

# SOLVING COMPLICATED CASES WITH SIMPLE ANALYTICS

Pia Zacharias

Vinzenz Gregor Eck

Camilla Feurst



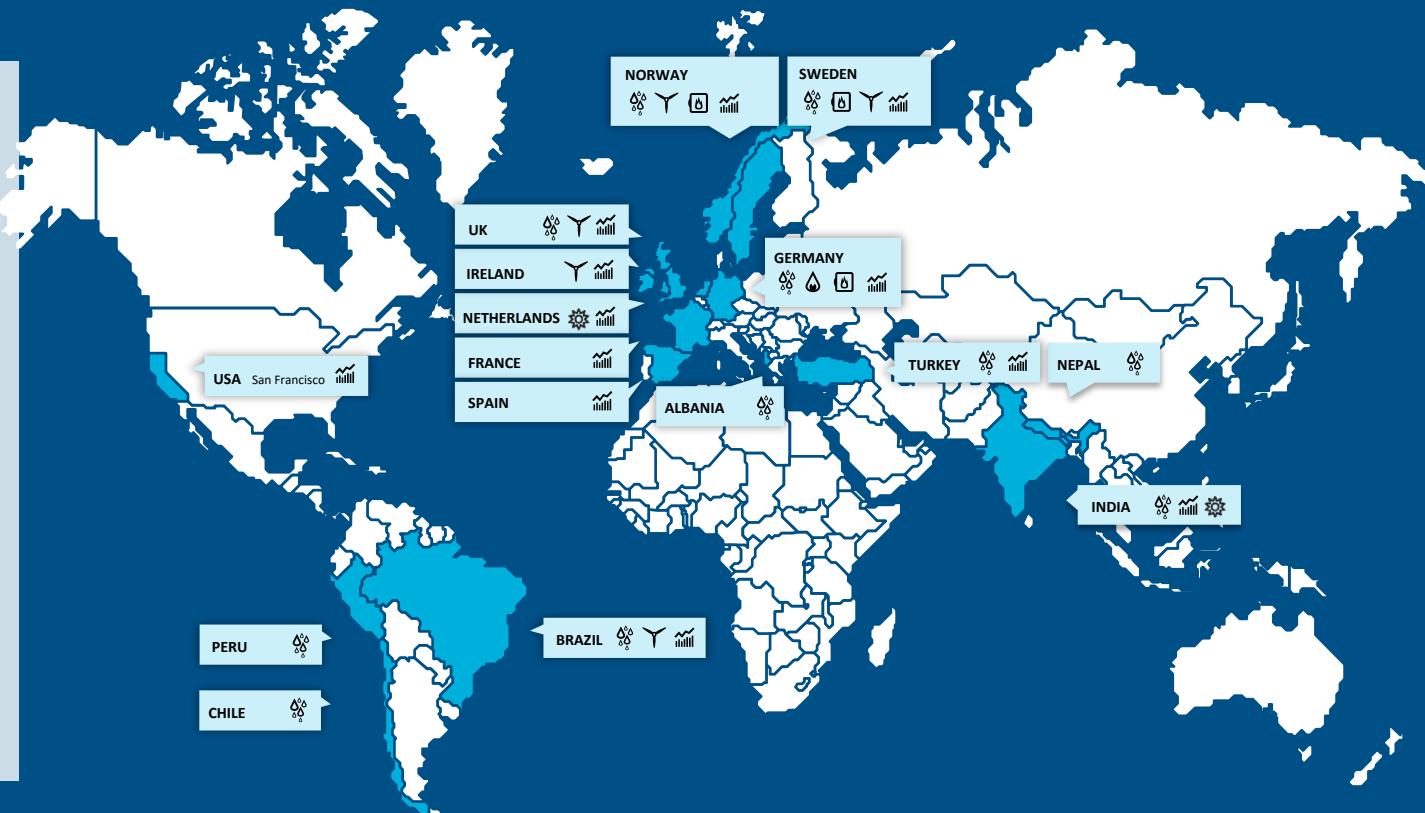
# Europe's largest producer of renewable energy

