COMPARISON OF SHORT-TERM SOLAR IRRADIANCE FORECASTS FROM ALL SKY IMAGERS AND SATELLITE IMAGES

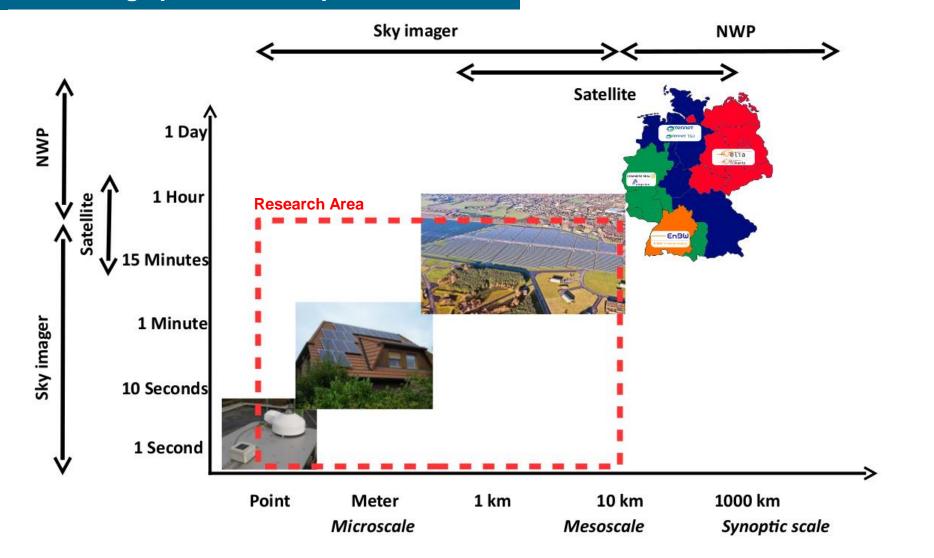
Thomas Schmidt, Jonas Stührenberg, Niklas Blum*, Jorge Lezaca, Annette Hammer, Marion Schroedter-Homscheidt, Thomas Vogt

DLR Institute of Networked Energy Systems (* and Institute of Solar Research)

Solar irradiance forecasts



Towards increasing spatial and temporal resolution



Cloud camera and meteorological network

- 30 All-Sky Imager (ASI) installed in north-west Germany
 - With 12 stations equipped with meteorological equipment
- covering ~110km x 100km area in north-western Germany
- Low density in rural area covering low voltage distribution grid
- High station density in city of Oldenburg





50 km

Thomas Schmidt, DLR Institute of Networked Energy Systems, ICEM conference, 29th June 2023

Instrumentation



Meteorological sensors

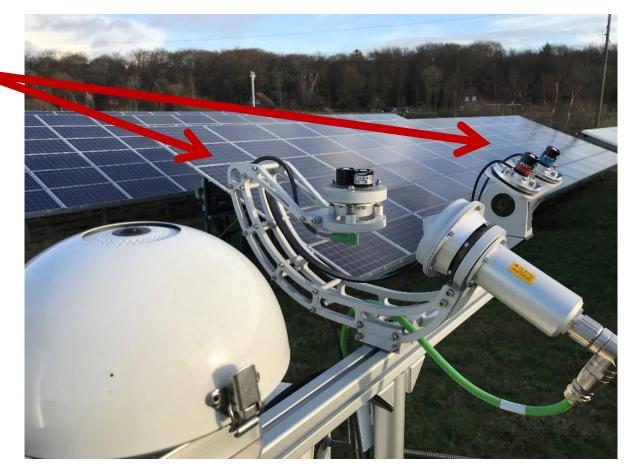
- Solar irradiance sensors (GHI, DHI, DNI, GTI)
- Air temperature and humidity

All-sky imagers

- Commercial surveillance camera used
- Fish eye lenses with 180° field of view
- Recording images every 30s

