Notes & Reflections on PV_Hokk Coding

Notebook: Var Notes

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Author: mhd3ella@yahoo.com

URL: https://www.data.jma.go.jp/obd/stats/data/en/smp/index.html

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Rank the RMSE based on hour (to check if NWP's initialization time affect the accuracy). I think this already shown in 16 hours forecast results after run XGBoost models, the noon hours with highest error or less accurate.

Use mean of the year at which the forecasts generated.

Note about which intervals of 8 intervals are most challenging was based on nRMSE which is depends on Normalization by mean of solar power. So the intervals of sunrise and sunset are with lower mean of solar power and that's why they have higher nRMSE. The criterion that indicates the most challenging intervals should be MSE. I think the intervals at noons are most challenging to forecast and worth improving.

First of all,, there is another evernote about the contests and the approaches "Invitation for' PV in HOKKAIDO Contest " hosted by TEPCO and HEPCO, Best Models for Predicting Power Output of Solar Power Plants in Hokkaido " [T-contest-2]"

Comment on weather data accessibility from Judges on other contest on load forecasting (it seems need a vendor/provider to buy the data from)

https://cuusoo.com/projects/50136/challenges/result

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But this below Japanese website from the load forecast report seems have data daily, month, year (in Japanese language) http://nlftp.mlit.go.jp/ksj-e/index.html

Try the global or American websites (saved in data collection presentation)

In the Q&A section of the PV contest description: https://cuusoo.com/projects/50369

Q. Why predict the past?

A. Since the actual values of power output of solar power plants are not open to the public, **participants are to predict power output of solar power plants using meteorological actual data etc**. In this contest, we are seeking methods to accurately predict the power output from the given sources.

The following paper from japan and mentioned in data collection PPT file as a study of solar power variability:

Murata, A., Yamaguchi, H., & Otani, K. (2009). A method of estimating the output fluctuation of many photovoltaic power generation systems dispersed in a wide area. *Electrical Engineering in Japan, 166*(4), 9-19. (Cited by 82) The following papers are mentioning Hokkaido and have some results, in Mendeley:

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Forecasting wind gusts in winter storms using a calibrated convection-permitting ensemble, (COSMO-DE-EPS system contains
various members from global models of four centers: ECMWF, DWD, National Centers for Environmental Prediction and JMA)

- Plot the PV power figs by plot or ggplot of the hourly variability with x-axis dates (not numerical values) ...Done (It seems the power from S1 is more consonant than S2, since S2 at July 2016 has several low output, why? more likely it is not weather since teh S1 and S2 should be depended in weather. The reason could be rooted to the operational conditions, so that the operational condition of PV systems in S1 and S2 could be included as an input feature for forecast the solar power.)
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 checking them by summary (min, max, mean, iqr, etc.)..Done (It's not necessary that by detrending the variability becomes
 less, actually the variability could increase. But it is obvious that the seasonality is removed and the data become more
 stationary.)

Std for PV S1 at 12:00

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0.2995686 0.3084343 0.2833698
Std for PV S1 at 07:00

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...

- Should the values of the trended data that are greater than 1 replaced by 1, **ypd[ypd>1]<- 1**, or there is no necessary, because that could leadd to confusion in the transforming back after the forecasting?! (To solve this issue of values of detrend>1 I found using hours each 10 or 14 days better than 7 days in the filter: **df_h\$\$1=runmax(df_h\$\$1,14)**
- Include the albedo and check its effects on the solar power in the historical data, because Hokkaido is snowy region.
- To convince about the model complexity provide with and without results and improvement in forecasts skill. Such as using post processing approach to adjothe surface solar radiation from NWP(s) with its ground measurements and then using this approach to a adjust solar radiation at the locations of PV plants for further spatial refining.
- http://gpvjma.ccs.hpcc.ip/~qpvjma/ (Archive GPV-MSM from JMA)
- Weather Forecasts: https://www.meteoblue.com/en/weather/archive/yearcomparison/tokyo_japan_1850147
- Tables of Monthly (not hourly) Climate Statistics https://www.data.jma.go.jp/obd/stats/data/en/smp/index.html
- meteorological mesoscale model (MSM) https://www.jma.go.jp/jma/en/Activities/nwp.html
- Wunderground: https://www.wunderground.com/hourly/jp/sapporo?cm-ven=localwx-hour
- https://stackoverflow.com/questions/3200984/where-can-i-find-historical-raw-weather-data?rq=1 (**Stackoverflow question about where can raw weather data be found)