OWN CAPACITY  
**19 300 MW**

PRODUCTION  
**62 TWh**

EMPLOYEES  
**3 600**

NET PROFIT  
**13.4 NOK billion**



# Taskforce Advanced Analytics

- ▶ Wind cases
- ▶ Hydro cases
- ▶ Backend

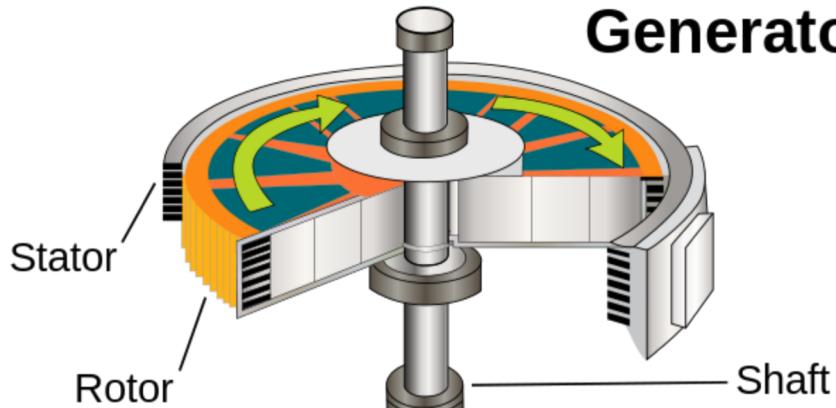


©Statkraft

**But today:**

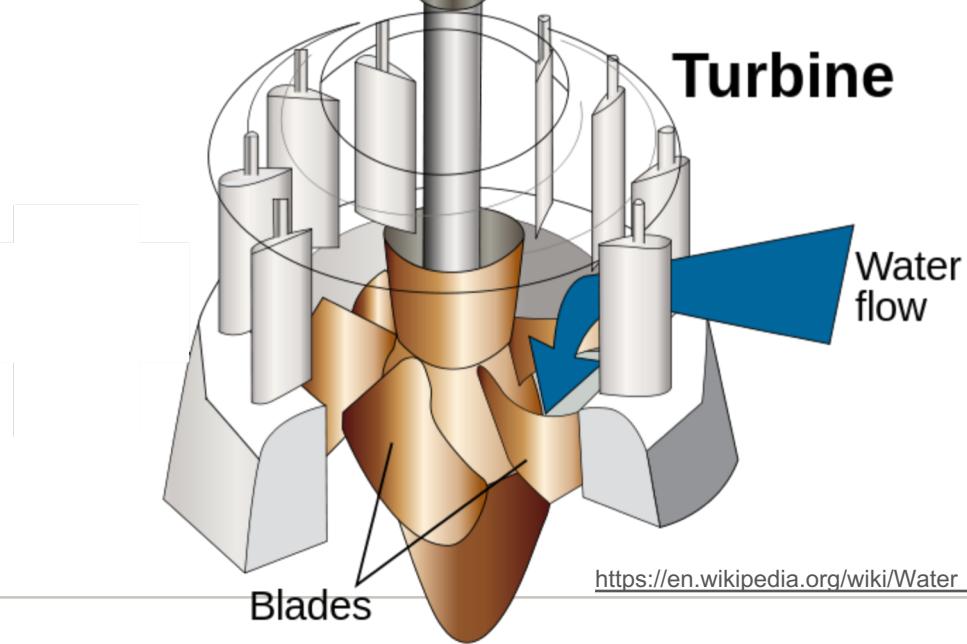
Hydropower plants

# Generator



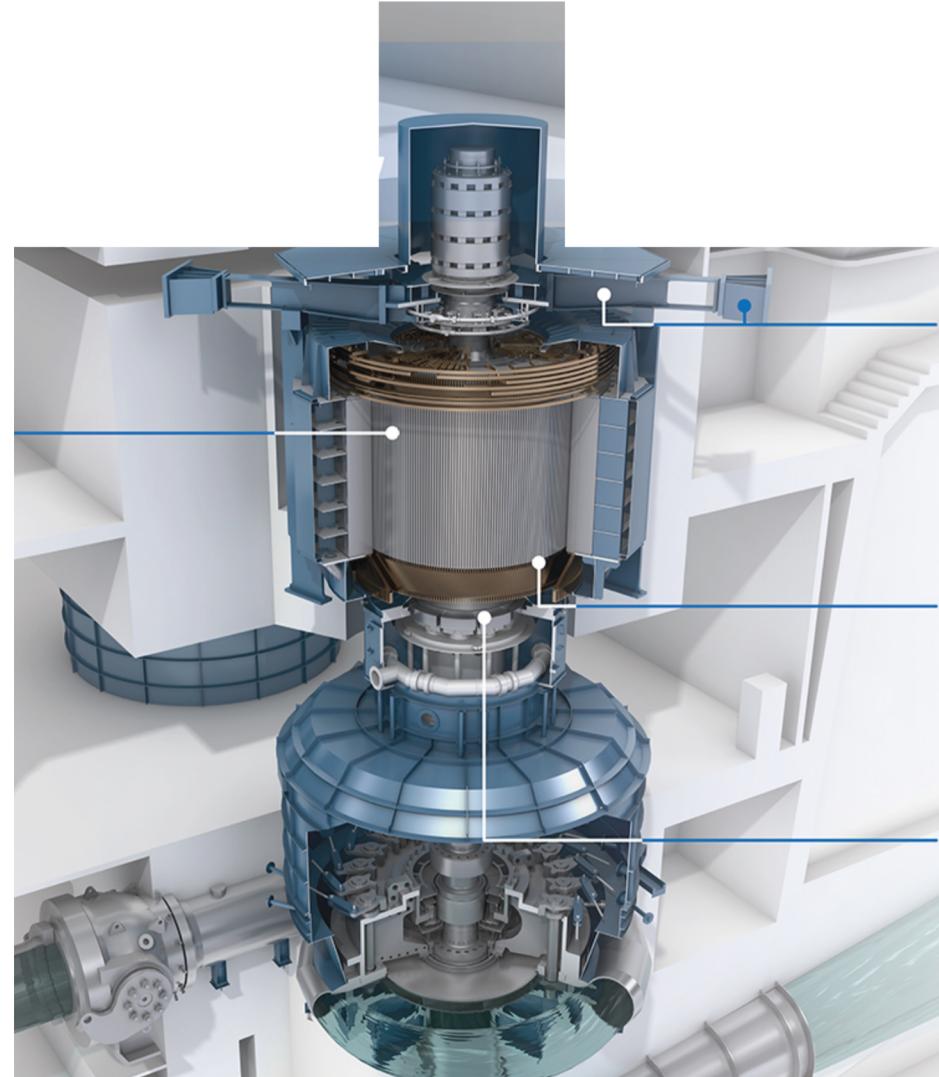
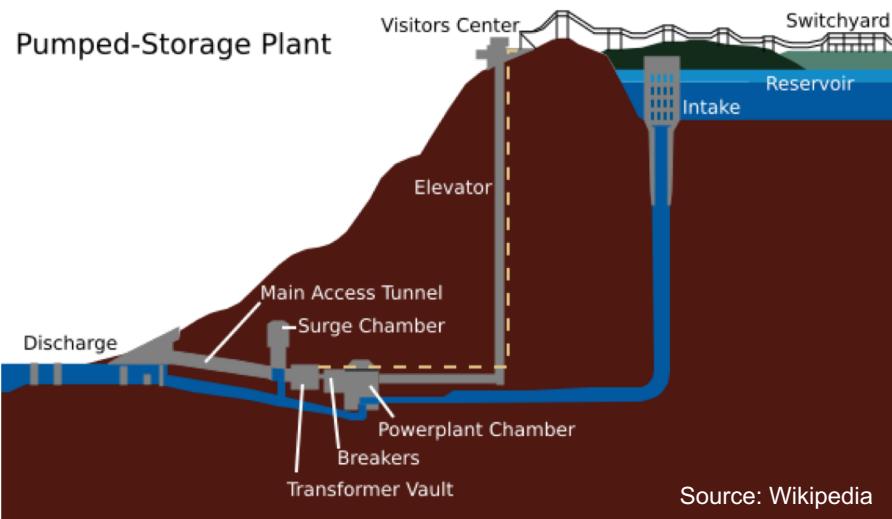
Stator  
Rotor  
Shaft

# Turbine



Blades

[https://en.wikipedia.org/wiki/Water\\_turbine](https://en.wikipedia.org/wiki/Water_turbine)



<https://www.ge.com/renewableenergy/hydro-power/large-hydropower-solutions/generators/variable-speed>