Ceilometers

 6 atmospheric lidars (ceilometer) measuring cloud height



Photography of Eye2Sky station PVNOR

4

Instrumentation



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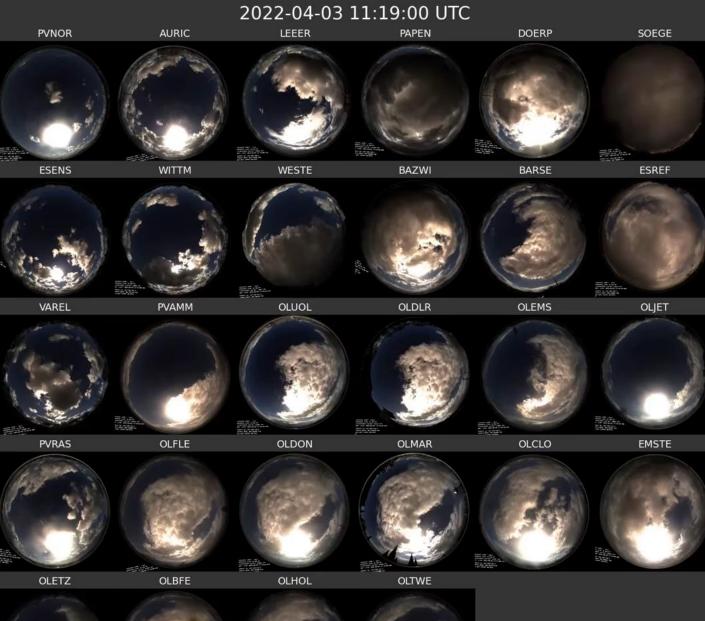
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Photography of Eye2Sky station PVNOR

2 hours of weather seen by multiple fish eye cameras





Why cameras?

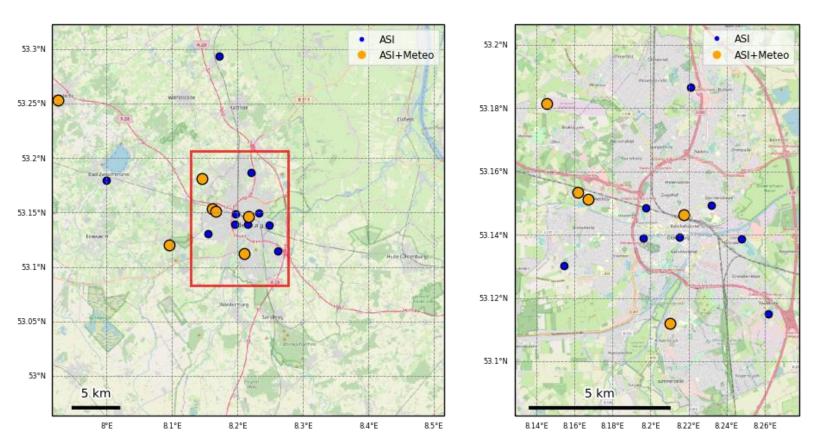


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Solar irradiance nowcast based on ASI-Network



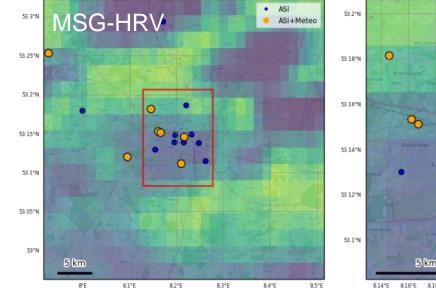
- Nowcasts for 2022 on 40 x 40 km domain (left)
- 17 ASI used
- Evaluation for city of Oldenburg (10 x 12 km, right)
- Grid resolution: 50m



- Nowcasting model for a network of ASI:
 Blum, Niklas (2022): Nowcasting of Solar Irradiance and Photovoltaic Production Using a Network of All-Sky Imagers. Dissertation, RWTH Aachen
 Blum, Niklas et al. (2022): Analyzing Spatial Variations of Cloud Attenuation by a Network of All-Sky Imagers. Remote Sensing, 14 (22), Seite 5685.

