

Automated yaw misalignment detection based on satellite imagery and numerical weather models

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Tipspeed

Yaw misalignment can be assessed within 2.5° using standard 10 min SCADA, and no external sensors.

INTRODUCTION

Yaw misalignment, the average difference between the orientation of a wind turbine rotor and the wind direction, can cause underperformance. Current techniques evaluating yaw misalignment are not fully satisfactory:

- External sensors such as lidar are very accurate but hard to scale
- SCADA-based analytics do not perform equally well on all types of turbines and sites, and are dependent on input data quality

METHOD

We present a sensor-free method improving upon current datadriven techniques by using high-resolution satellite imagery and numerical weather models:

1. Correct SCADA nacelle direction with satellite imagery

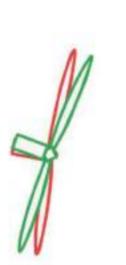
 High-resolution images are used to systematically verify or correct each turbine's SCADA nacelle direction within a few degrees





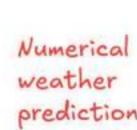


Corrected SCADA
nacelle direction
timeseries

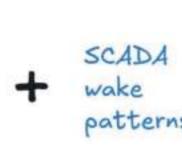


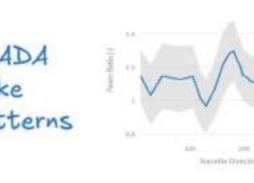
2. Predict wind direction via numerical weather models

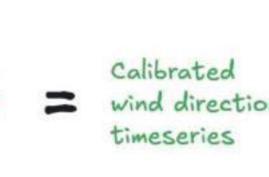
 Wind and wake timeseries are generated for each turbine, calibrating wind direction against available observations

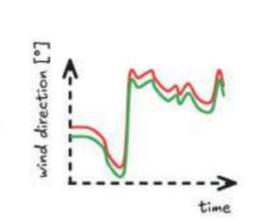








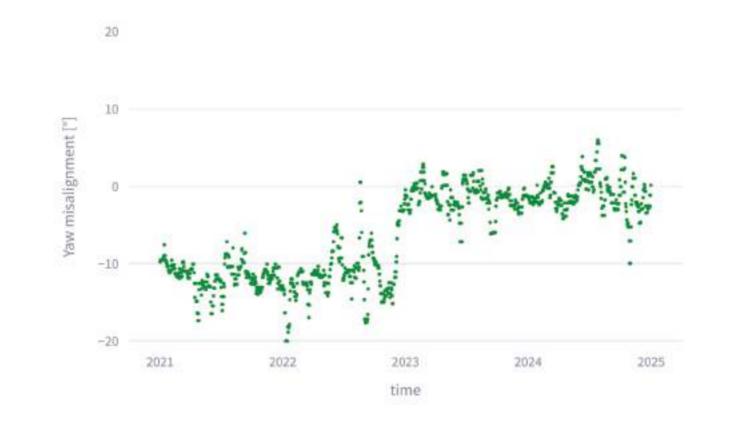




3. Compute yaw misalignment

- Calculated as the difference between nacelle direction timeseries (step 1) and wind direction timeseries (step 2)
- Results are available for each turbine (left), including evolution over time (right)