# 2009-Sayano-Shushenskaya power station accident



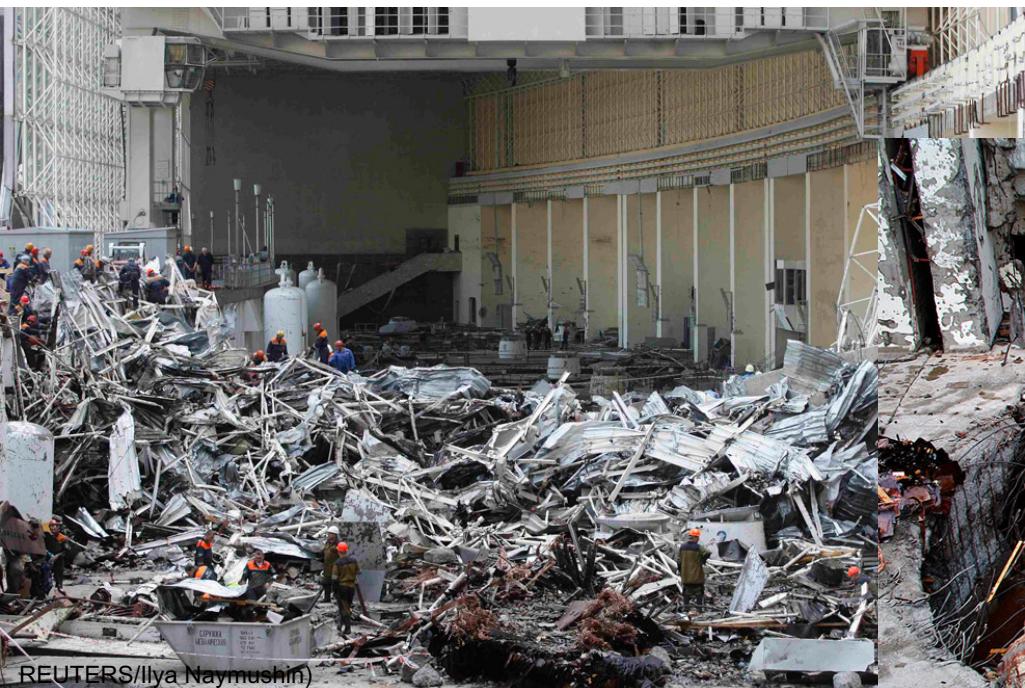
ALEXANDER NEMENOV/AFP/Getty Images



<https://commons.wikimedia.org/w/index.php?curid=7709947>

(c) 4044415

# 2009-Sayano-Shushenskaya power station accident



# Leirdøla hydropower plant



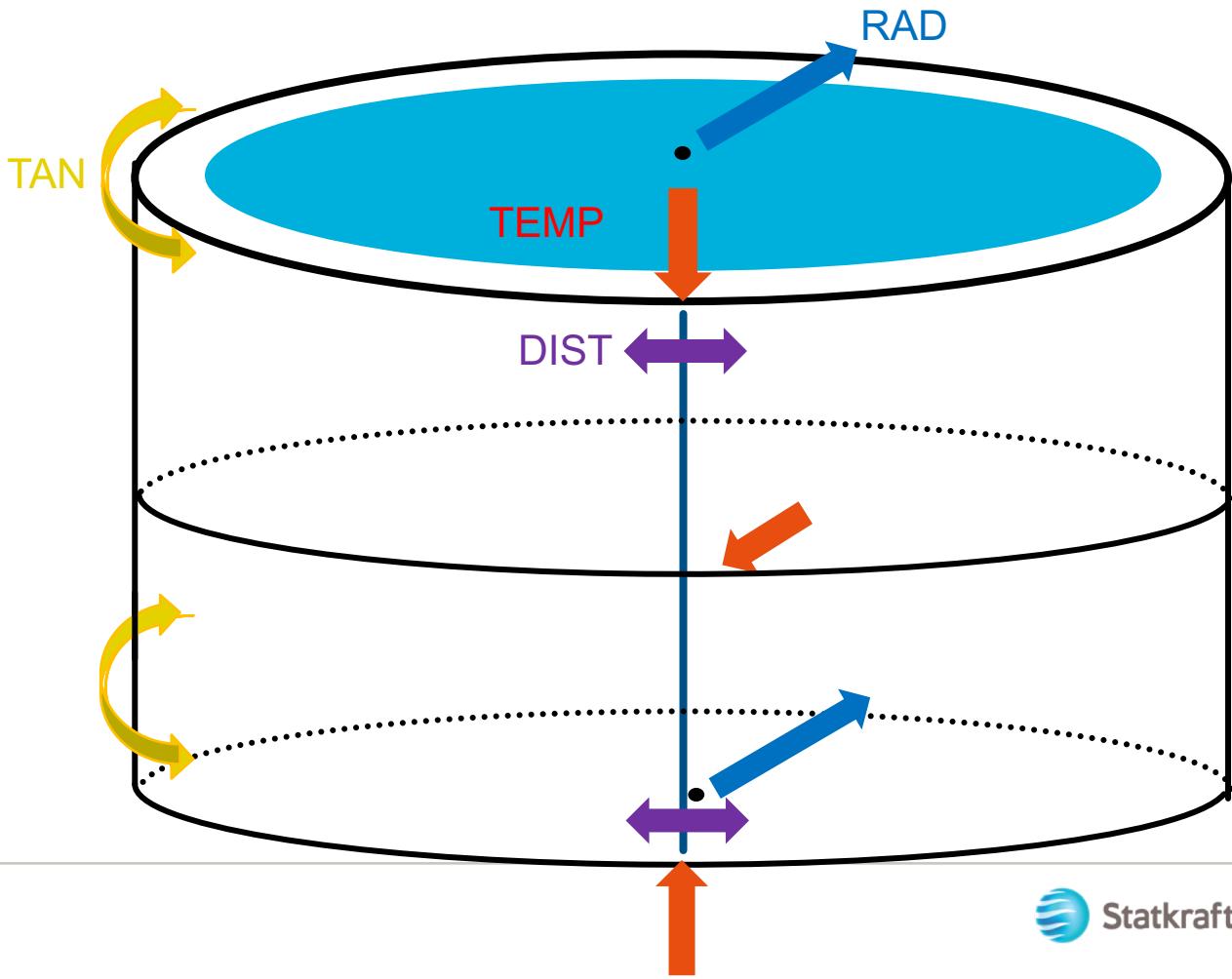




# Leirdøla hydropower plant – problems

- ▶ Root cause problem – poor cooling of the stator (2012 – 2018)
  - *Changes in raw water, cooling air cold and warm*
- ▶ Fire in stator bar – summer 2017
  - *Changes in vibration of upper guide bearing*
- ▶ Current situation – 2018
  - *Changes in gap distances, temperatures (across generator) and vibrations stator back*

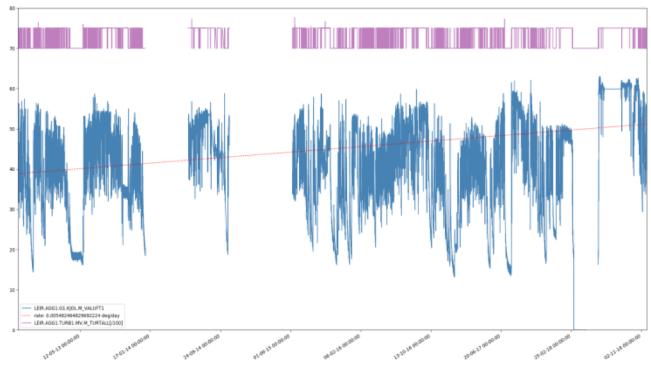
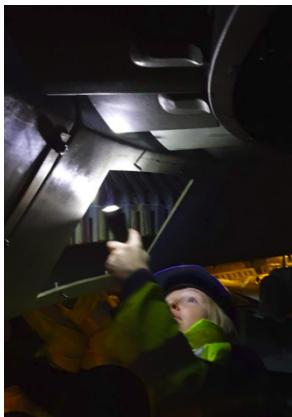
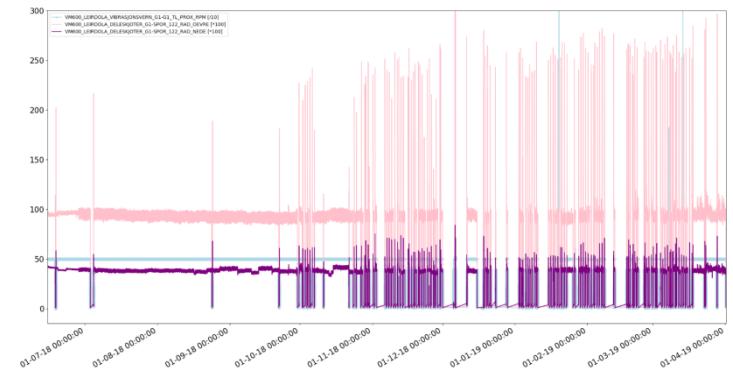
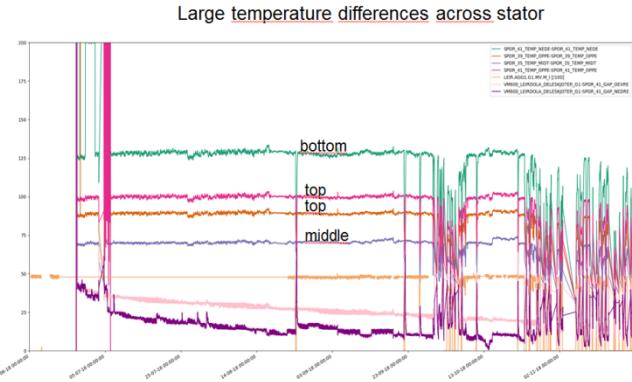
# New Sensors!