Domain comparison with satellite derived irradiance information





 \bigcirc 20°

8.2°E

53.3°N

53.25°N

53.2°N

53.15°N

53.1°N

53.05°N

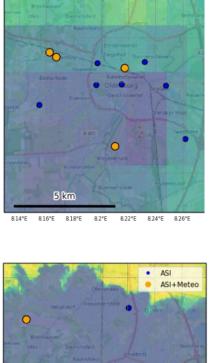
53°N

5 km 8°E

8.1°E

ASI

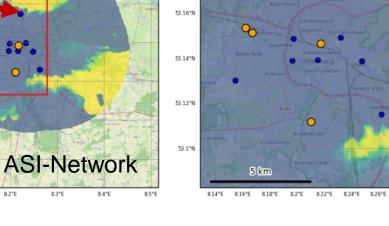
ASI+Meteo



ASI

ASI+Meteo





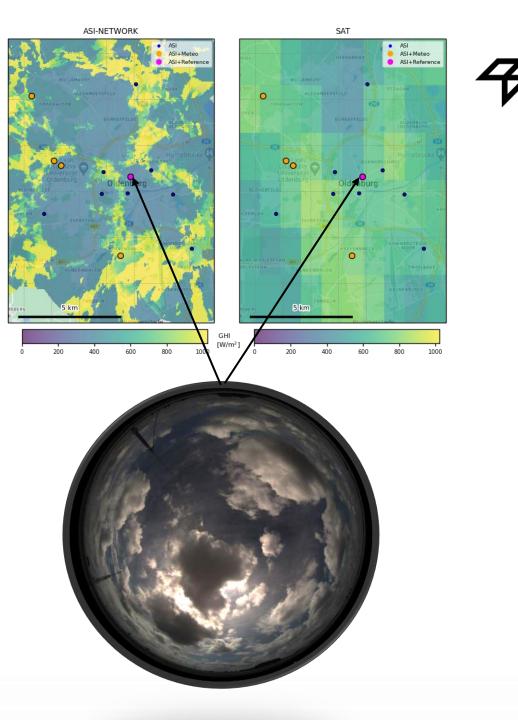
53.2

53.18°N

8

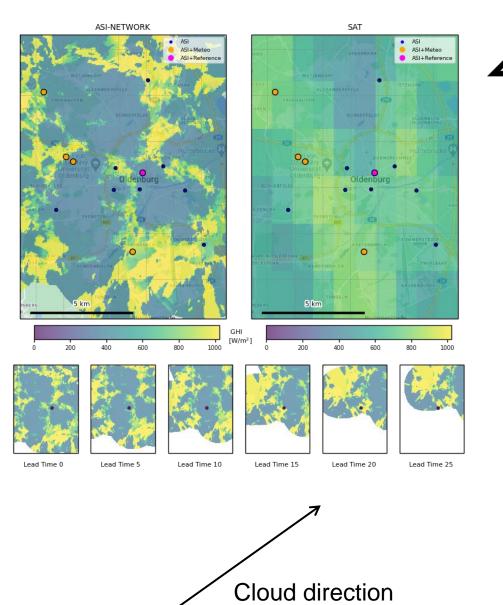
Solar irradiance estimations Example of small scale cloud conditions

- Large differences in cloud/irradiance resolutions between camera and satellite
- Cloud (shadow) projection has large uncertainties -> Difficult to match both scenes / timing and location errors
- Satellite (here MSG-HRV with Heliosat3) method) and other coarse resolution data sources smooth fields and timeseries



Solar irradiance estimations Example of small scale cloud conditions

- Nowcast is result of cloud tracking / motion
- Forecast horizon is limited depending on cloud motion (and height)



