create a series of jpg or png files, then using image software like Adobe Premiere Pro





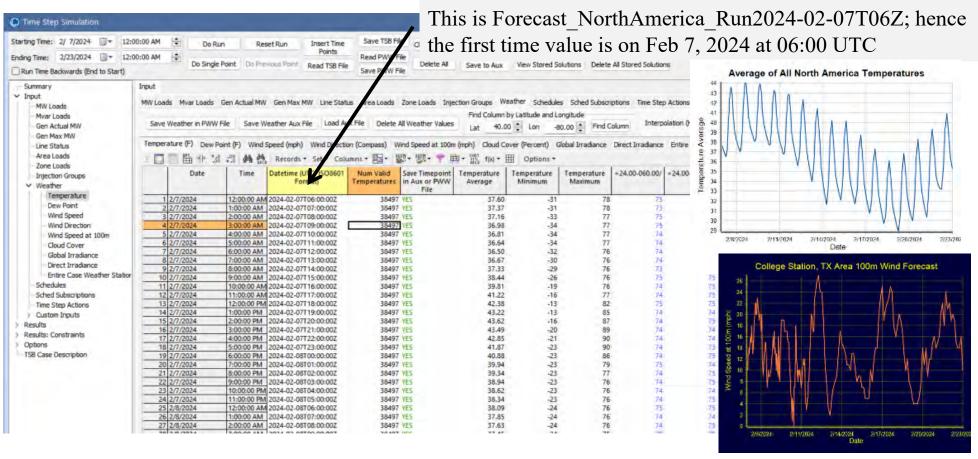
#### **Availability of Forecasted Weather Information**



- Forecasted weather information is also available from a variety of sources; here we use the free forecasts provided by US National Oceanic and Atmospheric Administration (NOAA) National Centers for Environmental Prediction (NCEP) NCEP Central Operations
  - nco.ncep.noaa.gov/pmb/products/gfs/
  - Specifically we're using the 0.25 degree resolution GFS results, which provide four global forecasts per day going out for 16 days (hourly for the first five days, then every three hours)
  - Forecasts are also pww files, so all of the existing tools can be used, though the forecasts to not have the solar irradiance values
  - File names include the run time in ISO 8601 format. Example is "Forecast\_NorthAmerica\_Run2024-02-07T06Z.pww"
    - The date tells when the forecast was run; they contain 16 days