Part 1. How to Use the Wunderground API · initialstate ... - GitHub

https://github.com/topics/weather-underground

https://github.com/Solcast/howto-pandas (Github How-To Solcast - Python, Pandas, MatPlotLib, and PvLib/ Japan)

https://wiki.solargis.com/display/public/Solargis+API+User+Guide

- https://opendata.stackexchange.com/questions/5225/is-there-a-public-web-service-that-will-provide-hourly-forecasts-of-the-solar-ra
- https://opendata.stackexchange.com/questions/297/how-does-one-parse-weather-data (weather forecasts, data parse)
- https://stackoverflow.com/questions/6264196/parse-weather-forecast-data-from-the-ndfd-in-c-sharp (weather forecasts, data parse in C#)
- https://www.geeksforgeeks.org/python-find-current-weather-of-any-city-using-openweathermap-api/ (**Latest data parse of weather forecasts, it is useful for python scripts. BUT historical forecasts are not free. mhd3ella@yahoo.com, a...4)
- https://github.com/ZeevG/python-forecast.io (Github for weather data parsing. Darksky: mhd3ella@yahoo, Mh...3+, Secret Key: 4c1d8ffee5fc3ba8762c24c23f084a52)

- https://stackoverflow.com/questions/53186669/is-there-a-free-historic-weather-data-api-with-latitude-longitude-support (Stackoverflow code of Dark Sky)
- https://github.com/jacobtomlinson/datapoint-python (similar to Dark Sky UK weather data via the Met Office's open data API known as Datapoint).
- https://nomads.ncdc.noaa.gov/data/qfsanl/ (GFS model archive)
- https://pypi.org/project/weather-api/ (For python scripts for weather data parsing)
- https://opendata.stackexchange.com/questions/297/how-does-one-parse-weather-data (Answered by Jeanne Holm, she is an expert on open data, API, Data.gov and NASA/JP.)
- https://stackoverflow.com/questions/51313039/historical-weather-data-from-python-noaa-sdk-api-and-generator
- https://www.cpc.ncep.noaa.gov/products/wesley/wgrib2/compile_questions.html (compiling wgrib2 and info about Netcdf4)
- https://towardsdatascience.com/how-docker-can-help-you-become-a-more-effective-data-scientist-7fc048ef91d5 (since most function are based on Linux with weather data, see Docker to change the operation system virtually...."How Docker Can Help You Become A More Effective Data Scientist".
- Think of using just the weather data of last three months of 2018, Oct, Nov, Dec, in addition to the forecasting month Jan 2019.
- NOTE (Post-processing Approach): I think the adjusting post-processing approach is good option.
 there is two stages for this approach. First, adjust the solar radiation by calibrating it with the solar
 radiation measurements to get adjusted POA solar. Second, use the adjusted solar radiation (POA) for
 solar power forecast at the location of the PV plants. Including both temperature and cloud cover data
 in both stages of this approach, it may be useful to incorporate information about surface
 albedo, aerosol optical depth (AOD), or snow fall in the Hokkaido location. I don't think the
 detrending of diurnal or annual variability might be necessary if the surface solar irradiance was
 provided as input to the forecast models!.
- http://www.soda-pro.com/web-services/meteo-data/gfs-forecasts (Temperature, R.Humidity, Shortwave irradiance (GHI), wind, Snow, from GFS forecasts, as CSV. These forecasts are available for 1 month Only, so I used them for January 2019 at measurement and PV locations. But it is not know which update are they, 00, 6:00,12:00, 18:00?) because they should be at most at 18:00 updates not beyond in this contest.
- At the same website above, there is also MERRA forecasts http://www.soda-pro.com/web-services/meteo-data/merra;isessionid=8AEFB9A88EC61CCCB6D0C19BEFCEA689
- I might look for easier grab website (similar to soda) online archive of GFS solar irradiance forecasts of but the updates should be clear and indicating which time the forecasts are generated each day, to be used in this contest.
- Package PVLIB_Python, especially topic of https://pvlib-python.readthedocs.io/en/latest/forecasts.html (Model data accessed with PVLIB-Python is returned as a pandas DataFrame with consistent column names: temp_air, wind_speed, total_clouds, low_clouds, mid_clouds, high_clouds, dni, dhi, ghi. and Tony Lorenzo Reps in GitHub.
- Also SolarData-master by Dazhi Yang has R code with grib commands for bring weather variable.
- http://iridl.ldeo.columbia.edu/SOURCES/.NOAA/.NCEP/.EMC/.CFSv2/.MONTHLY_REALTIME/.FLXF/.surface/.DSWRF/
- http://iridl.ldeo.columbia.edu/SOURCES/.ISCCP/
- http://www2.mmm.ucar.edu/wrf/users/download/free_data.html (WRF input data).