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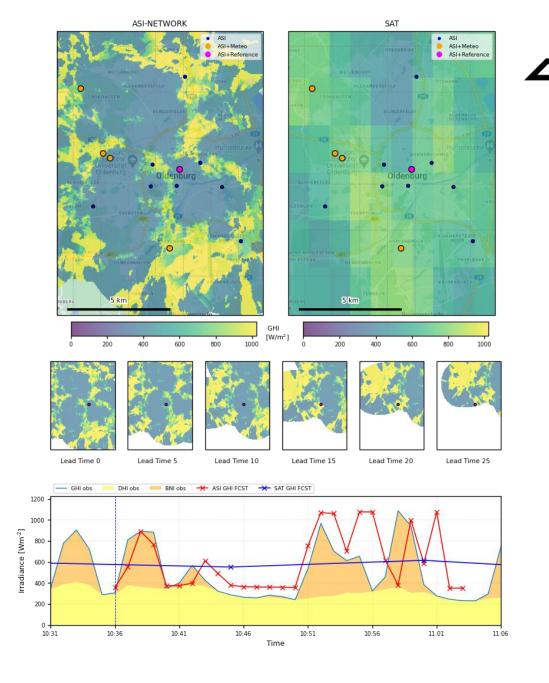
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Solar irradiance estimations Example of small scale cloud conditions

- Nowcast validated for measurement sites show good representation of local cloud induced solar variability, but timing and amplitude errors occur
- Satellited based nowcast (15 minute resolution) predicts smooth timeseries

On one-minute timescale, which nowcast shows lower error metrics at single sites?

What about a hybrid multi data source model?



Camera vs/with Satellite Nowcast validation

Setup:

- Validation on minute level
- Validation against measurements at two distinct independent sites in the domain
- Satellite nowcasts have been interpolated to minute level

Findings:

- nowcasts based on the ASI-network show better performance for 8/13 minutes ahead (RMSE/MAE)
- A linear combination of both nowcasts can reduce nowcast error

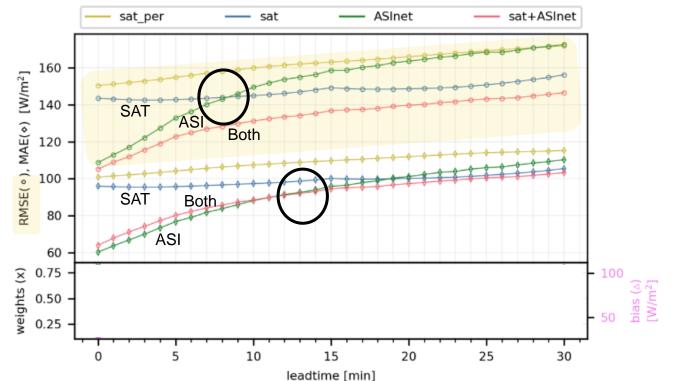


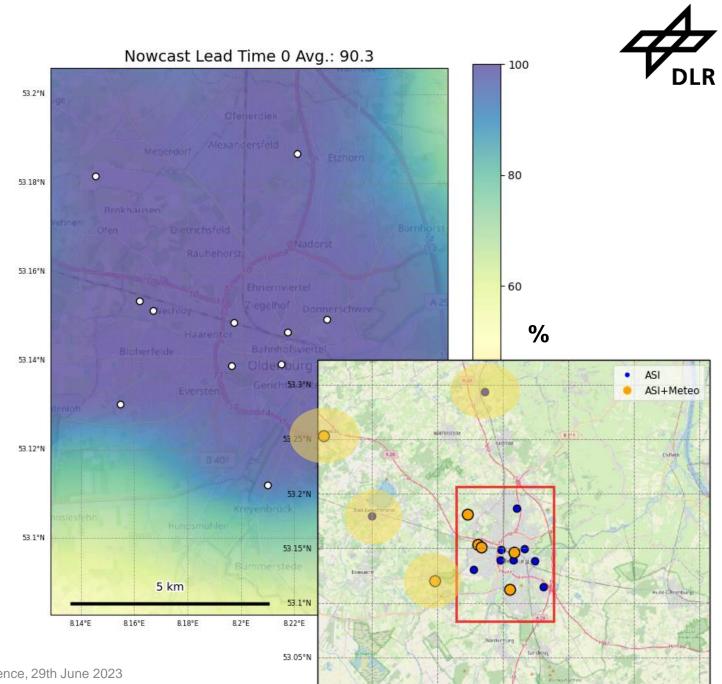
Figure 15. Benchmark for the combined forecast on the nominal synchronization case. **Top**: Error metrics $RMSE(\circ)$ and $MAE(\diamond)$. **Bottom**: average optimized combination weights(x) and optimized combination bias term (\triangle) in the secondary axis.

