

## Low-cost sensors as key enabler for condition monitoring and predictive maintenance

*Abdellatif Bey-Temsamani*  
*POM2 Final Workshop*  
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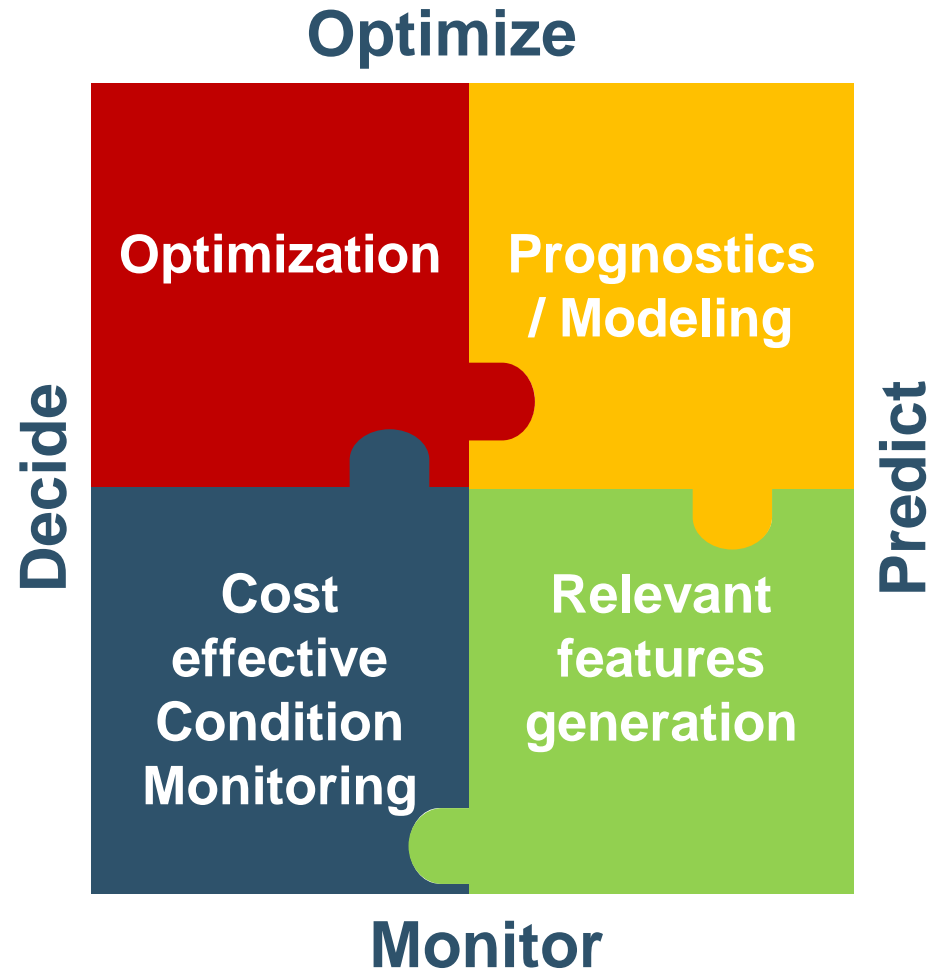
# Outlines

- ➔ + **Condition Monitoring (CM) / Predictive Maintenance (PdM)**
- + **Low-cost sensors as key-enablers for CM / PdM**
- + **Some related results in POM project**
- + **Conclusions**



# Key-enablers for assets Reliability & Improved operational performance – POM project

- + Increased asset reliability / Availability  $\leftrightarrow$  Avoid / Prevent failures / faults by relevant monitoring
- + Increased assets performance  $\leftrightarrow$  Reduce losses / increase benefits by optimizing objective functions



# Condition Monitoring (CM)

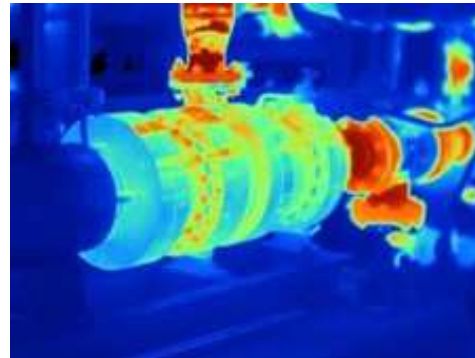
- + CM refers to a system / process to monitor the condition of an engineering asset
- + Such a CM system would often consists of a sensor and potentially a processor to convert the measured data to the condition parameter