#### **Availability of Forecasted Weather Information**



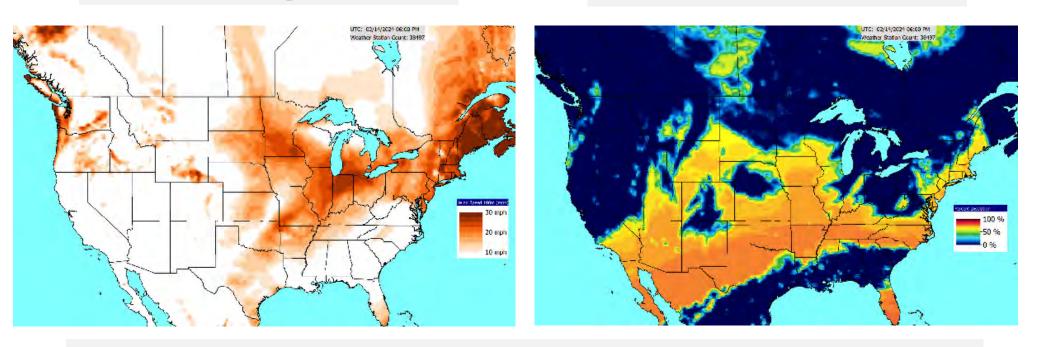


# Estimated Feb 14 Wind and Solar at Noon Central from Feb 7 Forecast (i.e., a week ahead!)



Forecasted Wind Speed at 100m

**Estimated Percent Insolation** 

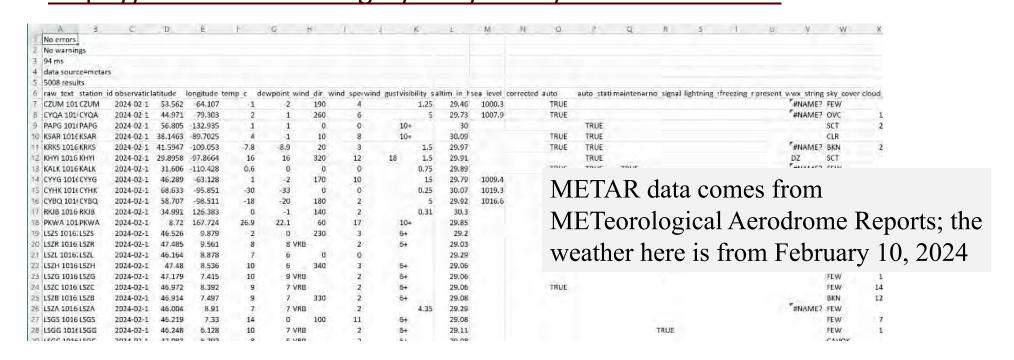


Currently these forecasts to not have irradiation values, so the percent insolation is estimated from the sun's position and the cloud cover percentage

#### **Current Weather**



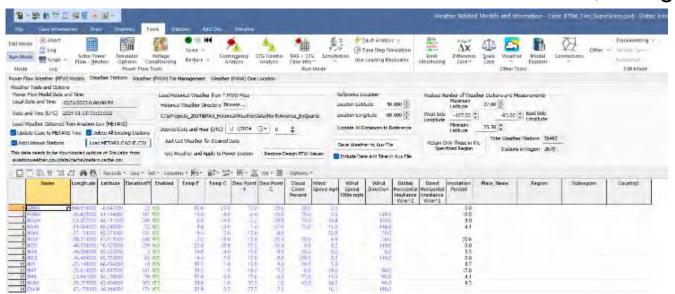
 If desired, to supplement forecasted weather, current weather is available for download at <a href="https://aviationweather.gov/data/cache/metars.cache.csv">https://aviationweather.gov/data/cache/metars.cache.csv</a>



#### Loading METAR data in PowerWorld

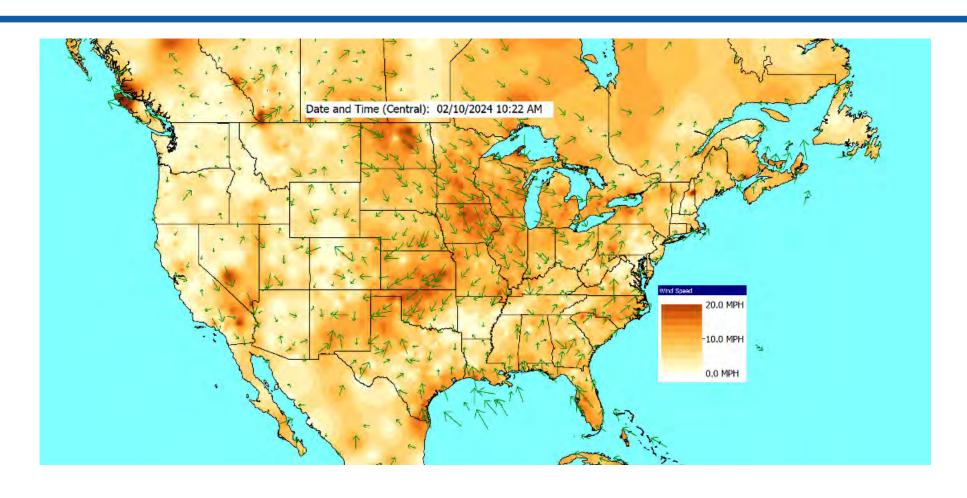


- The METAR \*.csv file can be quickly loaded in PowerWorld, and if desired, the values visualized using auto-updating GDV displays
  - At Tools, Weather, Weather Models and Information, Weather Stations page
  - Previous slide \*.csv has 4969 stations worldwide, though not all have full data



## **METAR Wind Speed Visualization with Directions**





#### **Models of Grid Weather Impacts**

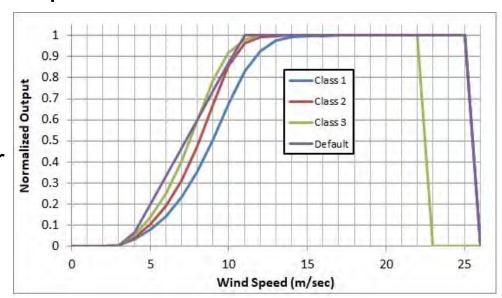


- Key focus here isn't weather per se, but modeling the impacts of weather on electric grid components (e.g., generators, lines)
- Certainly a number of models already exist, and undoubtedly more will be created given that weather data is now conveniently available
- The approach used here for handling a growing list of models is to mimic what has been done with power system stability – start small and expand
  - Early (1960) stability codes just had a handful of models, whereas current codes support many hundreds of different model types
- PowerWorld implements this using PFW Models
  - PFW = Power Flow Weather or Power Flow Whatever models