- Lezaca, Jorge et al. (2022): High resolution hybrid forecast based on the combination of satellite and an all sky imager network forecasts. EMS Annual Meeting 2022, 04-09 Sept 2022, Bonn, Germany. <u>https://elib.dlr.de/190483/</u>
- Lezaca, Jorge et al. (2022): Methodologies for short-term solar resource forecasting by merging various inputs, Smart4RES Project, <u>https://www.smart4res.eu/wp-content/uploads/2023/01/Smart4RES_Deliverable_D2.3.pdf</u>

Spatial coverage of ASI-Network

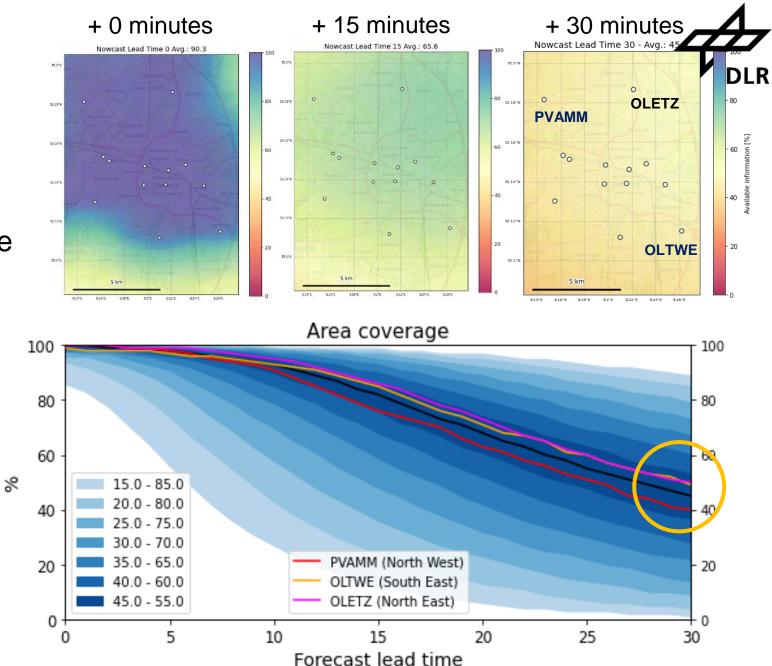
Analysis of 1 year of nowcast runs and the occurence of available information

- Spatial distribution of cameras determines the coverage
- Additional ASI in northwest part out of this domain add information to Oldenburg domain



Spatial coverage

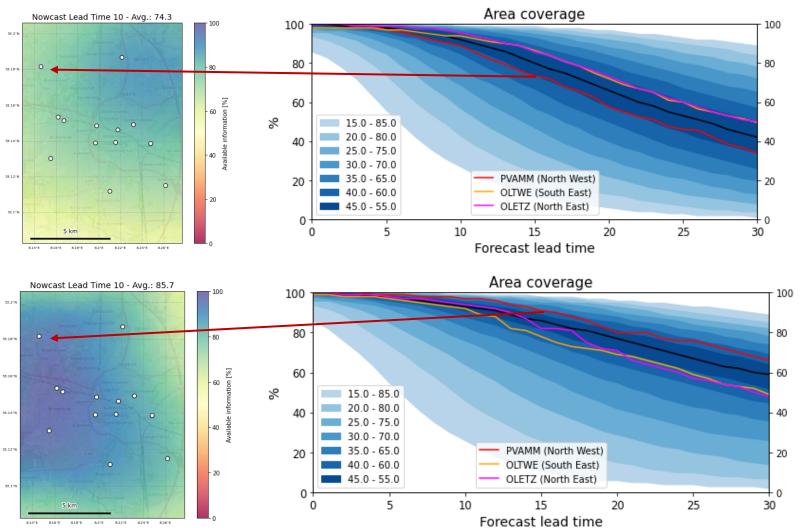
 Large variations in cloud conditions lead to large variations in spatial coverage for all lead times