- + Applications - examples



Vibration monitoring



Thermal monitoring

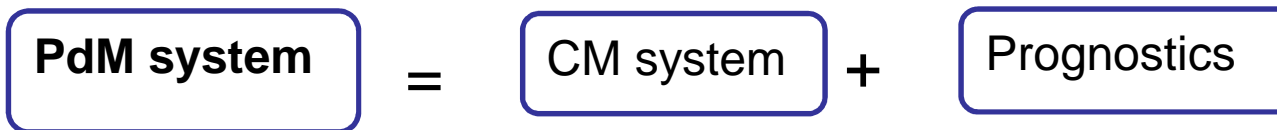


Oil monitoring

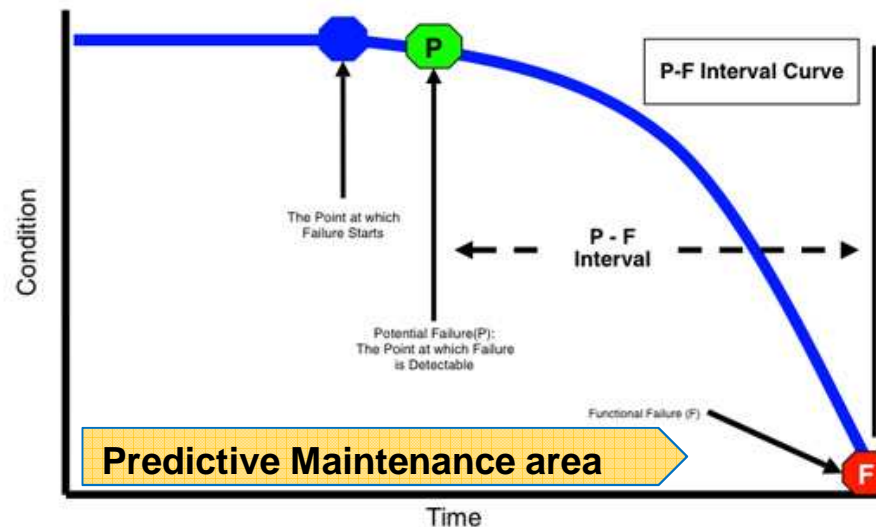


# Predictive Maintenance (PdM)

- + PdM refers to a system / process to predict when a maintenance should be performed on an engineering asset based on its condition
- + Such a PdM system would often consists of a CM system and a model to predict when maintenance is needed (prognostics)



- + P-F curve



# CM / PdM types

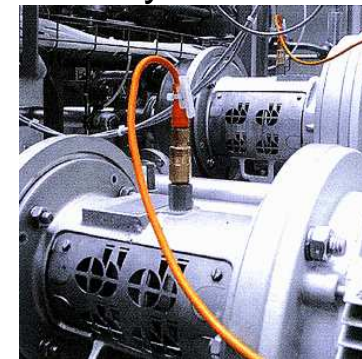
## + Periodic (off-line, intermittent)

- Monitor the engineering asset on periodic / intermittent basis
- e.g. use hand-held systems to record condition of the engineering asset and trend off-line the data to predict when maintenance is needed
  - Local (advanced) processing
  - Portable



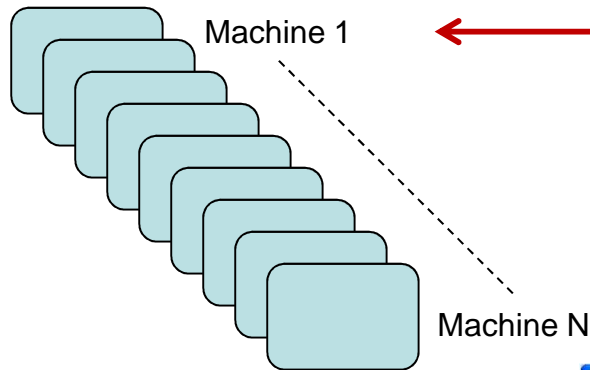
## + Permanent (on-line, continuous)

- CM is permanently mounted on the monitored asset to continuously record the condition
- e.g. permanently install a sensor to monitor an asset
  - The data could be transferred automatically to the central unit for processing (wired / wireless transmission)
  - A better understandability of the asset behavior versus time as the condition is continuously tracked



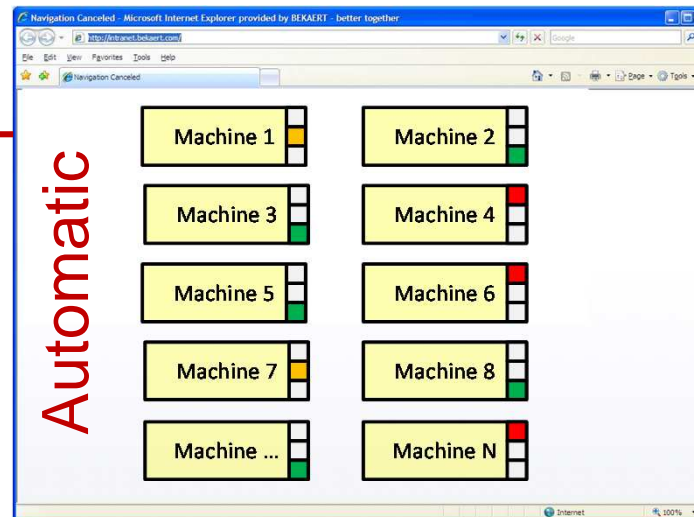
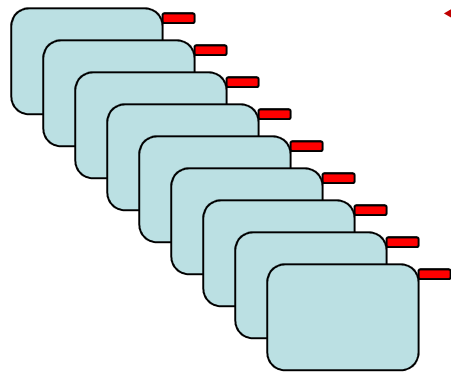
# On-line – off-line systems in practice