#### **Example: Gen MaxMW Wind and Solar**



- An example is modeling the impact of wind speed on wind turbine output, or solar irradiation on PV output
  - The image on the right shows several of the generic wind turbine models are based on the turbine classes using data from [a]
  - A simple solar PV model uses either provided solar irradiation or the standard equations for insolation based on location and time of day including cloud cover; this is combined with whether the solar has tracking and, if needed, its tilt and azimuth

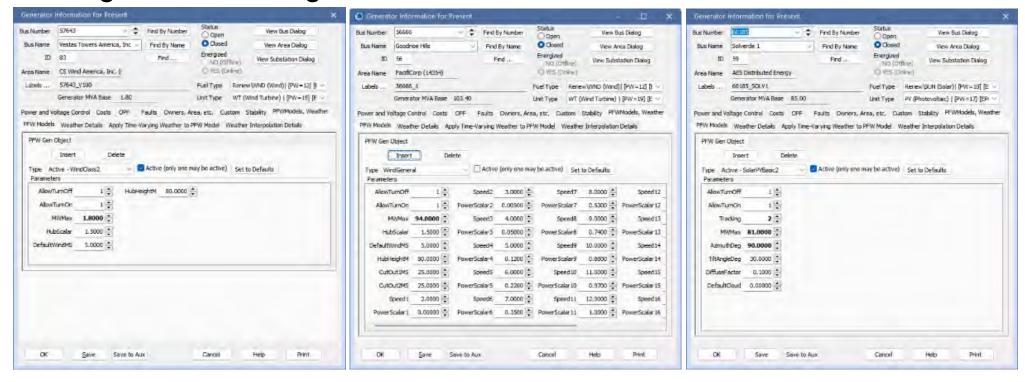


[a] C. Draxl, A. Clifton, B. Hodge, J. McCaa, "The Wind Integration National Dataset (WIND) Toolkit," *Applied Energy*, vol. 151, pp. 355-366, 2015.

#### **Example: Gen MaxMW PFW Model**



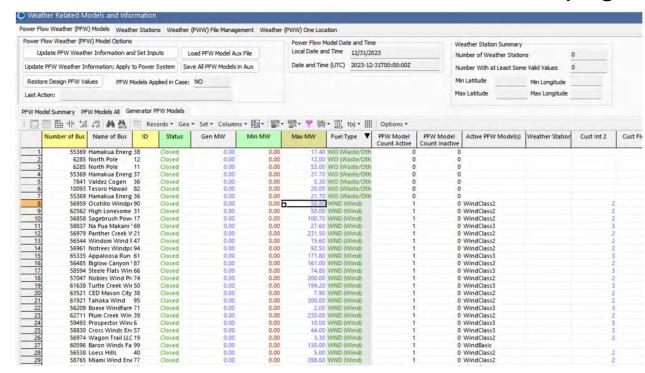
 Individual generator PFW models can be entered or viewed using the generator dialog



#### **Entering Large Number of PFW Models**



- A large number of PFW models can be entered by going to the Weather, Weather Models and Information, PFW Models page
  - The Generator
     PFW Models list
     shows all the
     generators in the
     case
  - Select the desired ones, right-click and select
     Insert New PFW
     Models



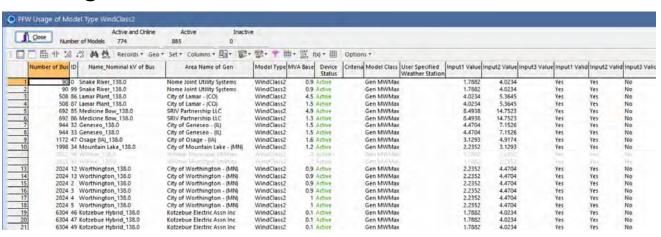
#### Making it Easy to Get Started: Using EIA-860 Data

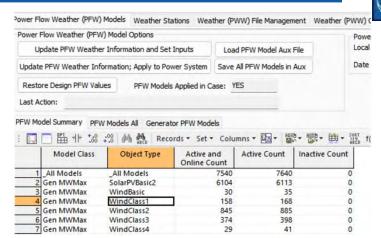


- To make it easy to get started we've setup copper plate (i.e., no transmission) power flow cases with PFW models based the data provided by the US Energy Information Administration (EIA) in their Form EIA-860 datasets
  - EIA-860 provides data on every generator in the US with 1 MW or more capacity
  - Available at www.eia.gov/electricity/data/eia860/; it is released yearly with monthly updates available
- We take this data and convert it into a copper plate power flow model, with the resultant cases publicly available at
  - electricgrids.engr.tamu.edu/eia-860-generator-data-cases/
  - Details on this process are in a 2024 TPEC paper (available as 2024 paper 3 at overbye.engr.tamu.edu/publications/)