# Symptoms & Root Cause

## Analysing trends

- Symptoms
  - Root cause..?



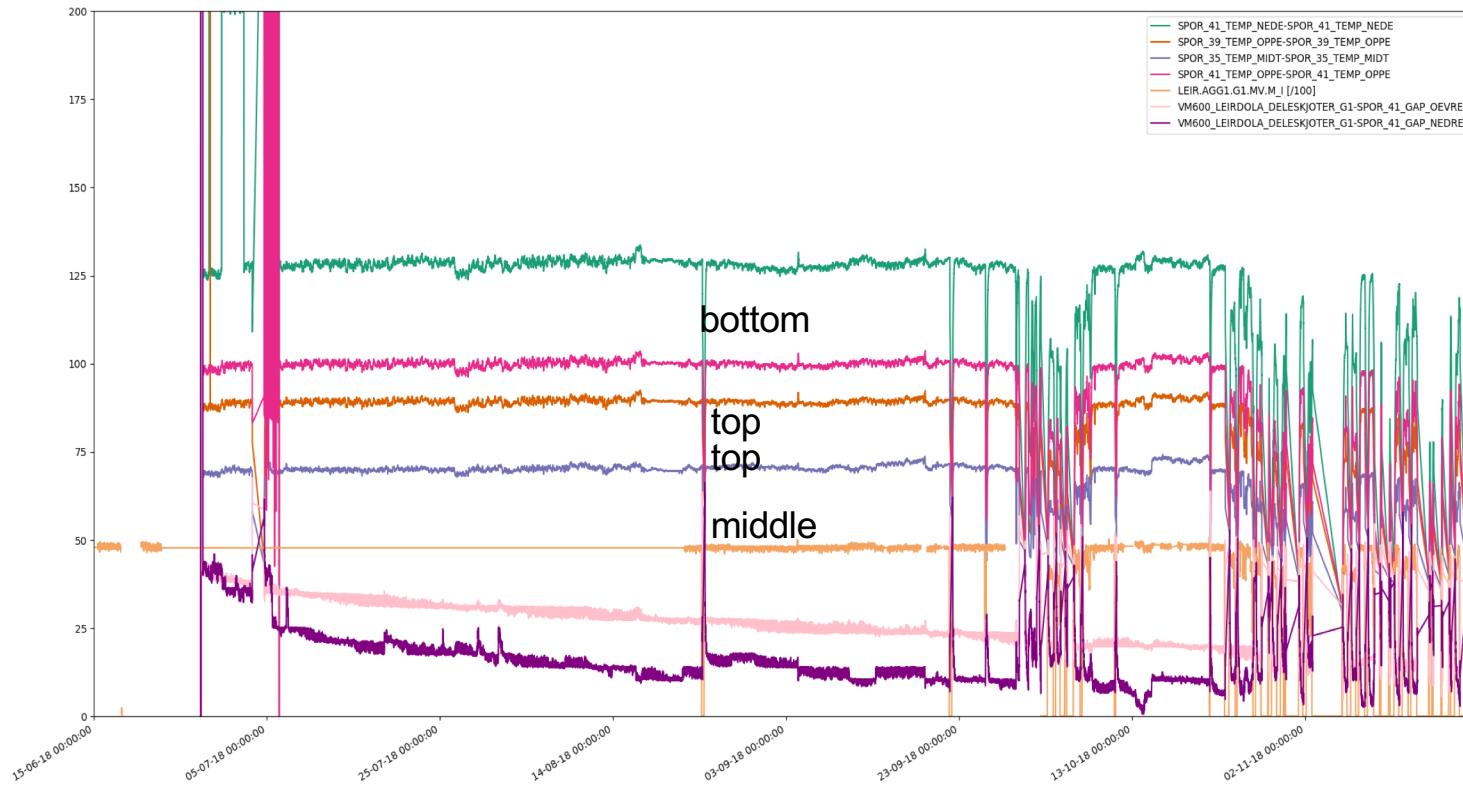
<https://www.pixelsquid.com/png/metal-can>