## Production plant



### + Costs

- Hand-held system
- Manual recording / analysis



### + Costs

- Sensors
- Data transmission



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- + **Conclusions**



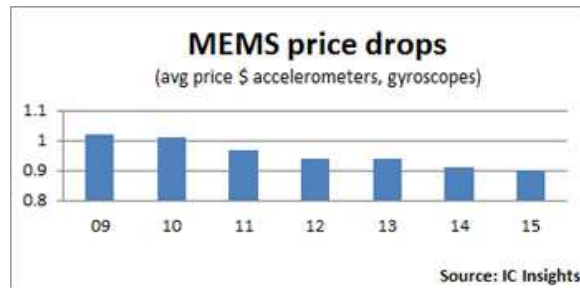


# Low-cost sensors

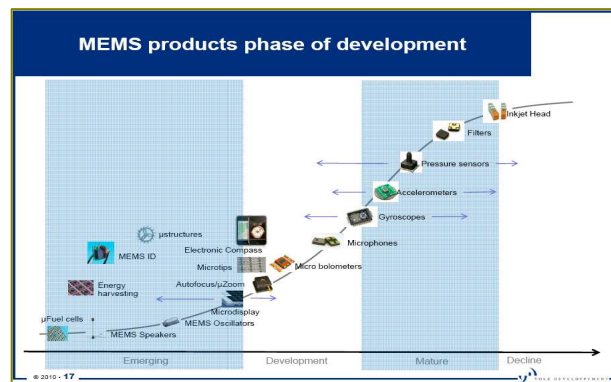
## + General observations

- Price of sensors in continuously decreasing → high competitiveness
  - New emerging cheap sensing technologies → e.g. MEMS sensors
  - Emerging / cheap wireless solutions for data transmissions
  - Solutions for harsh environment / industrial applications are available
- The low-cost ingredients for online CM / PdM are appearing ...

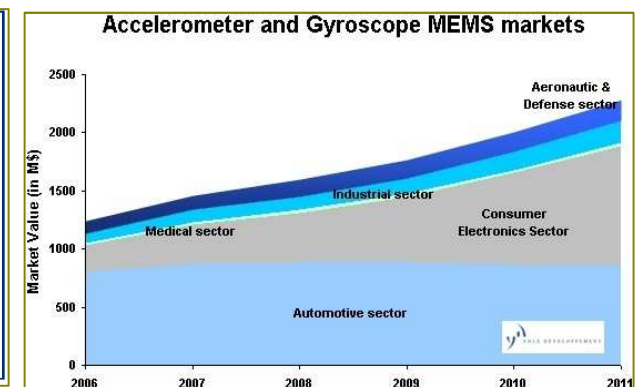
### Price drop



### Maturity

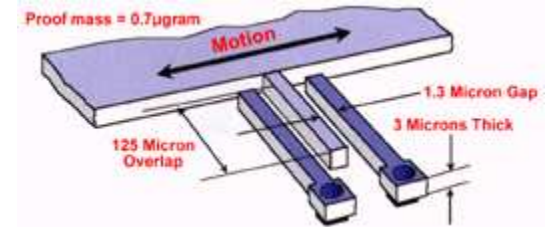
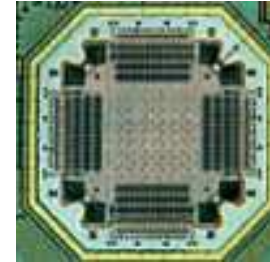


### Market shares



# MEMS accelerometer for condition monitoring

- + Although MEMS accelerometer are more and more available in the market → they still suffering from some artifacts to make them competing with the conventional sensors\*
  - Response of microscopic mechanical systems / materials
  - Response of electronics (Op-Amps / transistors non-linearity)→ End-users should learn techniques to compensate non-ideal MEMS behaviors
- + In POM project we developed a set-up to characterize MEMS accelerometers which allows to identify non-ideal MEMS responses



\*Source: <http://www.sensorland.com/HowPage023.html>



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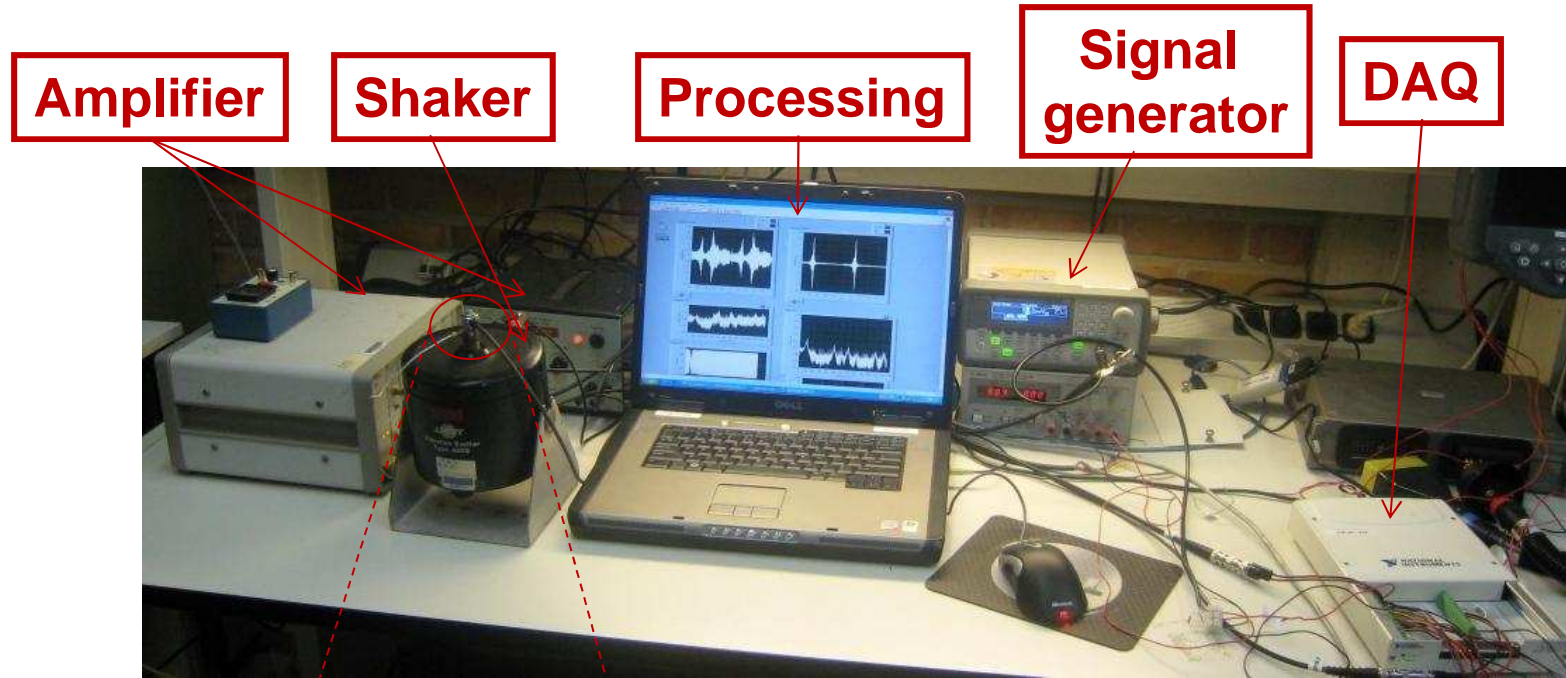
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# MEMS accelerometer characterization set-up