#### **Example EIA-860 Wind Generator Data**

- Right image shows the PFW models to map weather (wind speed) to MW Max
  - From the Weather, Weather Models and Information display
- Bottom image shows some EIA-860 wind generators with turbine information





For the CEII grids we have bus mapping for more than 95% of the generator capacity

#### Mapping Weather to the Electric Grid Components



- While the newer weather datasets have lots of points, there is still
  usually at least some distance between power grid components and
  the nearest weather measurement, requiring interpolation
- There is no single best algorithm for doing the needed 2D scattered data interpolation, but there are a number of good and fast algorithms (grid-based, closest neighbor, Delaunay Triangulation, Shepherd's)
  - Since the weather values have an associated elevation, if the power grid component's elevation (or profile for a line) is known this could be considered
- Usually places in which the weather changes rapidly with geography (e.g., mountains) don't have much electric infrastructure (the exceptions are covered next)

# Mapping Weather to the Electric Grid Components

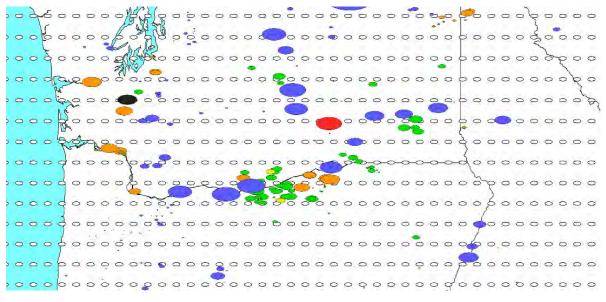


 In situations in which interpolation does not work well (e.g., valleys, mountains, some coastal regions), specific weather stations could be assigned to the electric grid devices (e.g., a wind farm)

An example is the Columbia River Gorge with a length of 190 km and an

average width of 5 km; the gorge has a unique and complex climate often with high winds

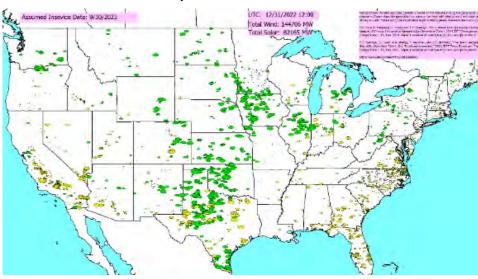
 Image shows the generation (ovals, with green for wind and blue for hydro) and the weather data points (as white ovals)



## **Applying the Weather**



- Weather can be applied to a power flow case using the pww files in multiple ways
  - At a specified point in time
  - As a summary of a large amount of weather at a single location (e.g., a generator) or at a few locations (a transmission line)
  - As a time series, sequentially solving lots of different time points
- The next few slides demonstrate each of these, showing the change in the wind and solar outputs



## **Applying Weather for a Single Time Point**



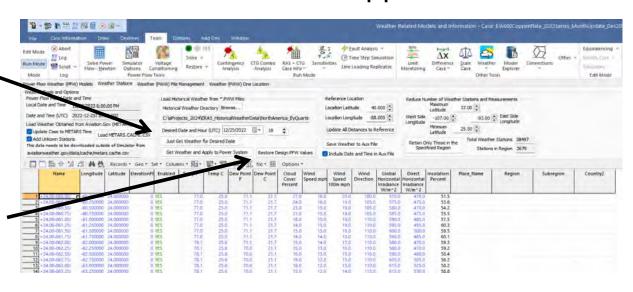
With the provided pww files, any time going back to 1940 can be simulated. The pww files are designed for quick searching, and for providing direct access to all the data for a particular time.