# Cooling system

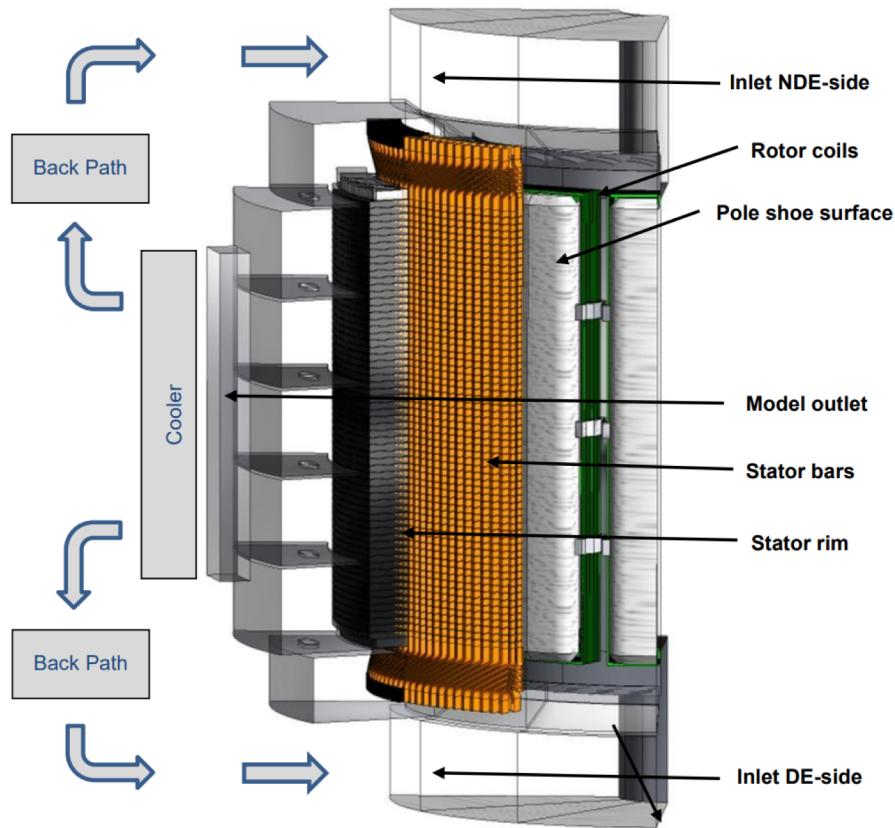


<https://www.youtube.com/watch?v=VydPQuLyEns>

## Large temperature differences across stator

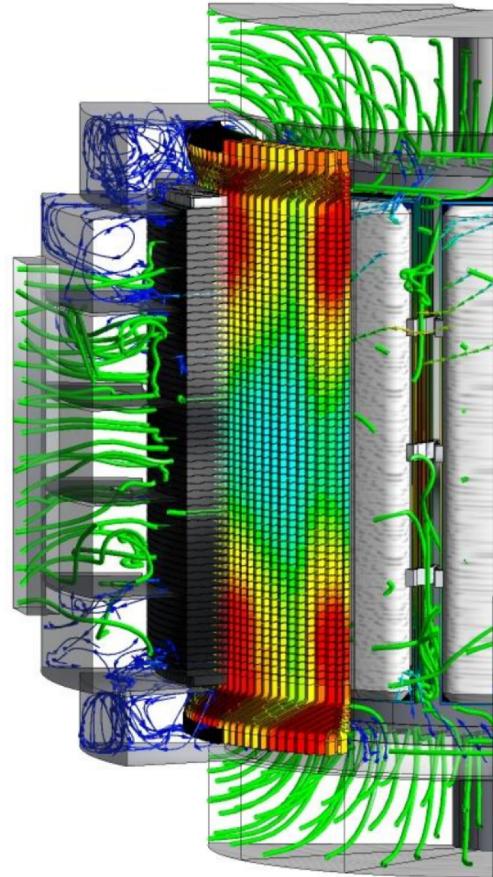


but, only one temperature available in PI, the rest only available locally...



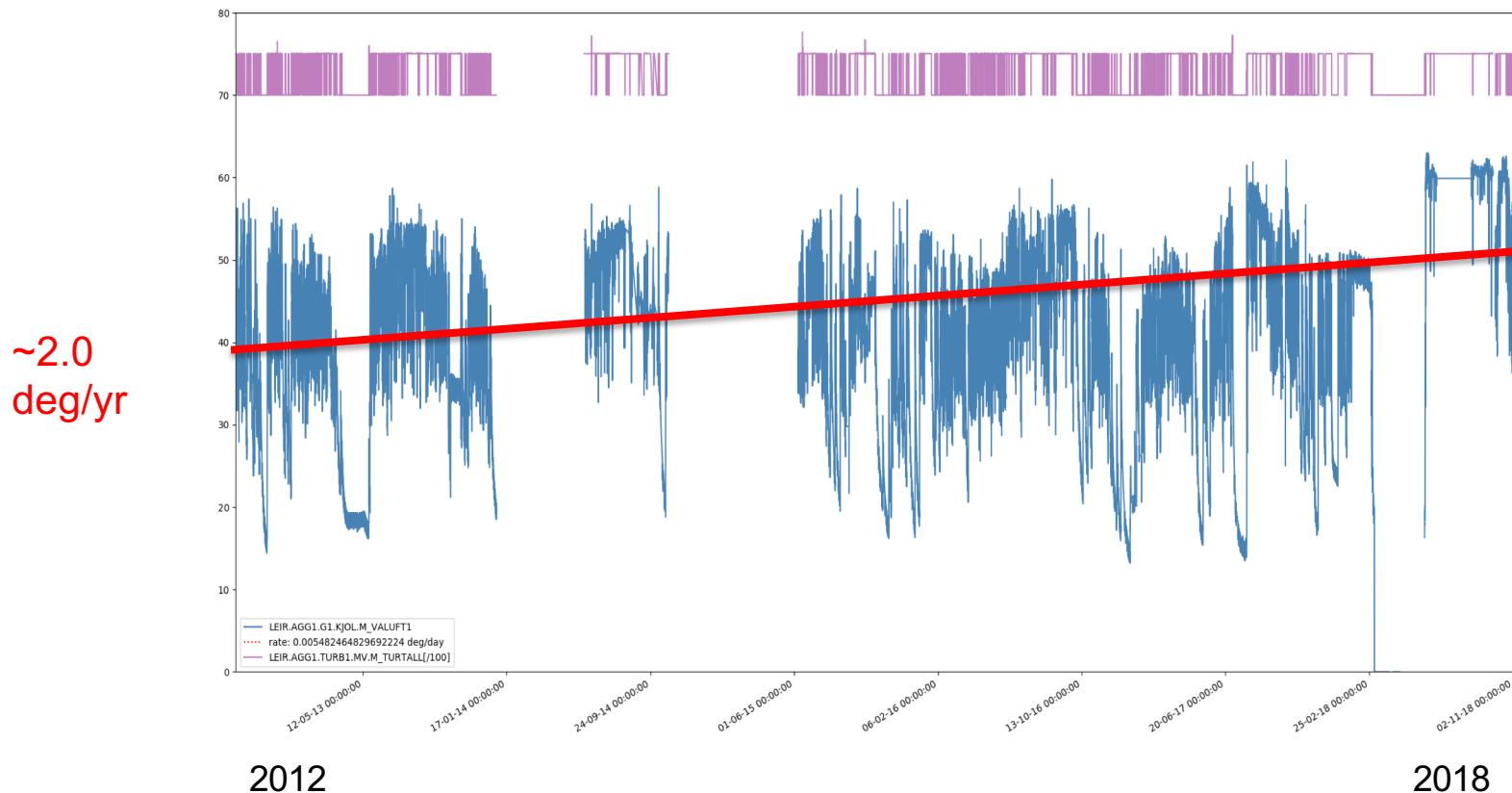
[Figure 4: Boundaries applied to the model](#)

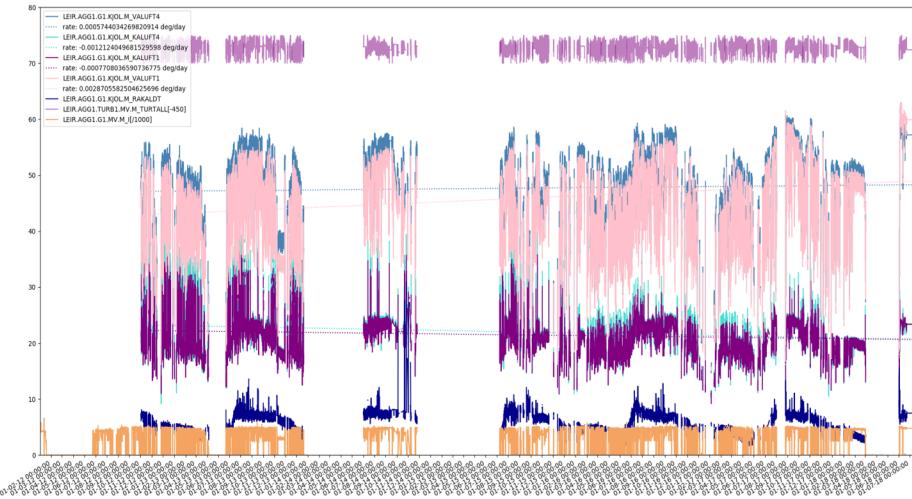
Source: GE Leirdola CFD Inverstigation



[Figure 5: Potential results from the CFD investigation](#)

## Warm air cooler 1 increases over time...





... but further investigation requires even more sensors!