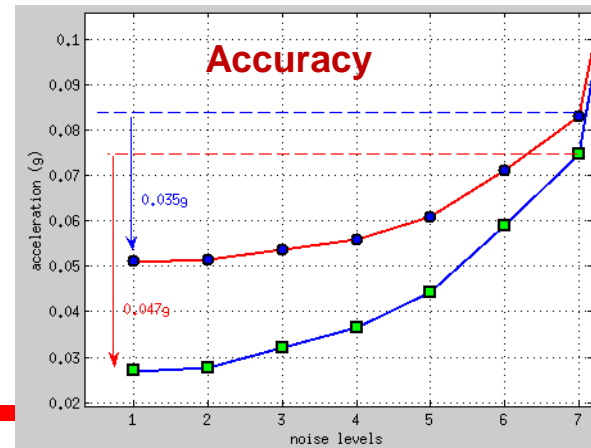
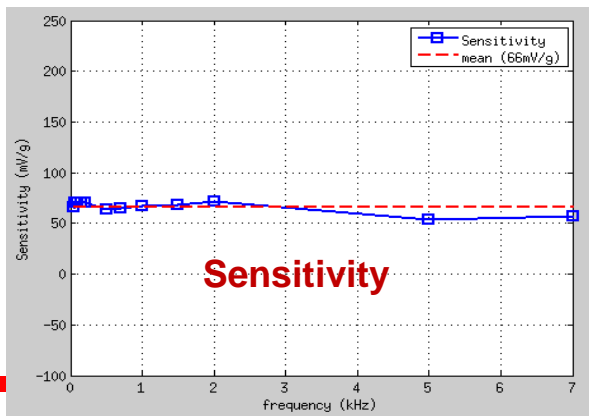
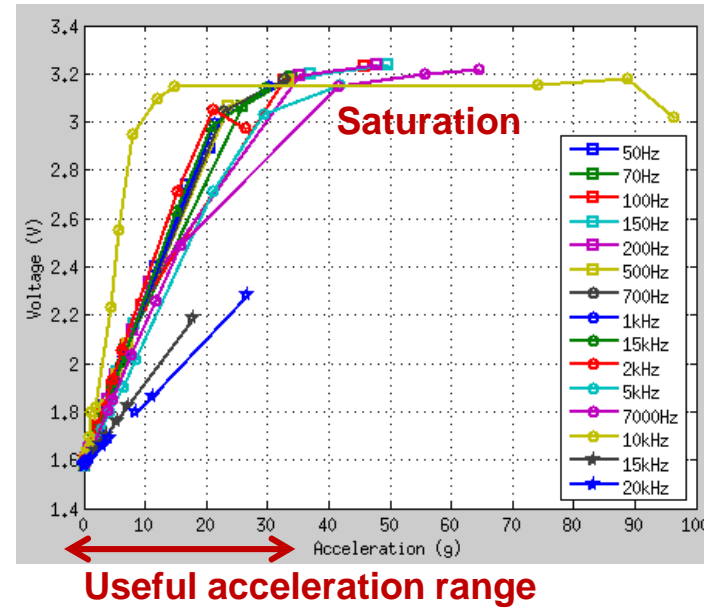
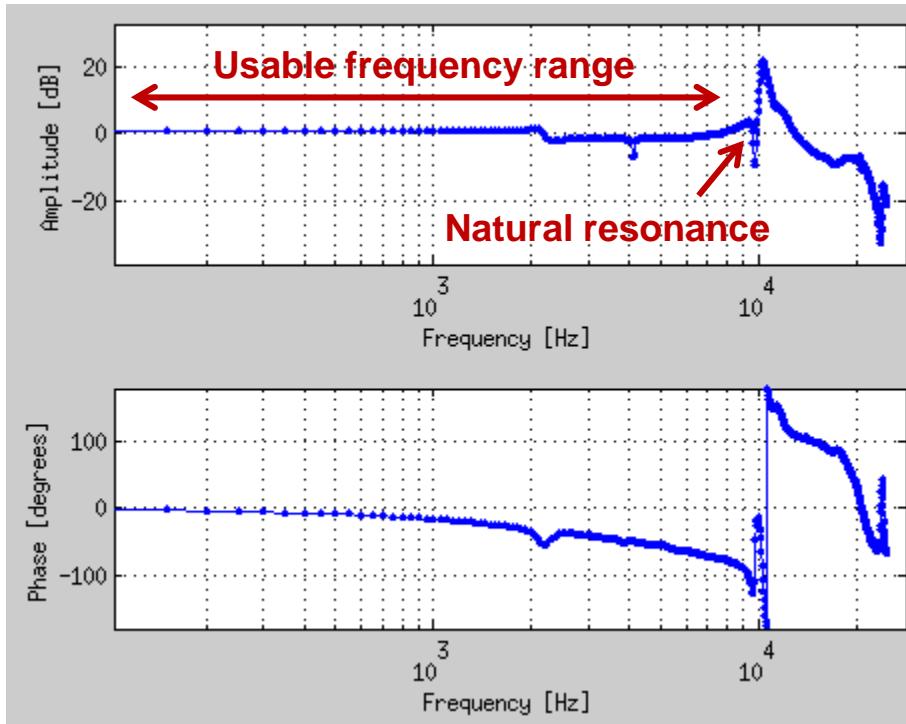