 Getting the access to the weather for all of North America takes about a second; optionally the weather can also be applied to the

power flow

 Once applied the power flow (and other applications) can be solved as normal

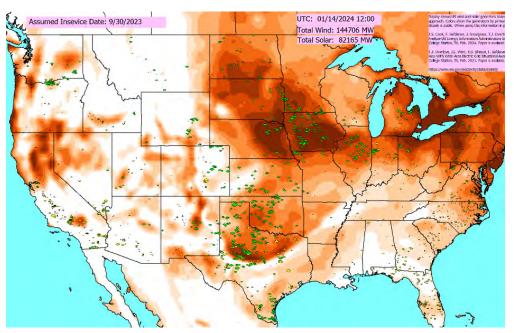
Restore values at the end

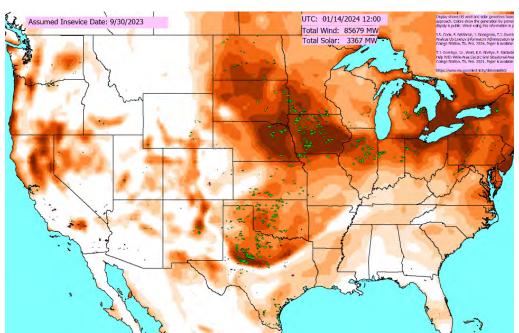


## **Applying Weather Without and With Updating the PFW Models and the Power Flow**



 Left image just shows the weather, without updating the PFW models (i.e., not changing the power flow values) whereas the right one also updates the PFW models (note the very low solar)





## Contrasting Two Days: 4/29/2010 and 12/12/1941



Assuming the 12/31/2023 renewable generation (147 GW wind, 90 GW solar), we determined a few outlier days. At noon (Central) weather for 4/29/2010 would have an 73% available, while 12/12/1941 weather would have 15%
 Applying the weather and

Assumed Inservice Date: 12/31/2023

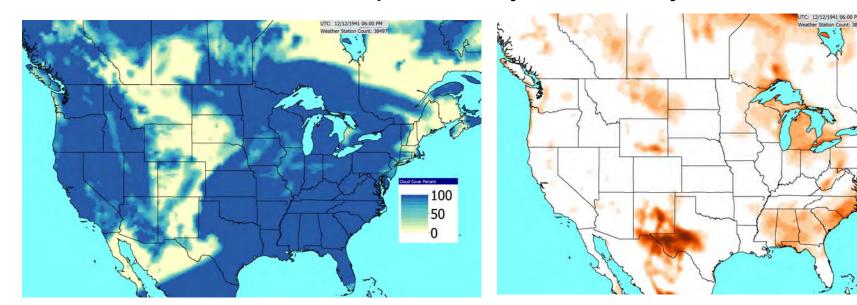


## December 12, 1941 Clouds and Wind



20 mph

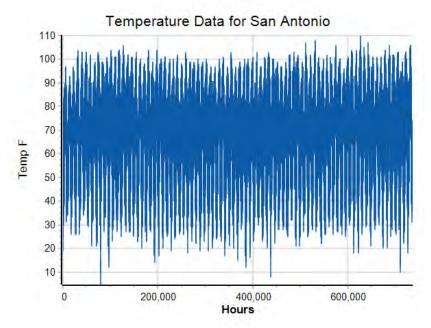
 Dec 12, 1941 was a cloudy, mostly windless day nationwide. But this needs to be considered on a regional basis. For example, it would not have been a particularly severe day in Texas.

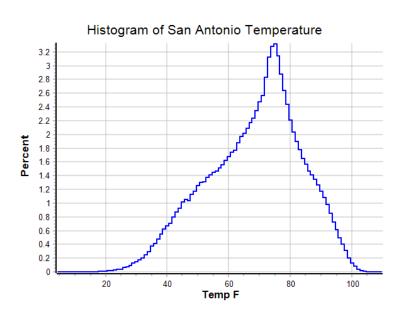


## Getting Lots of Weather for a Single Location



- By automatically parsing through the pww files, weather for a single location can be quickly determined
  - For the Texas cases this takes on the order of 4 seconds, returning data for more than 700,000 hours; below data is for San Antonio, TX