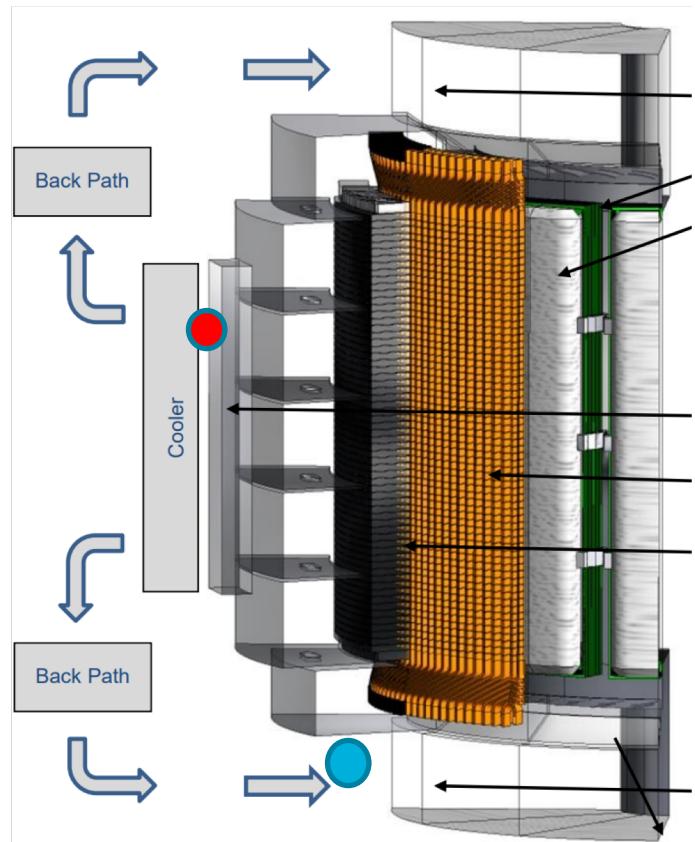
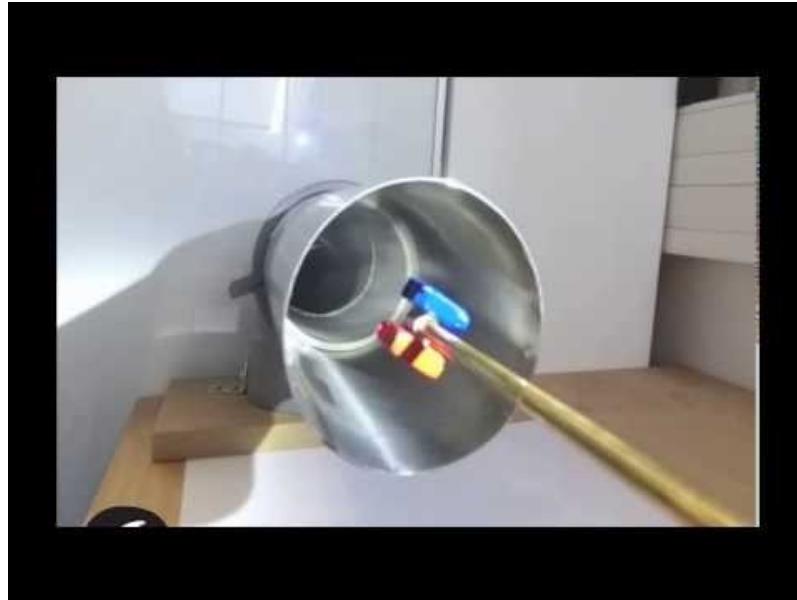


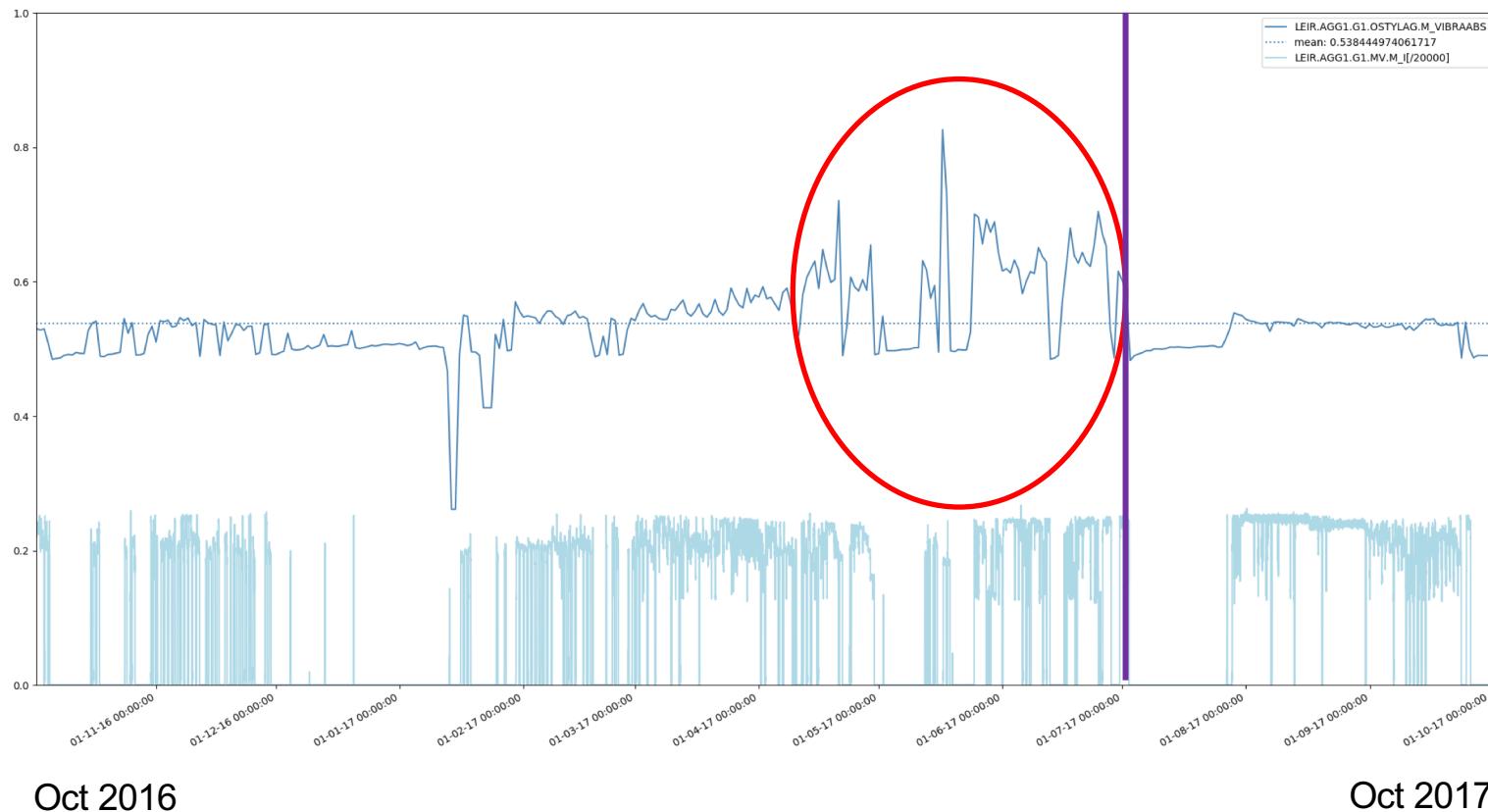
Figure 4: Boundaries applied to the model