**Tested accelerometer**

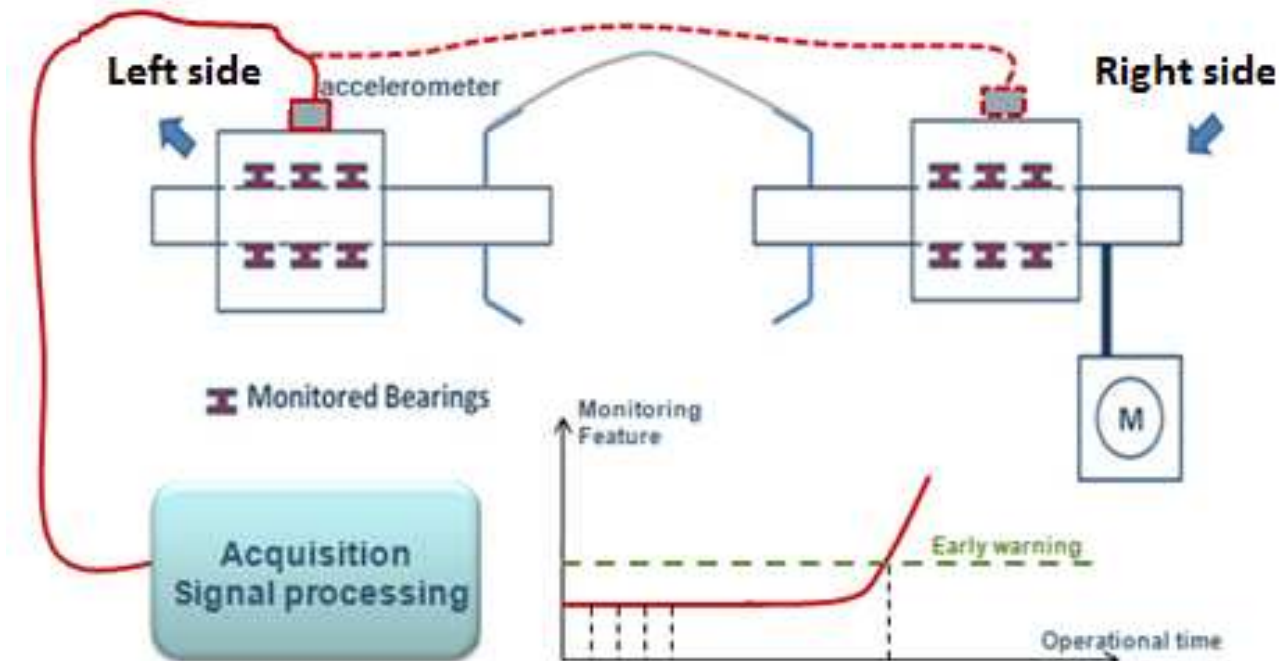
**Reference accelerometer**



# Derive MEMS Characteristics ...



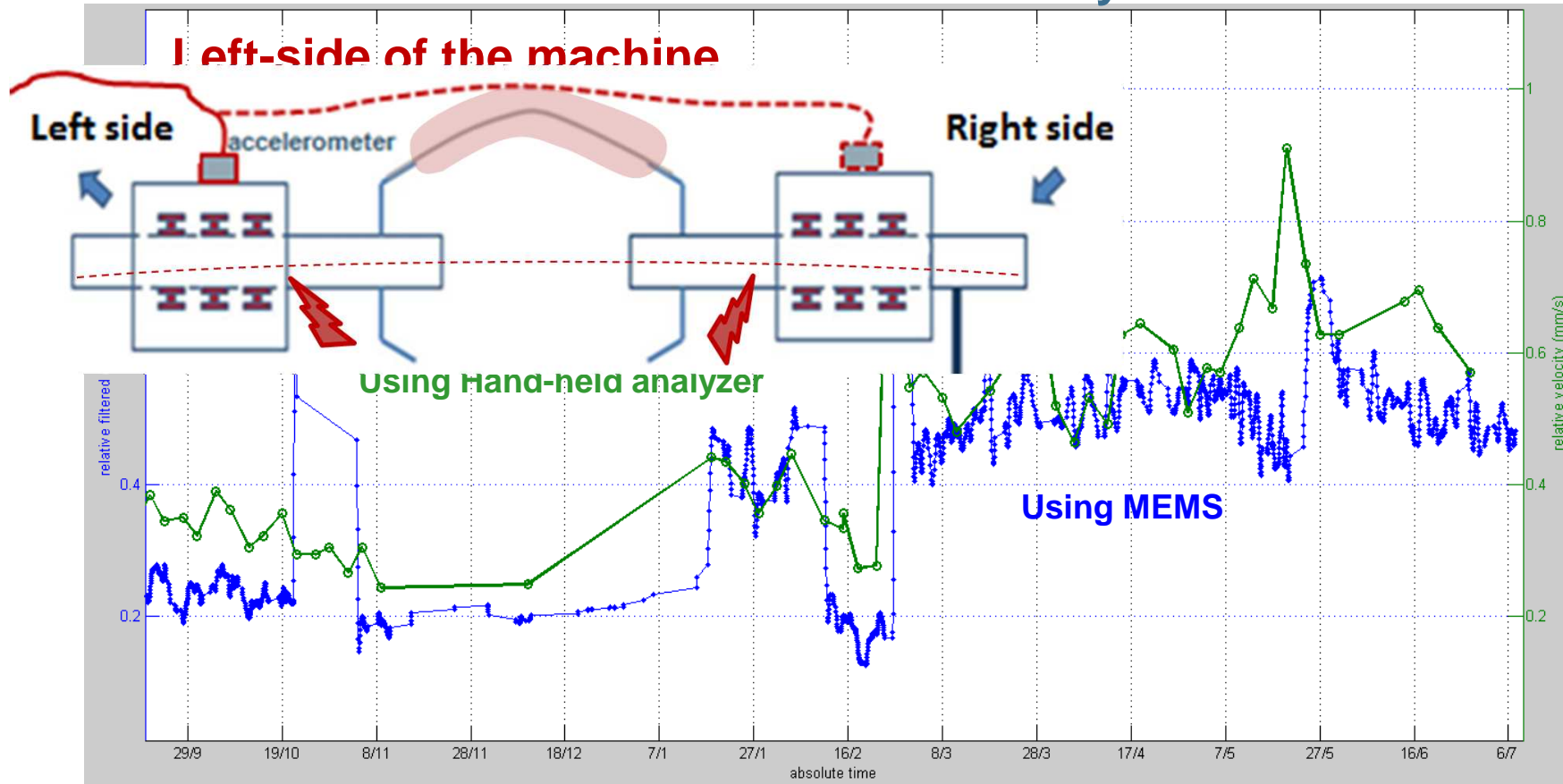
# Case study – monitoring the bearings of a steel cord production machine