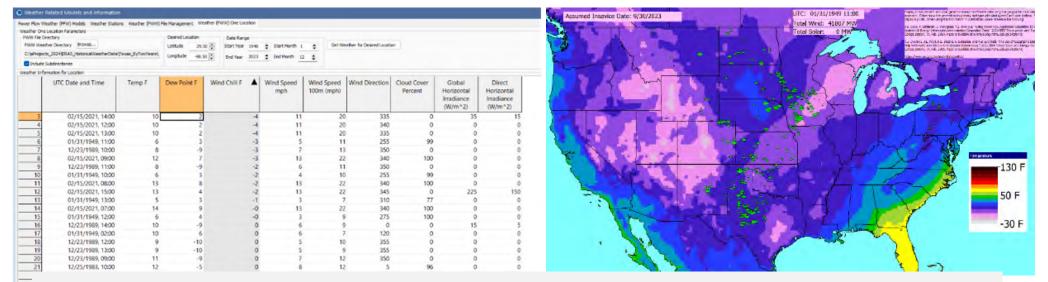




## One Application is Looking for Outliers



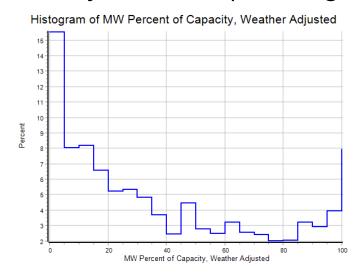
 Lower left image shows lowest wind chills in San Antonio; the lower right contours temperatures for Jan 31, 1949 at 11am (UTC)



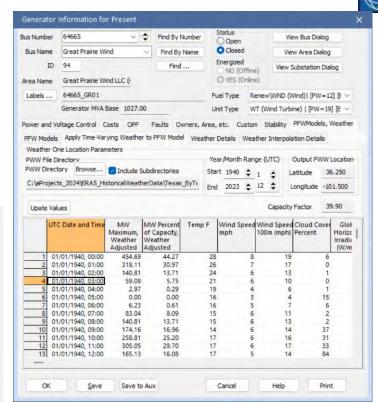
This allows engineers to rapidly find some of the worst conditions for a location and doing more in-depth analysis

## **Anticipated Performance of Wind or Solar Generation Can Also Be Determined**

 Hourly weather data can also be repeated applied to individual devices, such as generators. This allows the capacity factor to be estimated for any location (existing or new)



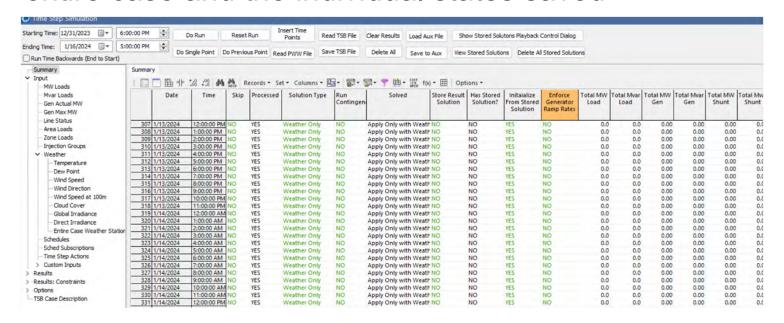
The impacts of changing model parameters can also be easily determined; for example changing the hub height to 100 m increases the capacity factor to from 39.5% to 44.5%



## **Running All Timepoints**



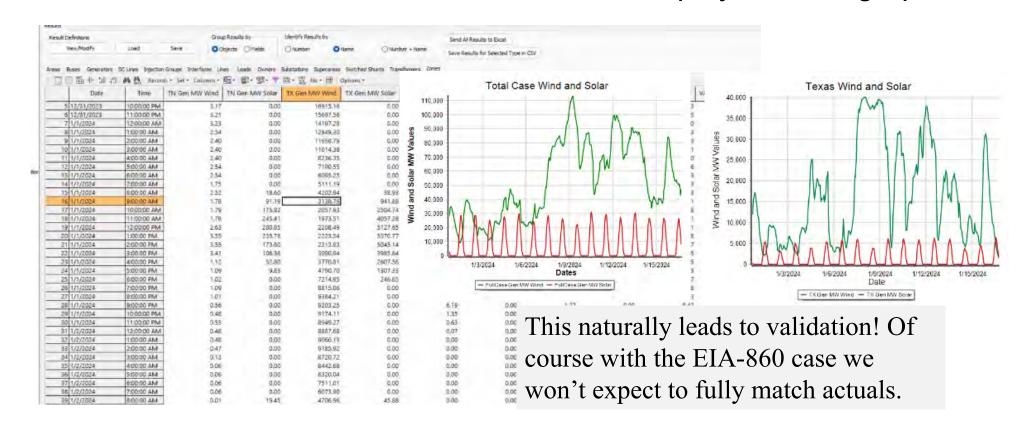
- When running all timepoints there are many options for applying inputs, storing results, and the associated solution type
- Here just the weather is applying, and the solar/wind results for the entire case and the individual states saved



