

# Quantifying soiling losses for an industrial-scale photovoltaic plant

**A project for Nispera AG.**



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Dave Lonsdale**

# Introduction to the team

Daniel Gisler



- MSc Geography at University of Zurich
- Several years of working experience as a consultant and data analyst in real estate field
- Looking for projects (also open source) and part time positions

Konstantinos Kirtsonis



- MEng Civil - Structural Engineering
- Experience working with Geospatial data and operating systems
- Searching for a position/internship as a Data Scientist

Dave Lonsdale



- MEng Manufacturing Engineering at University of Cambridge (UK)
- Experienced strategy consultant in telecoms industry
- Managed and executed commercial and technical analytical projects
- Looking for opportunities in Data Science field

# Business problem: quantify the energy losses due to *dirty* panels

<b>Soiling:</b>	slow accumulation of dirt, dust etc. on panels leading to energy losses
<b>Range:</b>	3-39% per annum observed in Chile
<b>Locally:</b>	~3% per annum in Atacama desert

## Photovoltaic plant - Atacama desert



- Peak power: 100 MWp
- 0.4% of national installed capacity

**A surprisingly difficult problem to answer using indirect data  
=> no commercial solution in the market**

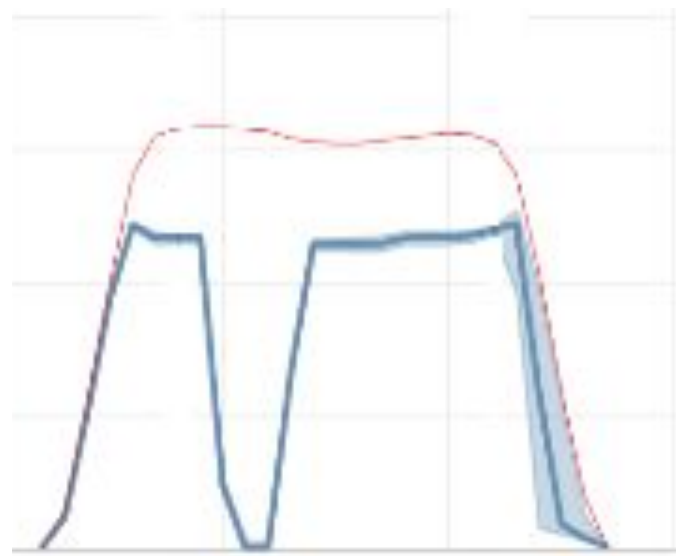
1: Cordero, R.R., Damiani, A., Laroze, D. et al. Effects of soiling on photovoltaic (PV) modules in the Atacama Desert. Sci Rep 8, 13943 (2018).

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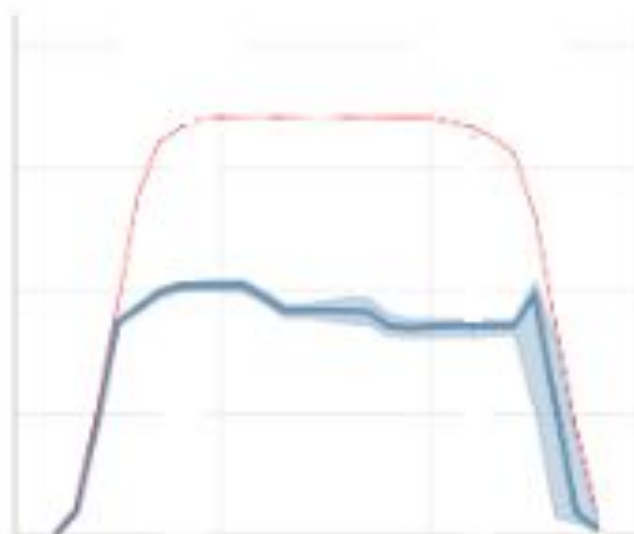