"A 30 minutes forecast horizon with 50% coverage of the city is reached in about 50% of the time"

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Network coverage depending on cloud motion



10 minutes ahead nowcast

Clouds from west

Clouds from east

Conclusions



Summary

- High resolution and frequently updated solar irradiance nowcasts for an urban area based on a network of cameras have been processed and demonstrated
- A comparison against "low-resolution" satellite based information show the value of high resolution but also weakness in terms of standard error metrics.

Outlook

- Investigate further the value of high temporal and spatial variability information
- Add high-resolution NWP evaluation
- Develop hybrid models for seamless forecasting
- Integrate in Energy System Applications (Distribution Grid, large-scale PV)



Thank you for listening...

Contact us:

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- -> Leader of Eye2Sky laboratory
- -> ASI Network nowcast developer
- -> MSG-HRV Satellite expert
- -> Linear combination of ASI + satellite nowcasts
- -> Group leader of Team Energy Meterology
- -> Department leader (Energy System Analysis)

Website:

https://www.dlr.de/ve/en/eye2sky

Video:

Portrait of Eye2Sky in 5 Min Video

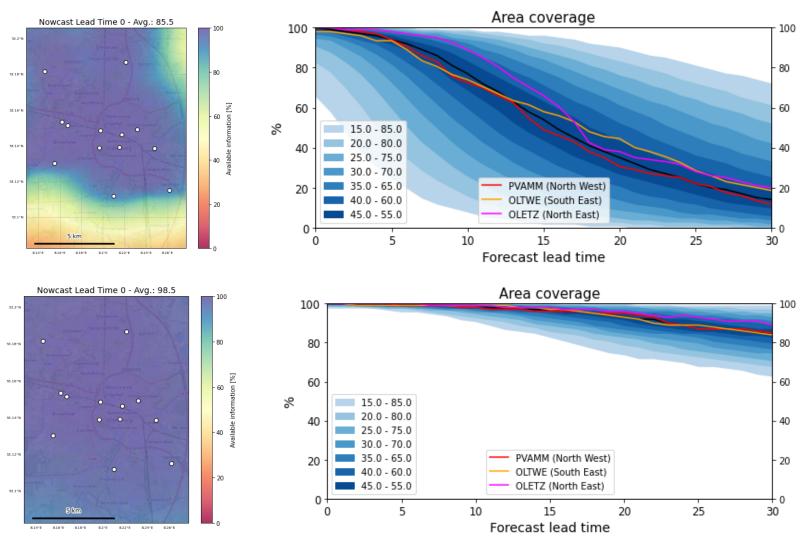
Network coverage depending on cloud base height

Cloud height < 2000m

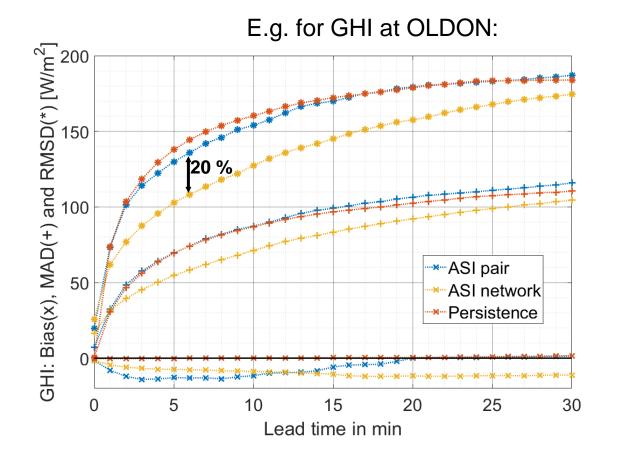
Reduced forecast horizon in low cloud conditions