From: <u>大竹秀明</u>

Sent: Wednesday, February 13, 2019 12:17 AM

To: Mohamed Abuella

Subject: RE: Inquiry about English version of Japan weather data

Dear Mohamed Abuella

Thank you for your e-mail and your inquires on data access GPV-MSM.

JMA provided forecast data freely from the web site of Kyoto University.

However, the information on the data is explained in Japanese in the web site.

Would you have a contact the following address (glob-atmos@rish.kyoto-u.ac.jp)

After Dec 5, 2017, GHI forecasts from GPV-MSM and global model are provided from the database.

You can use the data base freely in the only research field.

Data base http://database.rish.kyoto-u.ac.jp/arch/jmadata/data/gpv/original/ For a commercial use, you can receive the data from the The Japan Meteorological Business Support Center (JMBSC). GPV datasets are not free for a commercial use. http://www.jmbsc.or.jp/en/index-e.html Best regards, Hideaki Hideaki Ohtake Research Center for Photovoltaics National Institute of Advanced Industrial Science and Technology (AIST), JAPAN OSL, Central 2,1-1-1 Umezono, Tsukuba, Ibaraki 305-8568, Japan tel: +81-29-849-1526, fax: +81-29-861-5829 From: Hiromasa Yoshimura Sent: Sunday, February 17, 2019 7:18 PM To: Mohamed Abuella Subject: Re: Inquiry about English version of historical data of Japan weatherforecasts Dear Mohamed Abuella, Hello. I search Web and find a homepage below. http://apps.diasjp.net/gpv/ This is a Japanese homepage, but a download page below is English. http://apps.diasip.net/gpv/cgi-bin/GPVdate2b.sh I hope it helps. Sincerely, Hiromasa Yoshimura ______ Conflicting modification on March 11, 2019 at 08:46:39:

http://database.rish.kyoto-u.ac.jp/arch/jmadata/gpv-original.html

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https://github.com/topics/weather-underground

https://github.com/Solcast/howto-pandas (Github How-To Solcast - Python, Pandas, MatPlotLib, and PvLib/ Japan)

https://wiki.solargis.com/display/public/Solargis+API+User+Guide

- https://opendata.stackexchange.com/questions/5225/is-there-a-public-web-service-that-will-provide-hourly-forecasts-of-the-solar-ra
- https://opendata.stackexchange.com/questions/297/how-does-one-parse-weather-data (weather forecasts, data parse)
- https://stackoverflow.com/questions/6264196/parse-weather-forecast-data-from-the-ndfd-in-c-sharp (weather forecasts, data parse in C#)
- https://www.geeksforgeeks.org/python-find-current-weather-of-any-city-using-openweathermapapi/ (**Latest data parse of weather forecasts, it is useful for python scripts. BUT historical forecasts are not free. mhd3ella@yahoo.com, a...4)
- https://github.com/ZeevG/python-forecast.io (Github for weather data parsing. Darksky: mhd3ella@yahoo, Mh...3+, Secret Key: 4c1d8ffee5fc3ba8762c24c23f084a52)
- https://stackoverflow.com/questions/53186669/is-there-a-free-historic-weather-data-api-with-latitudelongitude-support (Stackoverflow code of Dark Sky)
- https://github.com/jacobtomlinson/datapoint-python (similar to Dark Sky UK weather data via the Met Office's open data API known as Datapoint).
- https://nomads.ncdc.noaa.gov/data/gfsanl/ (GFS model archive)
- https://pypi.org/project/weather-api/ (For python scripts for weather data parsing)
- https://opendata.stackexchange.com/questions/297/how-does-one-parse-weather-data (Answered by Jeanne Holm, she is an expert on open data, API, Data.gov and NASA/JP.)
- https://stackoverflow.com/questions/51313039/historical-weather-data-from-python-noaa-sdk-api-and-generator
- https://www.cpc.ncep.noaa.gov/products/wesley/wgrib2/compile_questions.html (compiling wgrib2 and info about Netcdf4)
- https://towardsdatascience.com/how-docker-can-help-you-become-a-more-effective-data-scientist-7fc048ef91d5 (since most function are based on Linux with weather data, see Docker to change the operation system virtually..."How Docker Can Help You Become A More Effective Data Scientist".
- Think of using just the weather data of last three months of 2018, Oct, Nov, Dec, in addition to the forecasting month Jan 2019.
- NOTE (Post-processing Approach): I think the adjusting post-processing approach is good option.
 there is two stages for this approach. First, adjust the solar radiation by calibrating it with the solar
 radiation measurements to get adjusted POA solar. Second, use the adjusted solar radiation (POA) for
 solar power forecast at the location of the PV plants. Including both temperature and cloud cover data
 in both stages of this approach, it may be useful to incorporate information about surface
 albedo, aerosol optical depth (AOD), or snow fall in the Hokkaido location. I don't think the

detrending of diurnal or annual variability might be necessary if the surface solar irradiance was provided as input to the forecast models!.