# Other factors that decide efficiency of solar panels

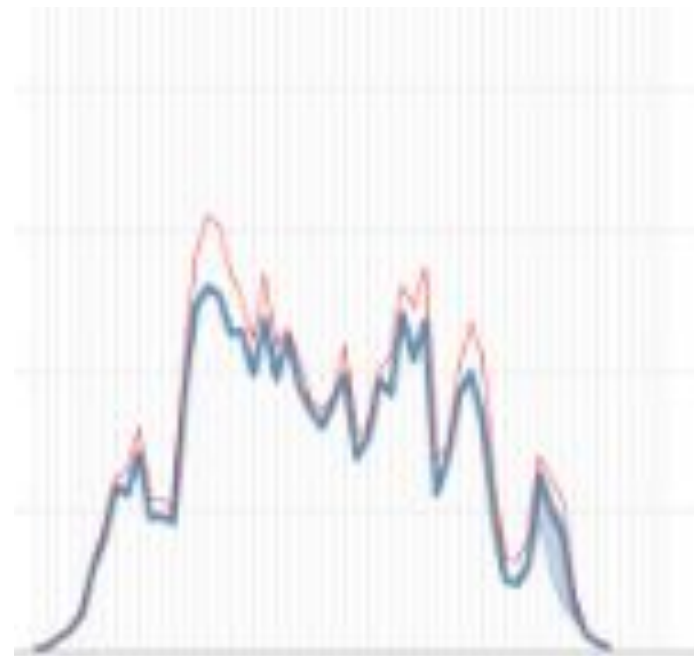
- **Disconnecting:**



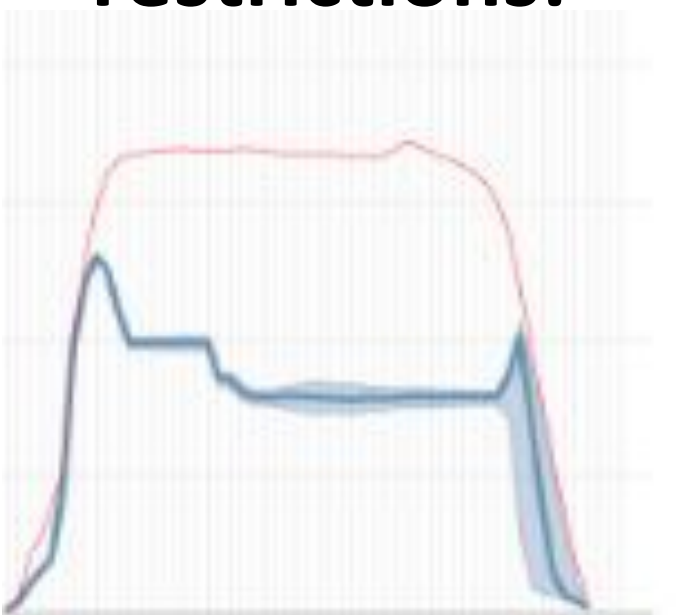
- **Underperformance:**



- **Cloudy days:**



- **Technical restrictions:**



- 



**Temperature effect:**  
As temperature drops  
the efficiency of the  
panels improves

- 



**Panel Degradation:** Drop in  
efficiency as panels age  