- + Use MEMS accelerometers to monitor the condition of the bearings in a steel cord production machine
- + Use dedicated signal processing techniques to deal with MEMS limitations and extract relevant features to trend the evolution of faults



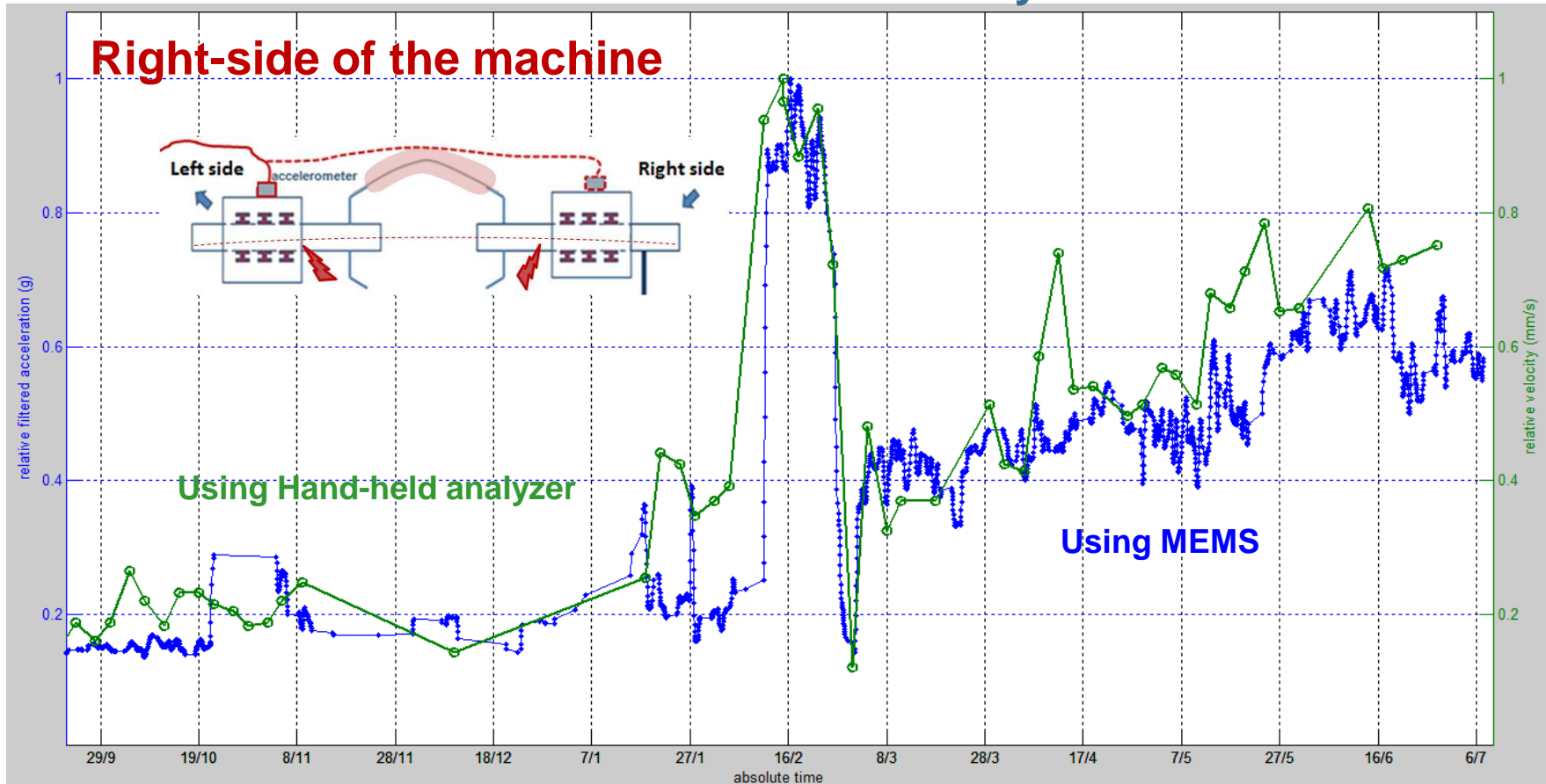
# Imbalance monitoring – MEMS accelerometer versus Hand-held analyzer