### Results



The results can be viewed in either tabular displays or with graphs



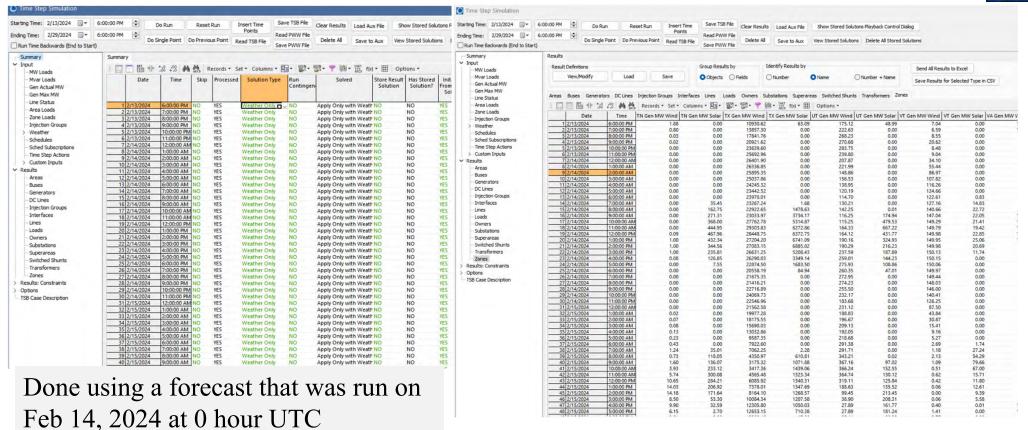
# Cookbook: Estimating US Wind and Solar for Next 15 Days



- If you don't already have PFW wind and solar models in a case, a copper plate case for the US is available at electricgrids.engr.tamu.edu/eia-860-generator-data-cases/
- Get the latest forecast pww from electricgrids.engr.tamu.edu/weather-data/
- Select Tools, Time Step Simulation to show the Time Step Simulation form, click Read PWW File and load the forecast
- Set the Time Step Simulation to store the desired fields (super area and zones with the EIA860; you can load the EIA860OptionsSaveValues.aux included with the EIA860 download)
- In Time Step Simulation set the Solution Type to "Weather Only" and click **Do Run**

# Cookbook: Estimating US Wind and Solar for Next 15 Days

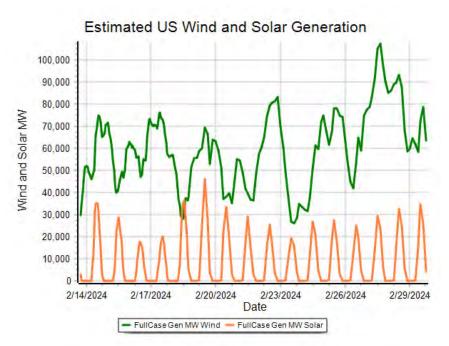


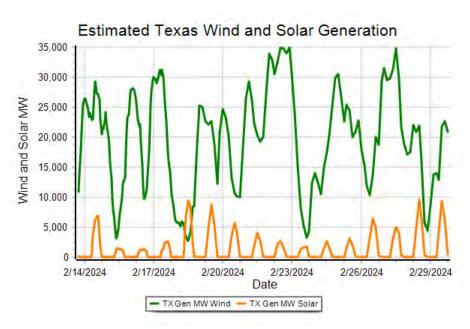


# Cookbook: Estimating US Wind and Solar for Next 15 Days



 These estimates are far from perfect, but they were done quickly using free public information, and they can certainly be improved; key takeaway is this functionality is available now





### **Validation**



- An important aspect of this work is validating the results by comparing the simulated values with actual results
  - This can be at an aggregate level (e.g., state level using EIA data) or at an individual plant level using
  - Errors can arise because of actual weather differences and because of inaccurate models
- We recently submitted a four page digest to the Power and Energy Conference at Illinois (PECI) on generator output validation

#### Calculation and Validation of Weather-Informed Renewable Generation in the US based on ERA5 Hourly Weather Measurements

Farnaz Safdarian, Jordan Cook, Seung Jun Lee, Thomas J. Overbye Department of Electrical and Computer Engineering Texas A&M University College Station, TX {fsafdarian, jordancook, sl47745, overbye}@tamu.edu

Abstract-Due to the benefits of direct inclusion of weather extreme weather events. More recent studies, such as [10], measurements in the power flow studies compared to using capacity factors, we introduce a methodology for a precise estimation of renewable energy output based on detailed hourly weather data. This paper presents a strategy for the calculation of wind and solar photovoltaic generation hourly available capacities for wind and solar generators from the U.S. Energy Information Administration data and power models. It validates the calculated capacity of each generator, using detailed publicly available renewable generators' power outputs. These calculated outputs and the reported capacity factors are compared and the results are shown for the largest renewable generators in the United States.