(0.5%/year)

— Actual energy  
— Expected energy

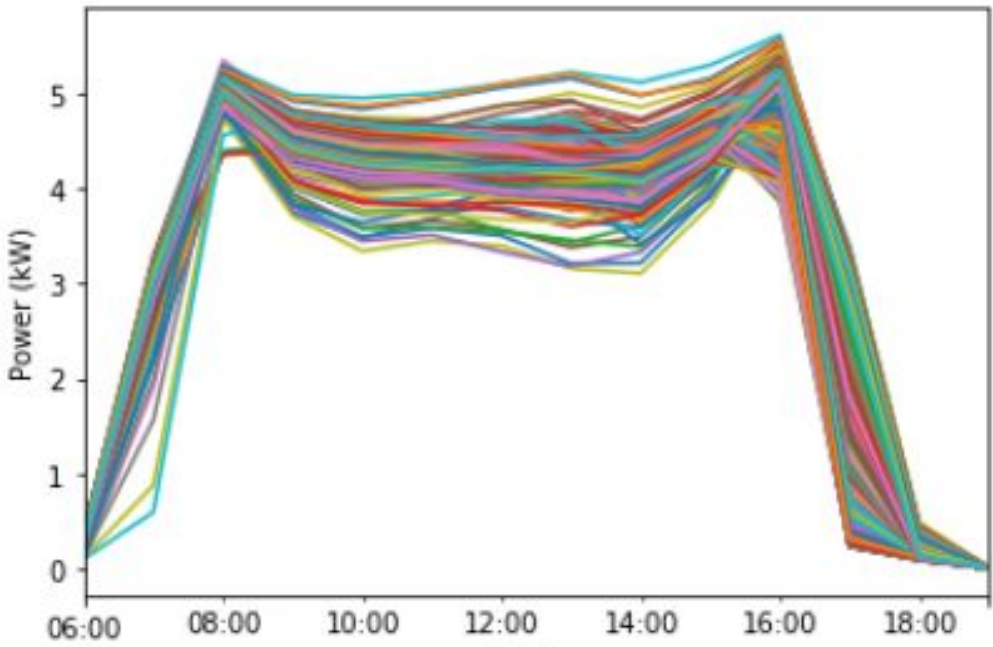


# How to filter out all those other factors?



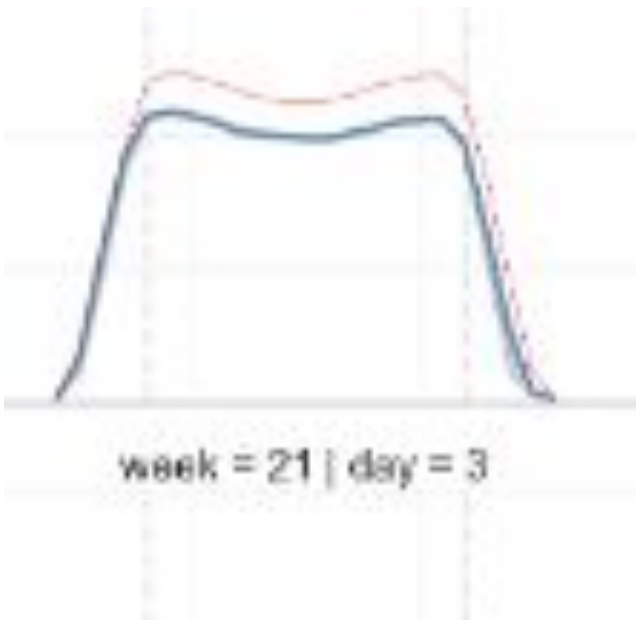
1 string contains 20 solar panels

- Actual energy profile
- Expected energy profile

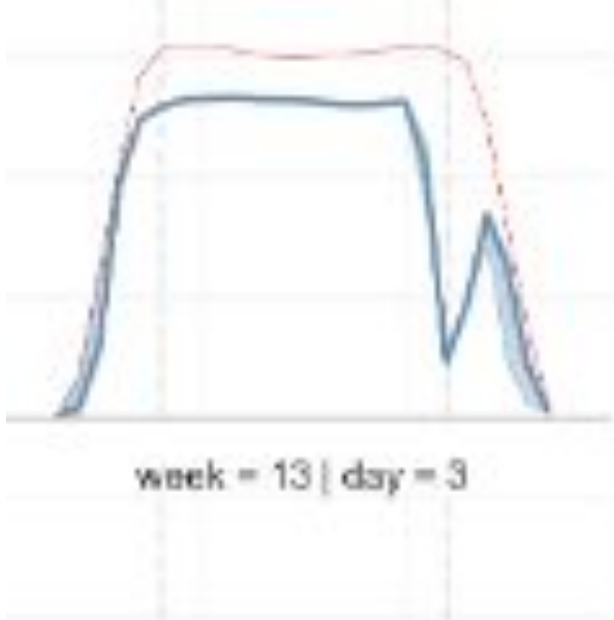


380 daily string profiles

Good performance:



Poor performance:



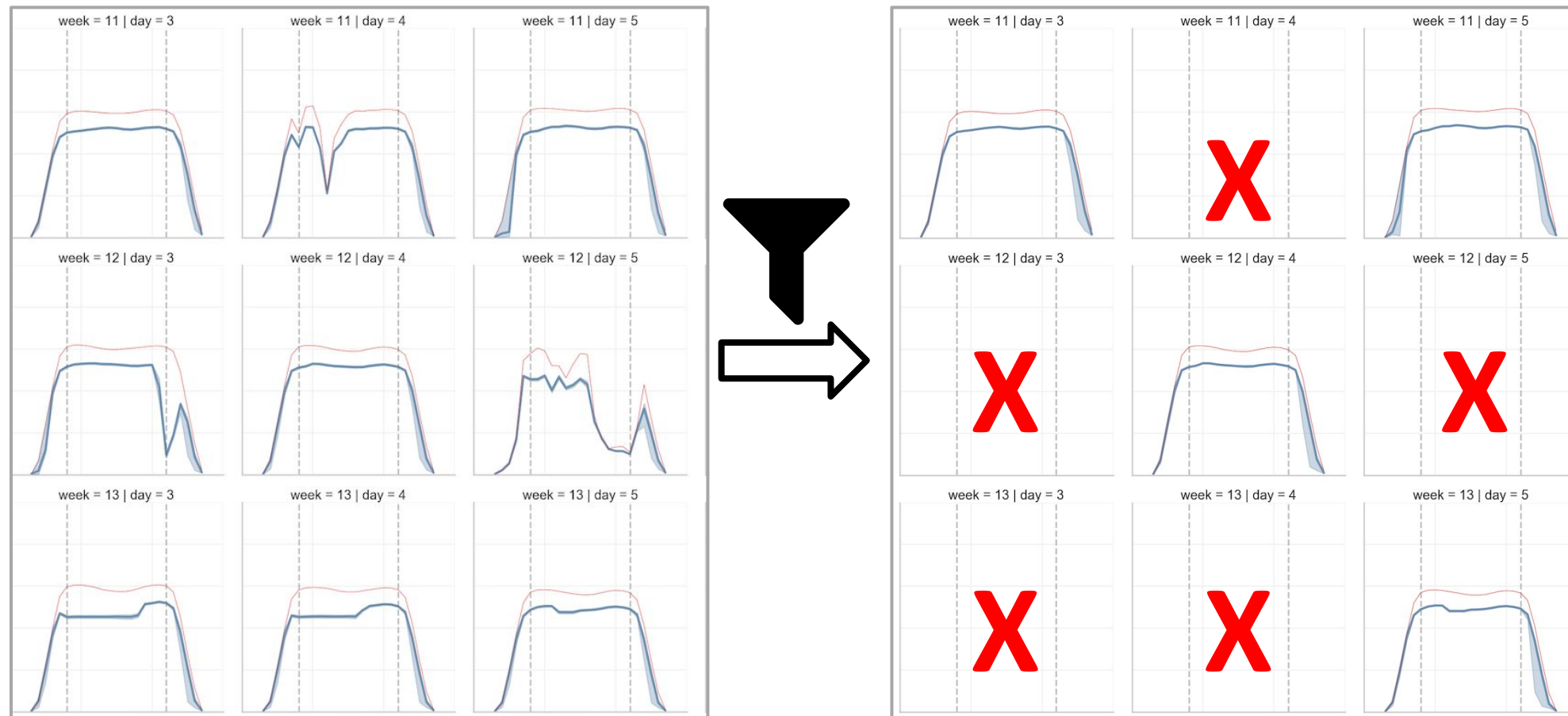
Filtering result:

Selecting good strings and removing the mentioned factors



# Our toolkit filters for good days and good strings, reducing noise

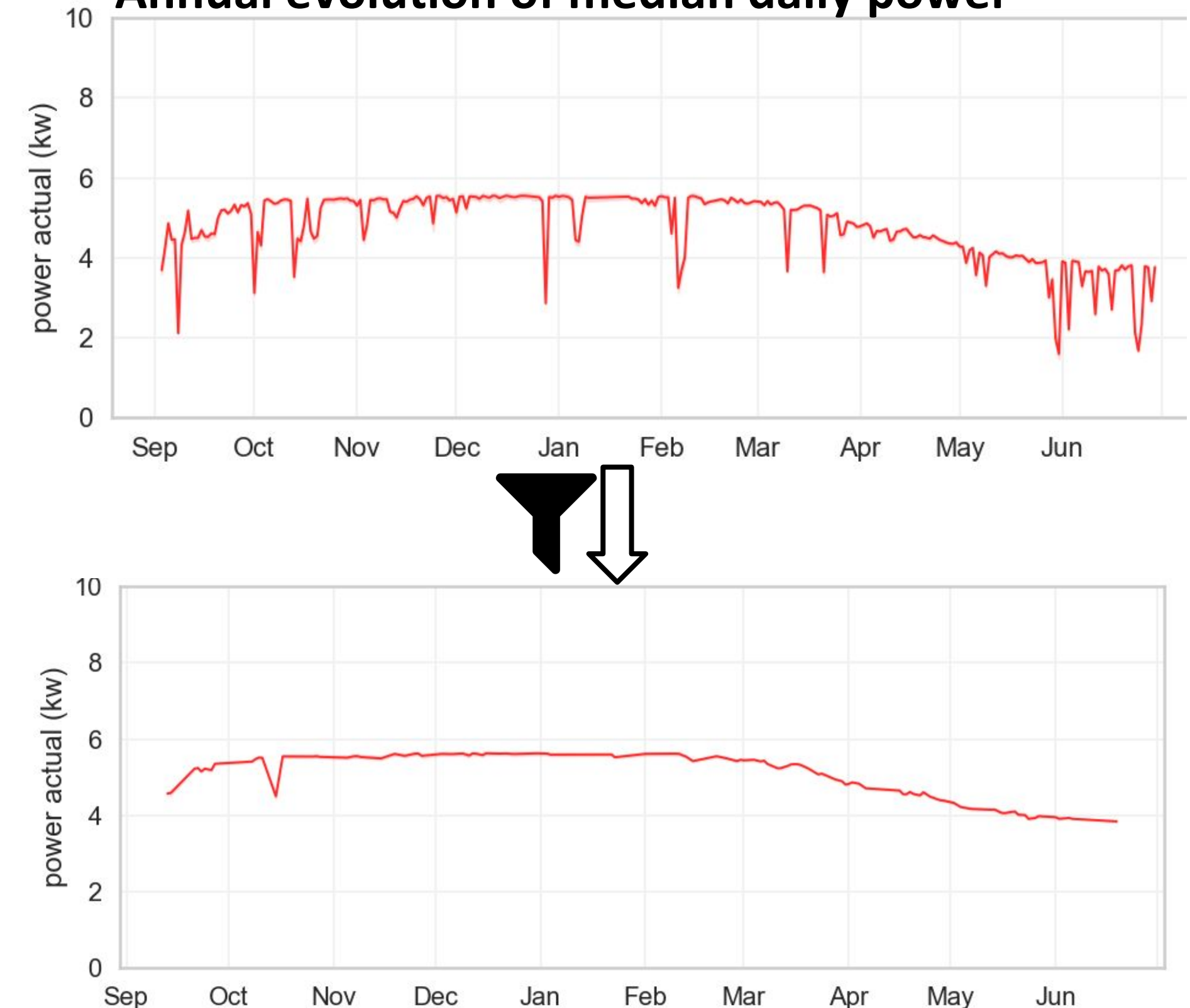
## Daily view of irradiance and strings



## Automatic filtering of good and bad strings

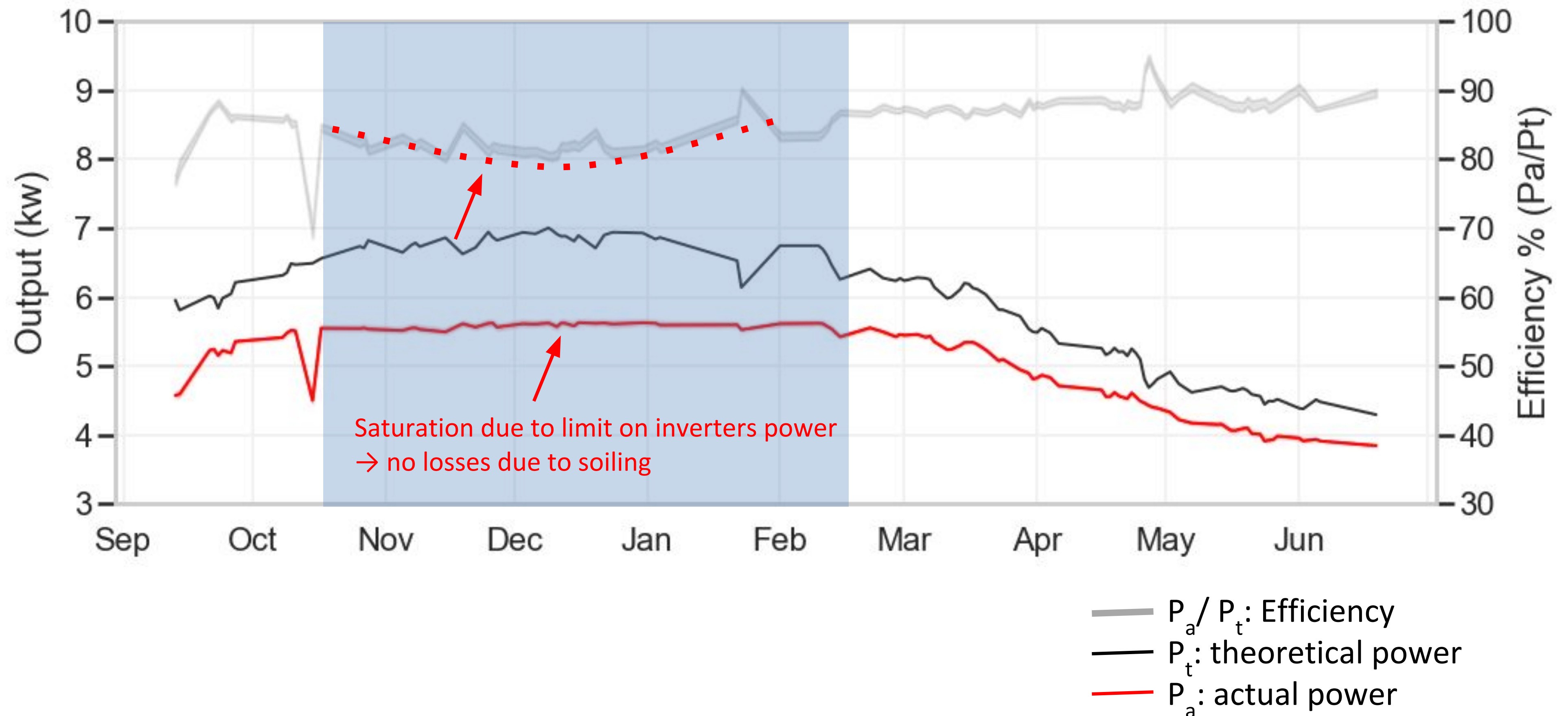
- can easily be applied to other power plants
- a set of different filtering methods to choose
- integration of new methods is possible
- significantly reduces noise in the time-series data