# Vibrations

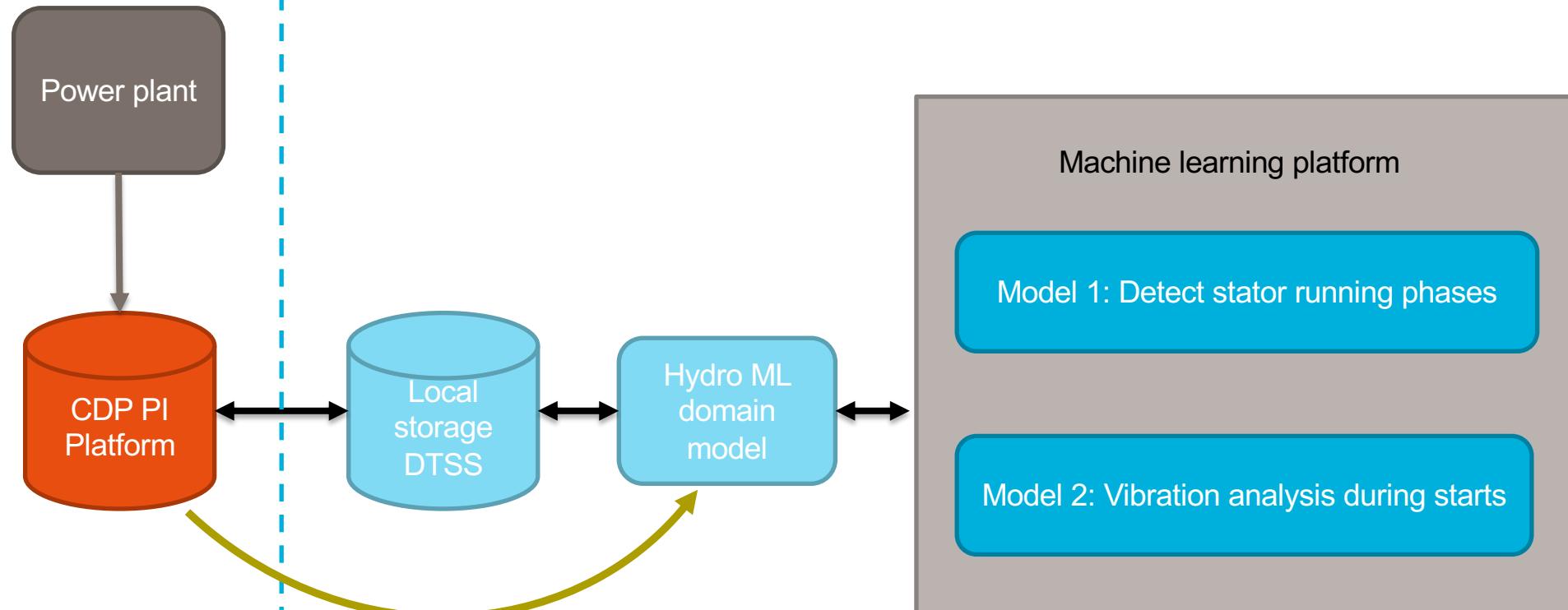


<https://www.youtube.com/watch?v=5489-rzCaMQ>

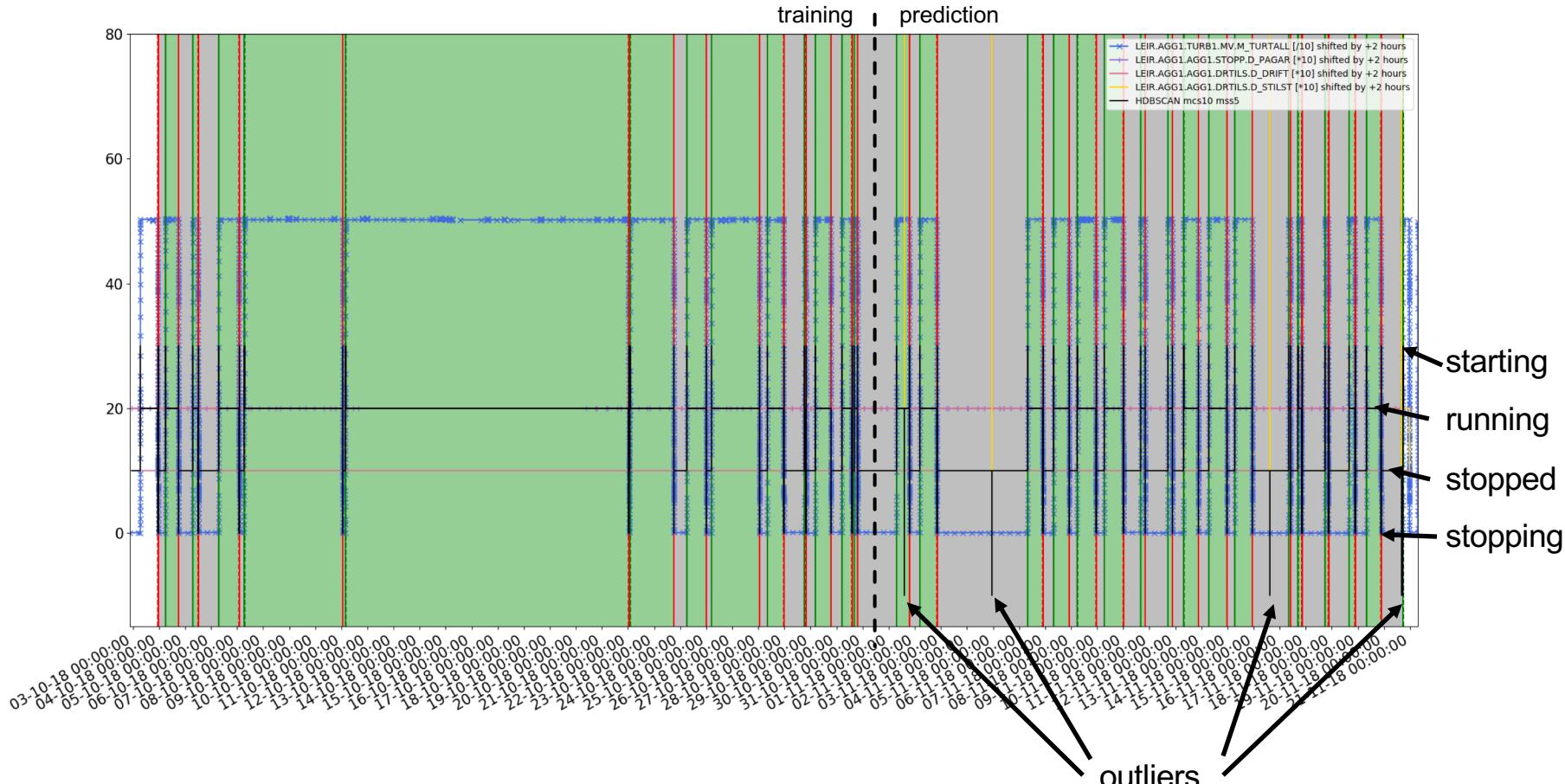
# Unusual bearing vibrations shortly before stator bar fire