**Relative trends of imbalance fault extracted using MEMS accelerometer and using Hand Held system are comparable**



# Imbalance monitoring – MEMS accelerometer versus Hand-held analyzer



**The imbalance seen at the two sides of the machine is comparable**

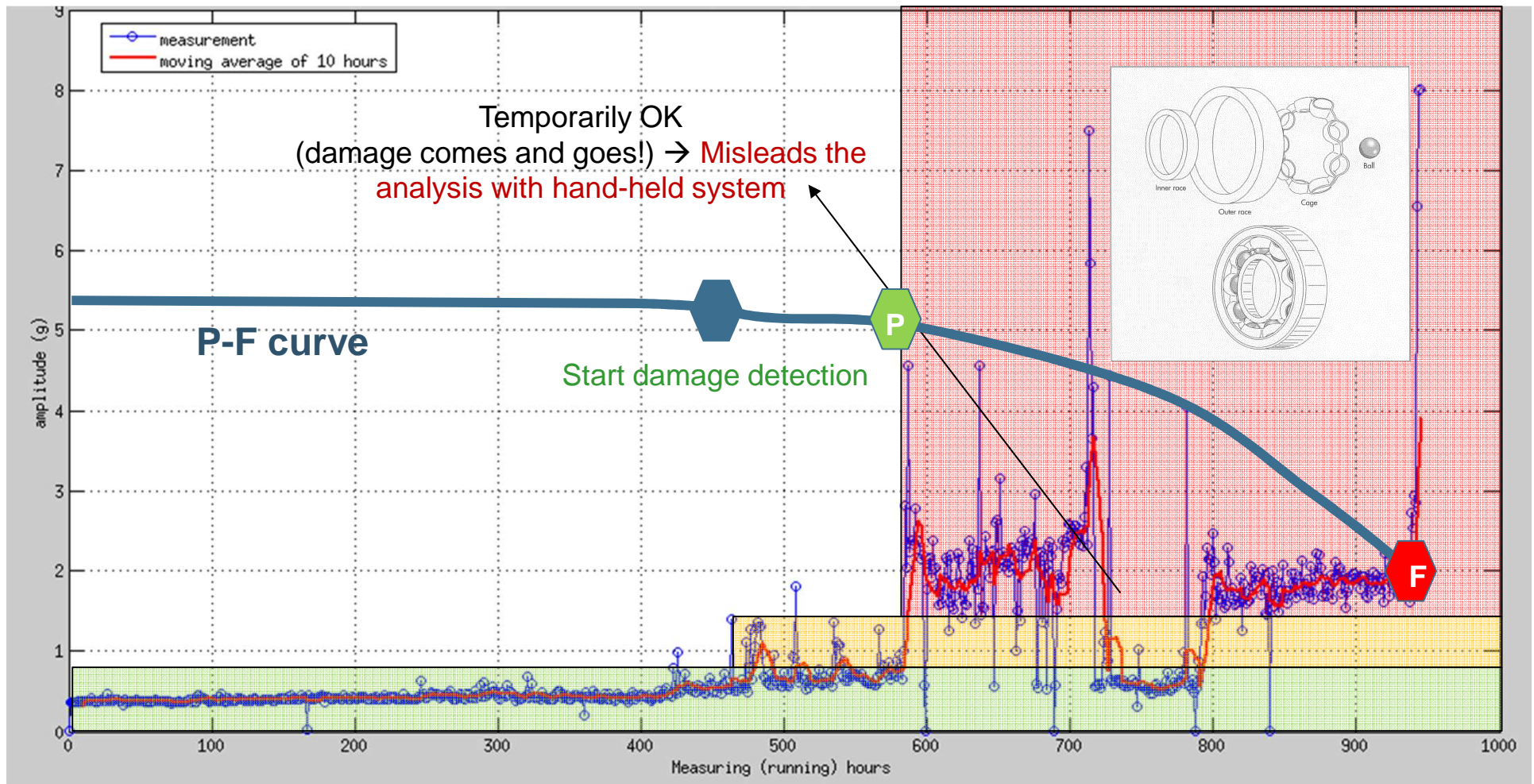


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# Catastrophic failure monitoring

Accidental stop (cage broken)



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# Temperature sensors for bearings condition monitoring