- http://www.soda-pro.com/web-services/meteo-data/gfs-forecasts (Temperature, R.Humidity, Shortwave irradiance (GHI), wind, Snow, from GFS forecasts, as CSV. These forecasts are available for 1 month Only, so I used them for January 2019 at measurement and PV locations. But it is not know which update are they, 00, 6:00,12:00, 18:00?) because they should be at most at 18:00 updates not beyond in this contest.
- At the same website above, there is also MERRA forecasts http://www.soda-pro.com/web-services/meteo-data/merra;jsessionid=8AEFB9A88EC61CCCB6D0C19BEFCEA689
- I might look for easier grab website (similar to soda) online archive of GFS solar irradiance forecasts of but the updates should be clear and indicating which time the forecasts are generated each day, to be used in this contest.
- Package PVLIB_Python, especially topic of https://pvlib-python.readthedocs.io/en/latest/forecasts.html (Model data accessed with PVLIB-Python is returned as a pandas DataFrame with consistent column names: temp_air, wind_speed, total_clouds, low_clouds, mid_clouds, high_clouds, dni, dhi, ghi. and Tony Lorenzo Reps in GitHub.
- Also SolarData-master by Dazhi Yang has R code with grib commands for bring weather variable.
- http://iridl.ldeo.columbia.edu/SOURCES/.NOAA/.NCEP/.EMC/.CFSv2/.MONTHLY_REALTIME/.FLXF/.surface/.DSWRF/
- http://iridl.ldeo.columbia.edu/SOURCES/.ISCCP/
- http://www2.mmm.ucar.edu/wrf/users/download/free_data.html (WRF input data).
- https://www.ecmwf.int/en/about/media-centre/fact-sheet-ensemble-weather-forecasting (EPS)
- https://www.youtube.com/watch?v=NLhRUun2iso
- https://www.wis-jma.go.jp/cms/sataid/ (Tried to search about archived data in JMA by Google images)

From: <u>大竹秀明</u>

Sent: Wednesday, February 13, 2019 12:17 AM

To: Mohamed Abuella

Subject: RE: Inquiry about English version of Japan weather data

Dear Mohamed Abuella

Thank you for your e-mail and your inquires on data access GPV-MSM.

JMA provided forecast data freely from the web site of Kyoto University.

However, the information on the data is explained in Japanese in the web site.

Would you have a contact the following address (qlob-atmos@rish.kyoto-u.ac.ip)

After Dec 5, 2017, GHI forecasts from GPV-MSM and global model are provided from the database.

You can use the data base freely in the only research field.

http://database.rish.kyoto-u.ac.jp/arch/jmadata/gpv-original.html

Data base

http://database.rish.kyoto-u.ac.jp/arch/jmadata/data/gpv/original/

For a commercial use, you can receive the data from the The Japan Meteorological Business Support Center (JMBSC).

GPV datasets are not free for a commercial use.

http://www.jmbsc.or.jp/en/index-e.html

Best regards,	
Hideaki	
Hideaki Ohtake	

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From: Hiromasa Yoshimura

Sent: Sunday, February 17, 2019 7:18 PM

To: Mohamed Abuella

Subject: Re: Inquiry about English version of historical data of Japan weatherforecasts

Dear Mohamed Abuella,

Hello,

I search Web and find a homepage below.

http://apps.diasjp.net/gpv/

This is a Japanese homepage, but a download page below is English.

http://apps.diasjp.net/gpv/cgi-bin/GPVdate2b.sh

I hope it helps.

Sincerely,

Hiromasa Yoshimura

http://apps.diasjp.net/gpv/cgi-bin/GPVdate2b.sh (The links of the app mentioned above but the capacity is limited 2 Gb., and its for globe so I didn't figure out how to download the certain location's data)

http://apps.diasjp.net/gpv/cgi-bin/uncgi.cgi/GPVdate1a.sh

http://apps.diasjp.net/gpv/cgi-bin/uncgi.cgi/GPVdate3a.sh

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https://ds.data.jma.go.jp/ghg/kanshi/co2data/co2 mapdata e.html (Archived climate CO2 data from JMA, it could leads to archived data for weather variables as well)