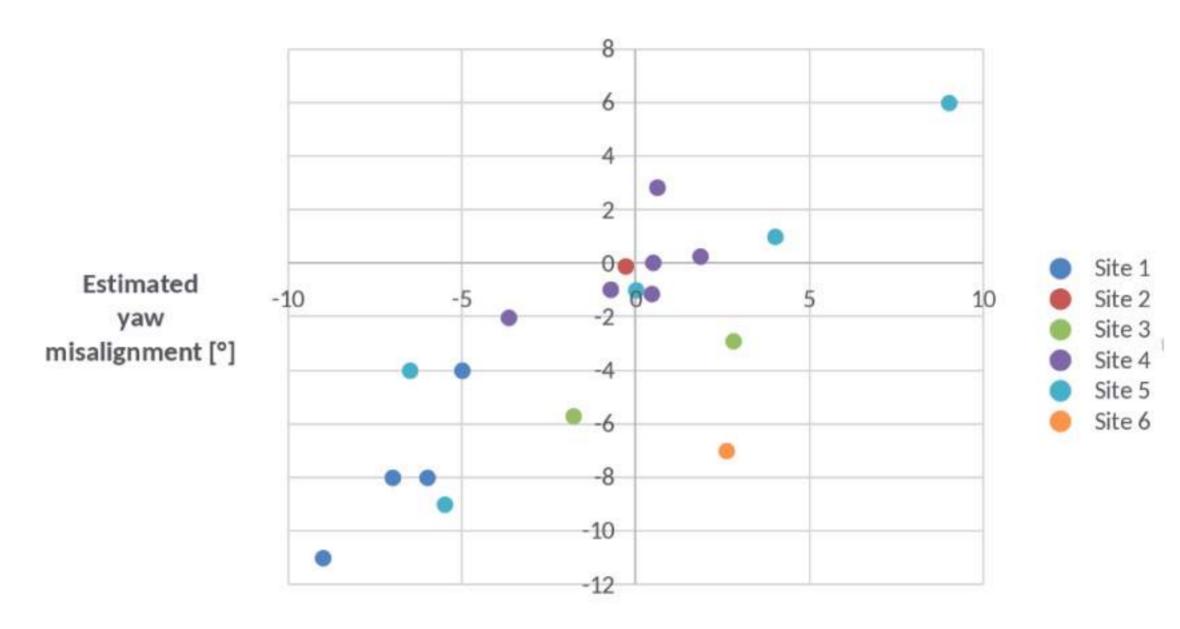


VALIDATION

We conducted **19 blind tests** with several customers across 6 sites on 2 continents, covering varied terrain complexity and turbine models. All turbines were previously tested with nacelle-mounted lidar. After we estimated the yaw misalignment using our method, the lidar results were provided for comparison.

Average yaw misalignment

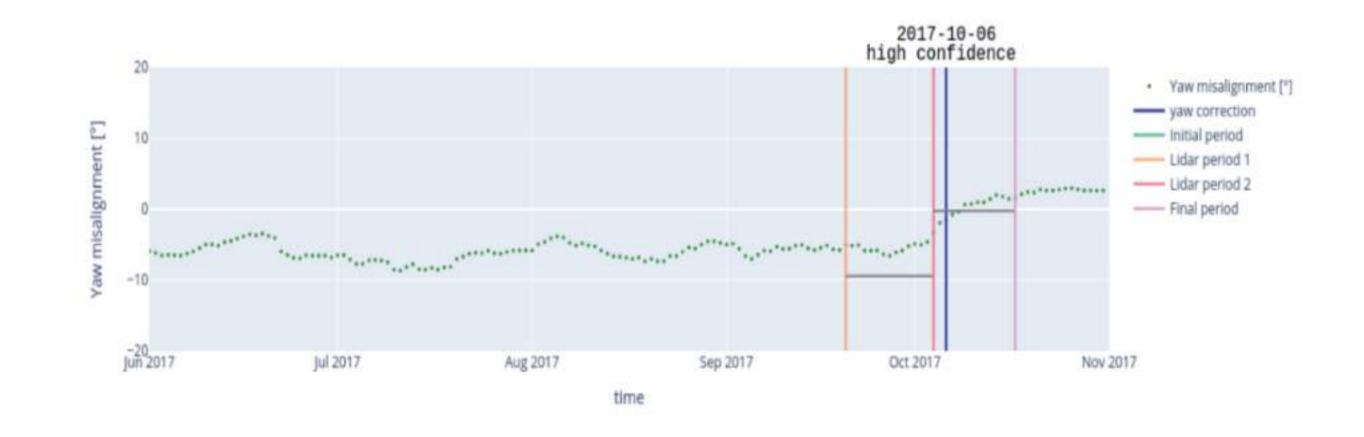
Results indicate a good correlation and a 2.5° uncertainty (mean absolute error) relative to lidar. One site showed a larger deviation, which we plan to investigate further.



Nacelle lidar yaw misalignment [°]

Detection of changes

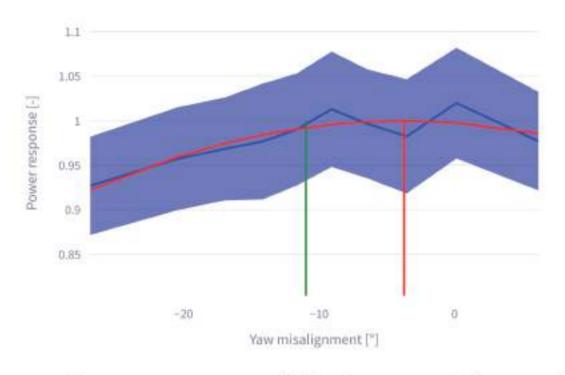
In two of the sites, we demonstrated that the method detects changes of yaw misalignment within a few days, indicating potential for monitoring.



OUTLOOK: optimum misalignment

The yaw misalignment that maximizes power output is not necessarily 0°.

By analyzing power response as a function of yaw misalignment, we can determine the optimal setting.



Power response (blue), current (green) and optimum yaw misalignment (red)