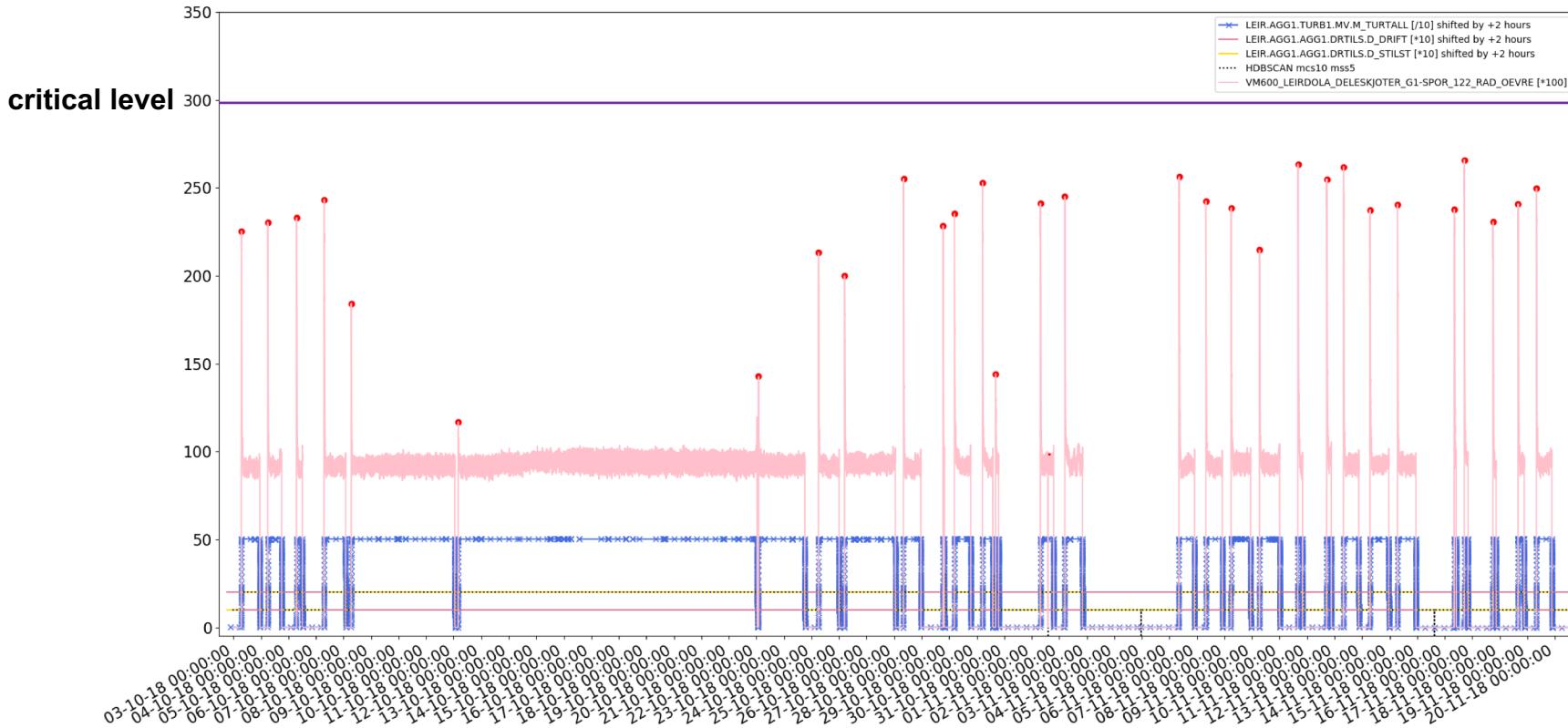
# The first ML models:



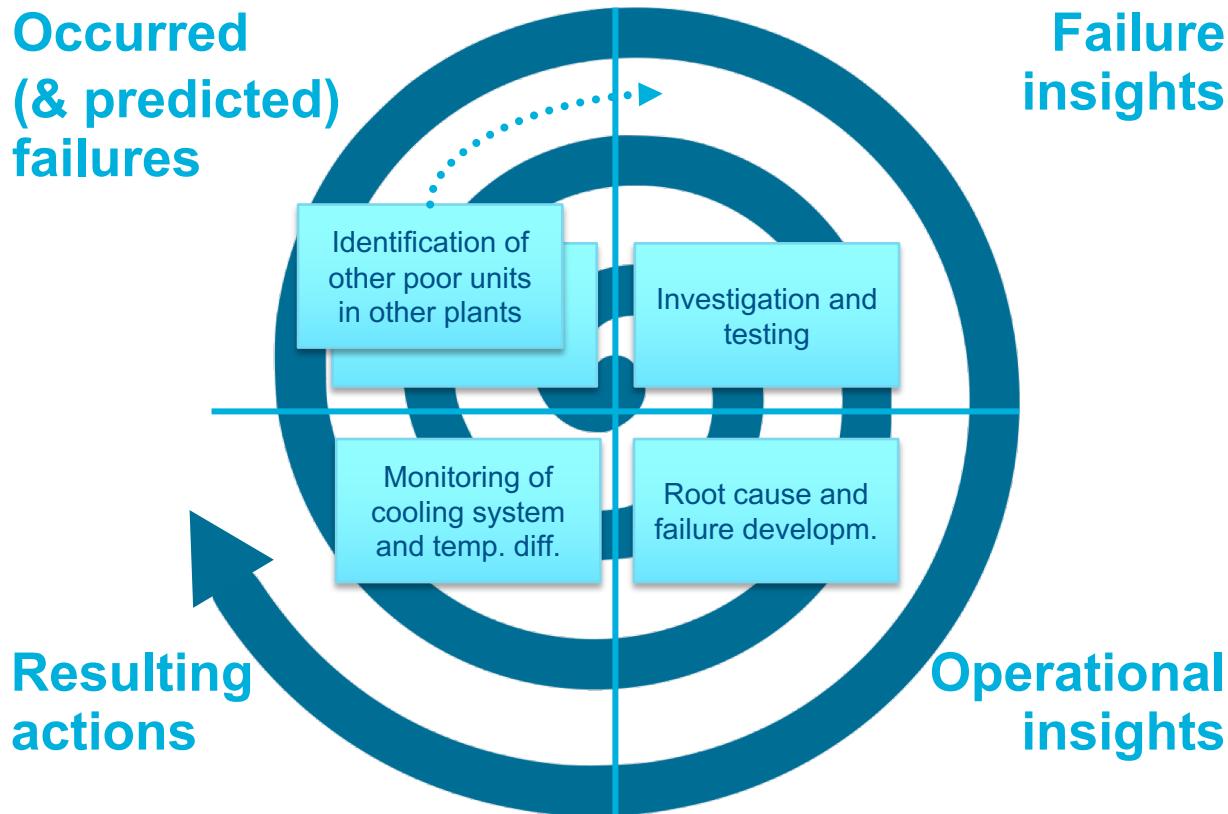
# Apply ML to identify start stop sequences



# Anomaly detection model: Vibration peaks during starts



# From one insight to many



# Thank you!