Index Terms-renewable generation, weather data resources, validation, power systems planning

#### I. INTRODUCTION

explore the significance of weather in evaluating the resilience of nower system infrastructure.

With the growing interest on incorporating weather data into the planning and operational strategies of power systems, previous work [11] suggested directly integrating weather measurements into power flow calculations. The researchers in [11] applied historical weather data from organizations like the International Civil Aviation Organization (ICAO) and the World Meteorological Organization (WMO) [12], [13]. However, these data sources often lack completeness and fail to cover all relevant meteorological parameters crucial for power systems, such as wind at both 10 meter and 100 meter elevations, "Total sky direct solar radiation at surface" or "direct horizontal irradiance", and "Surface Solar Radiation Renewable energy, a growing component of power gener- Downwards" or "global horizontal irradiance" which are required for calculation the newer outputs of wind turbies

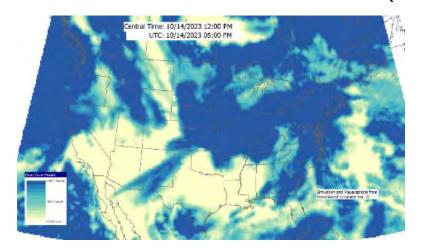
## **Some Potential Additional Models**

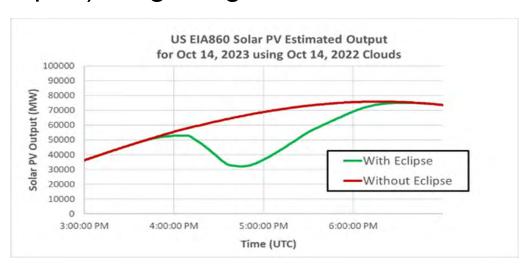
- With weather information a part of the power flow a wide variety of additional power flow model enhancements become possible. Some examples are given below, recognizing that many are already done using external analysis
  - Transmission line limits that depend on temperature, wind and insolation along the right-of-way; working with industry we already have some quite sophisticated models
  - Transformer limits
  - Load models (recognizing that the load depends on many factors, initial models could be linearizations about a specified value)
  - Line resistance (though this would be more complex since it is operating point dependent
  - Etc.

## Other Resiliency Events



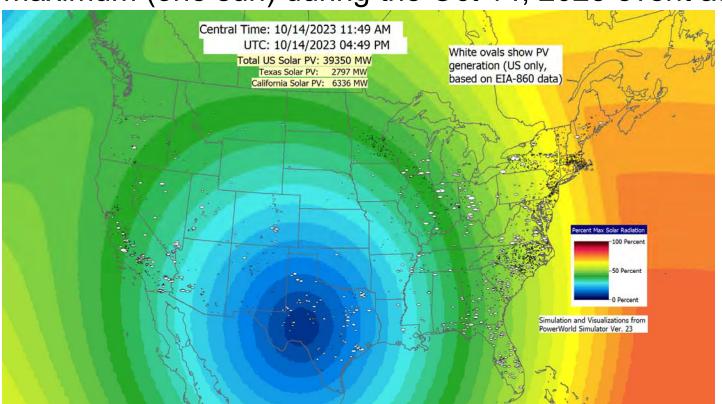
- A similar process can be used for modeling the impacts of other resiliency events
- An example of a relatively benign event is a solar eclipse, something that occurred in North America on 10/14/23, and will occur on 04/08/24
- Thanks to Zach Zornes (Chelanpud) for getting us started on this!!





## Other Resiliency Events, Eclipse, cont.

 Image shows the estimated solar radiation as a percentage of maximum (one sun) during the Oct 14, 2023 event assuming no clouds



## Future Directions – Joining Project IAB



- There are many future directions to pursue
  - A number of models that relate weather to electric grid values already exist, but more certainly should be developed
  - More validation!!
  - Increased automation of the updating process; maybe more footprints
  - Machine learning applications given lots of potential operating points
  - Determining the required level of weather details; higher resolution datasets are available; also other potentially severe resiliency events
- We are in the process of developing a large proposal in this area, and would love to have some more industry partners join the team, including being on an IAB and perhaps being demonstration sites
- For more details email me (Overbye@tamu.edu)

## **Thank You! Questions?**

Recent papers are at overbye.engr.tamu.edu/publications/ For questions afterwards email at overbye@tamu.edu or overbye@powerworld.com