Cloud height > 4000m

Increased forecast horizon in high cloud conditions



Validation ASI net vs ASI pair forecast



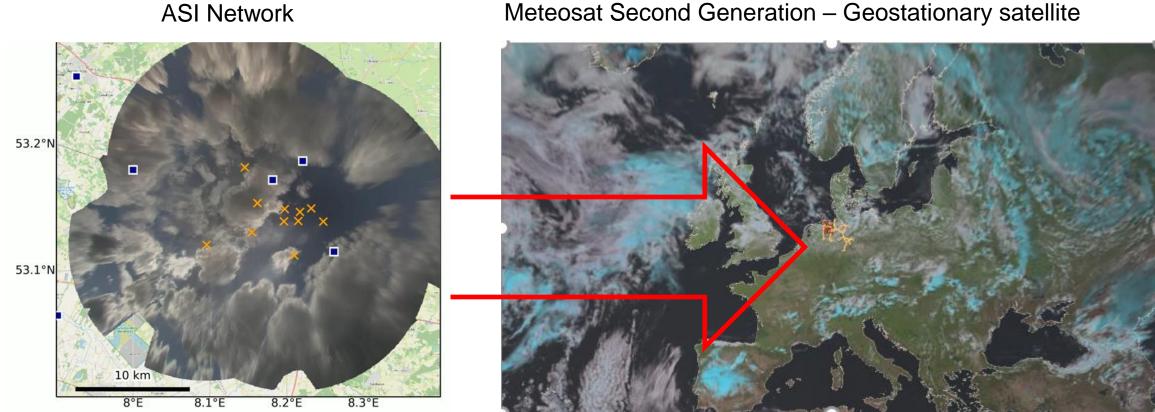
- ASI network forecast presents a relative improvement on RMSD of around 20% between the leadtimes 2 min to 15 min.
- Advantage of the ASI network over the ASI pair and persistence remains for large lead times
- As expected the ASI network outperforms an ASI pair even more clearly at locations farer from the ASI pairs location (not shown here)

[2] Blum, N. B., et al., (2021). Cloud height measurement by a network of all-sky imagers. Atmospheric Measurement Techniques, 14(7), 5199-5224.

Thomas Schmidt, DLR Institute of Networked Energy Systems, ICEM conference, 29th June 2023

Clouds - observed from ground and space

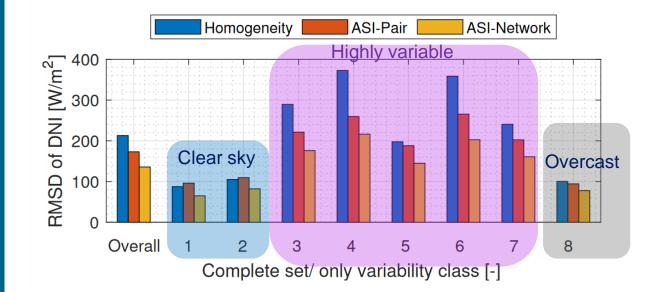




- Temporal resolution: (ASI-Network 30 seconds, MSG-Satellite 15 minutes)
 Spatial resolution: (ASI-Network 50 meters, MSG-HRV ~1.5 kilometres
- Thomas Schmidt, DLR Institute of Networked Energy Systems, ICEM conference, 29th June 2023

Validation at OLUOL on DNI using variability classes





- ASI pair predicts DNI at OLUOL more accurately compared to homogeneity under most conditions
- ASI network has clear advantage over homogeneity & ASI pair under all conditions
- Improvements related to combination of perspectives and also to method to assign transmittance