## Annual evolution of median daily power <sup>1</sup>

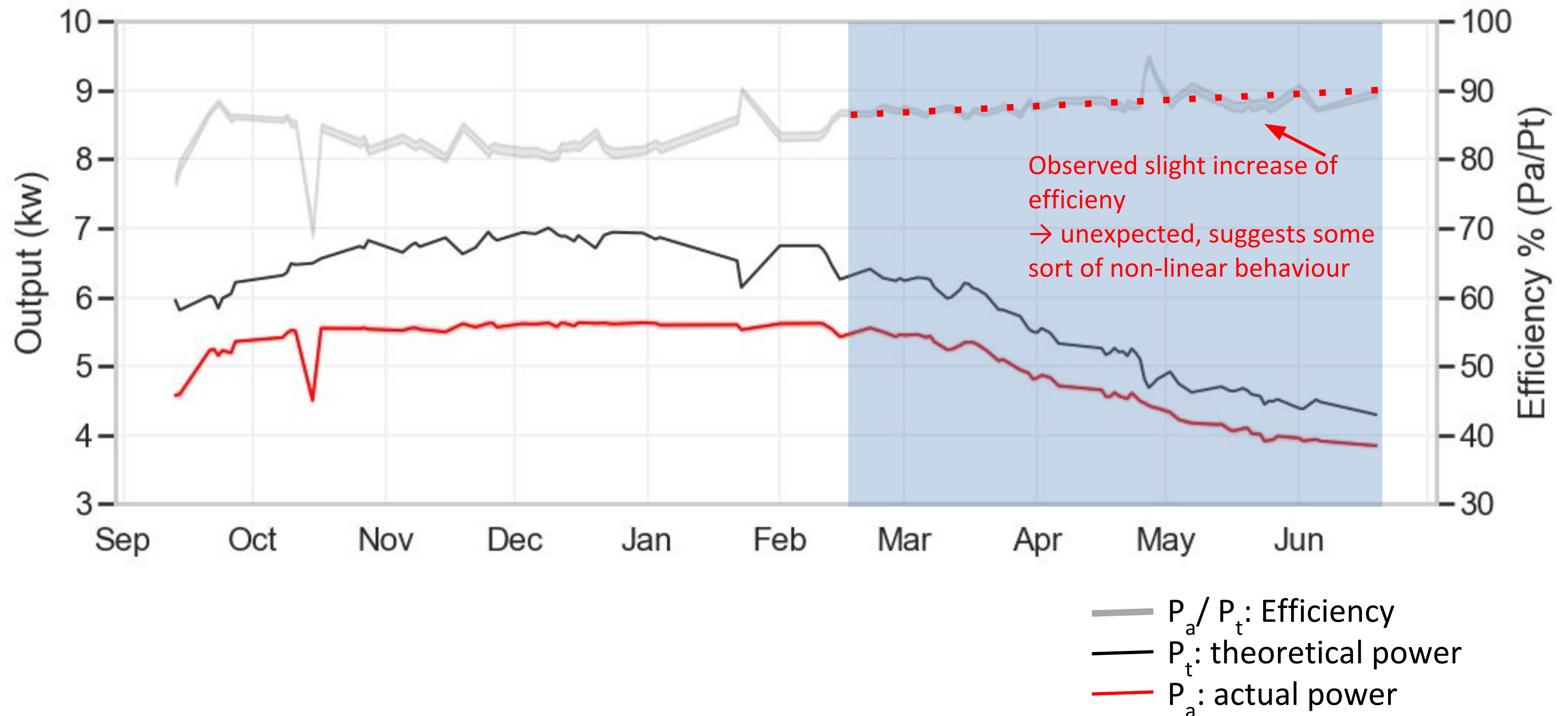


1: with middle-of-day time filter (09:00-16:00)

# We identified saturation during summer...

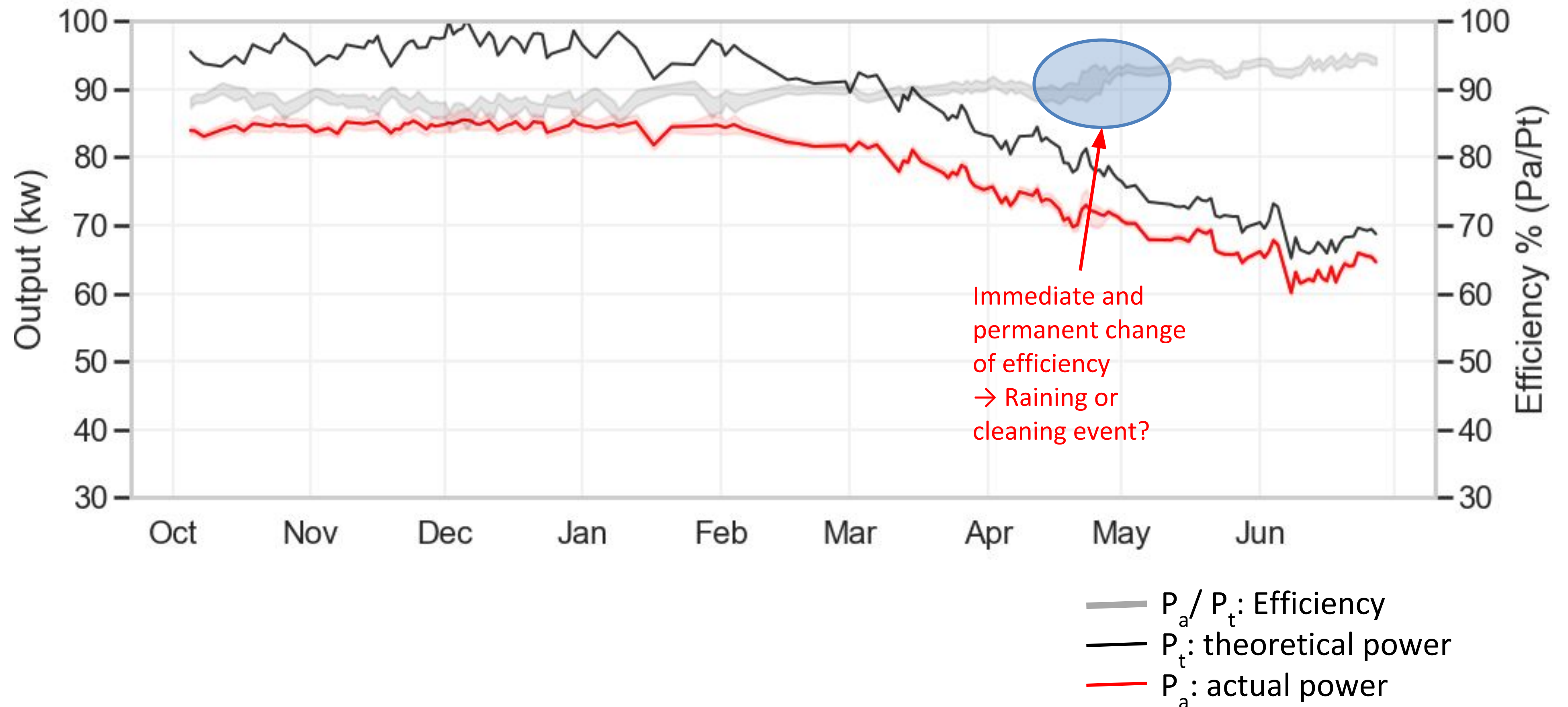


# ...unexpected non-linear behaviour...

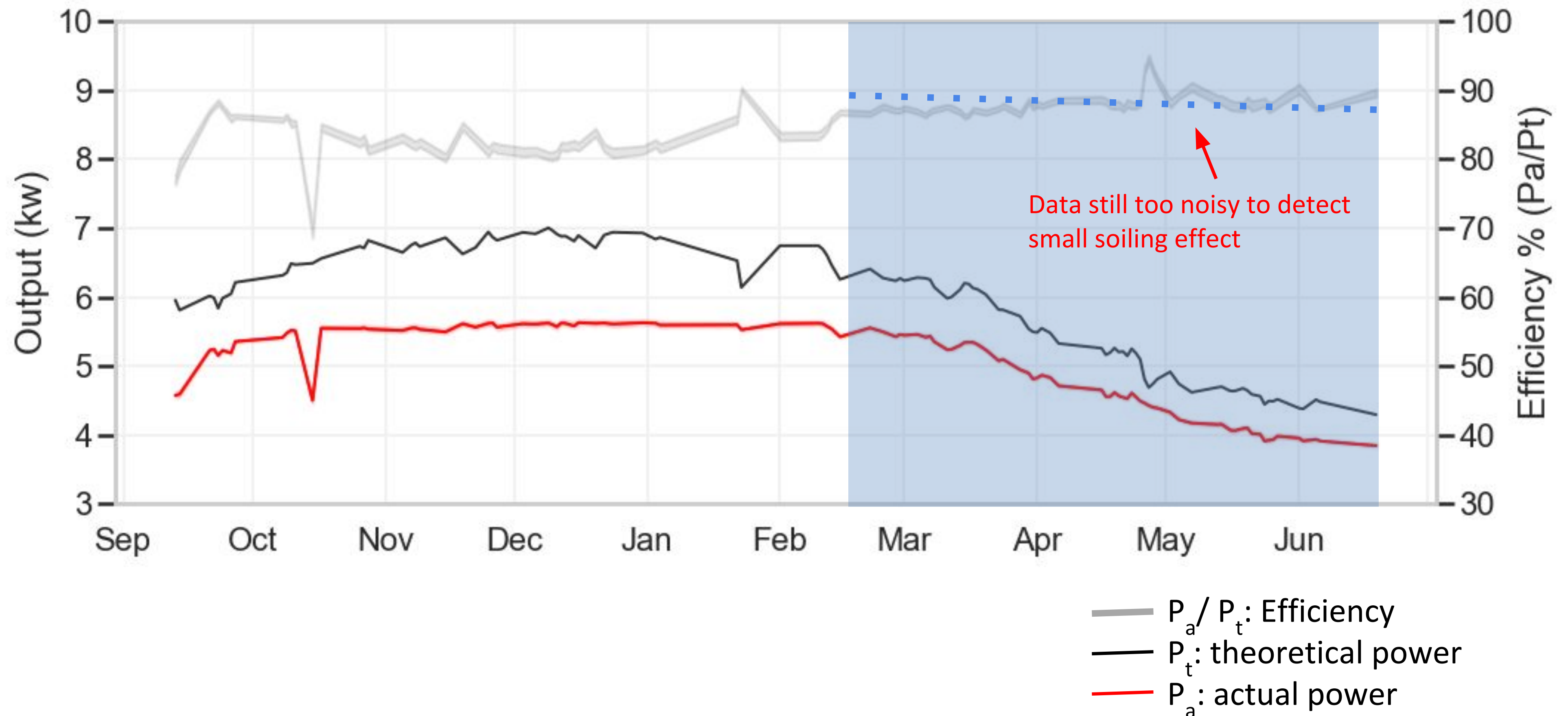




# ...and a step change in performance...



# ... but not enough signal to detect soiling





# Identified next steps

<b>Calibration:</b>	Plant is currently being cleaned which will provide a baseline reference
<b>More data:</b>	In unsaturated periods (late autumn - early spring)
<b>Non-linearity:</b>	Investigate observation, focusing on temperature parameters
<b>Clustering:</b>	Further develop ML techniques (e.g. time-series clustering)
<b>Toolkit:</b>	Further develop additional physical models

# Conclusions

## No soiling detected:

Remains a very hard problem, with no indirect-measurement solution offered in the market

## Toolkit:

Significantly reduces noise so that trends and events in production efficiency can be observed

## Business insights:

- Saturation negates any soiling effect during summer
- Possible non-linear effect in winter
- Performance improvement identified on plant 2



# Thank you!

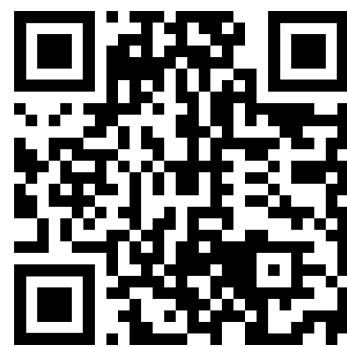
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