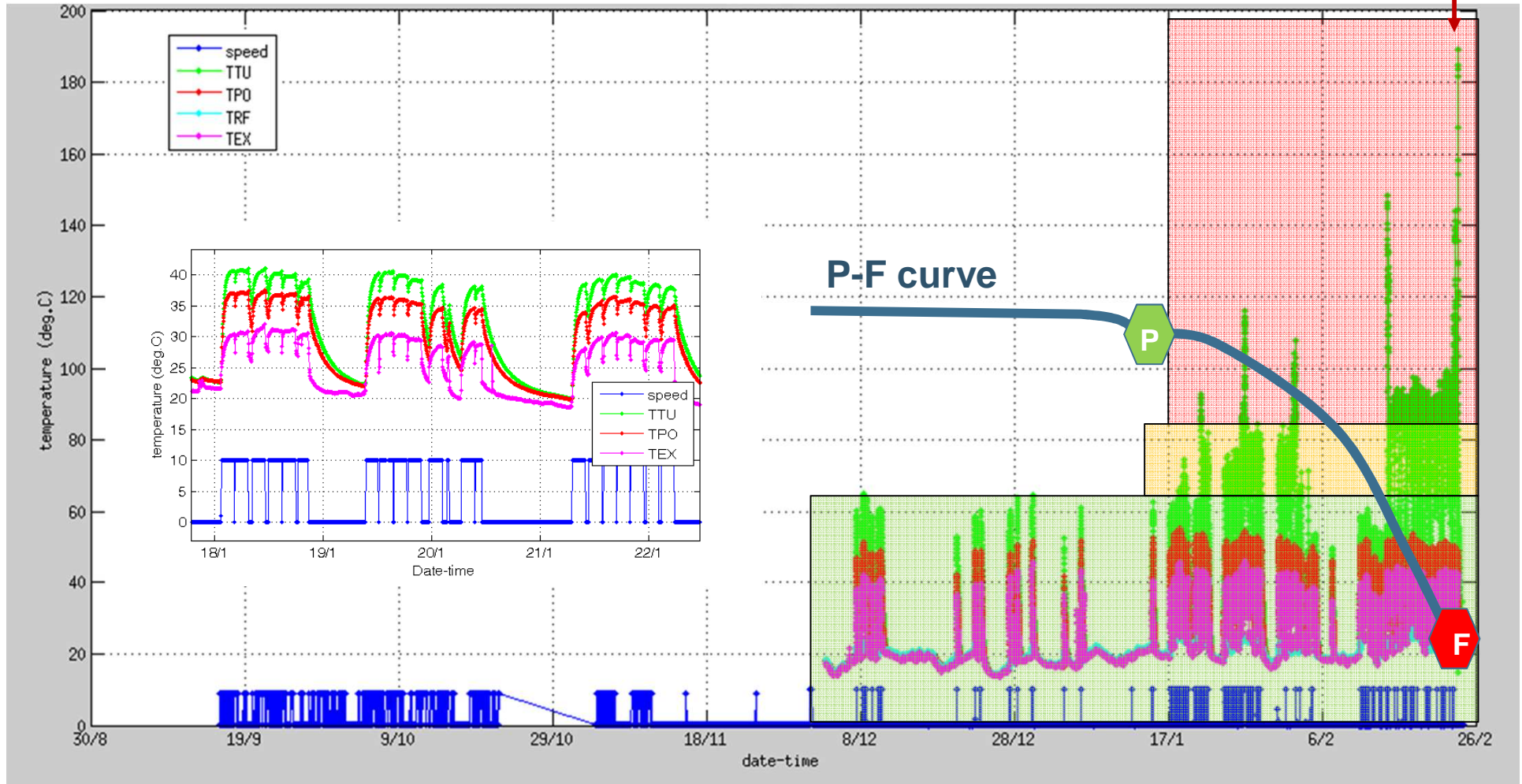
Physical Measurement	Fault
Vibration	High overall vibration level (ISO 10186)
	Imbalance
	Misalignment
	Bearing damage
Temperature	Poor greasing
	Insufficient cooling

- + For bearing condition monitoring, temperature sensors could also be used to monitor some of these failures
- + The advantage compared to MEMS is the price ratio (~1/100)



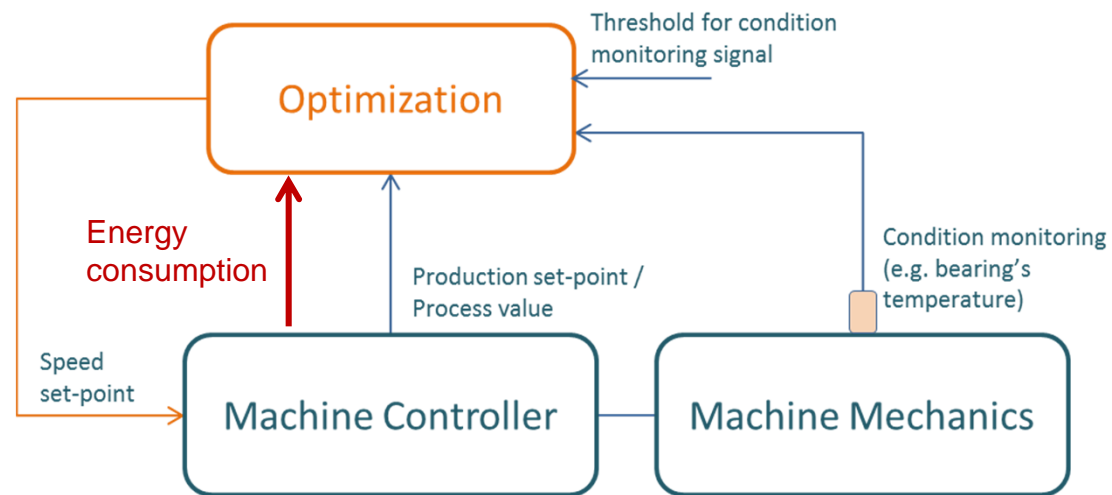
# Catastrophic failure monitoring – same example slide 16

Accidental stop (cage broken, 200° C!)



# Performance optimization using temperature monitoring

- + A possible way to extend lifetime of bearings would be to control the operational temperature area
- A thermal protection at 70°C was implemented in machine's controller to shut-down the machine if such a level is exceeded
- We propose in the project to implement optimization of machine's settings taking into account condition monitoring and that
  - using single-objective (e.g. maximize production capacity)
  - using multi-objective (e.g. maximize production capacity and minimize power consumption)



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# Summary

- + **Monitoring the condition of the assets is needed to increase the availability and to improve the performance of the system / process**
- + **Low-cost sensors might be a good investment to strengthen this monitoring (in a continuous way) and increase the Return On Investment (ROI)**
- + **MEMS trends (price decline , increased maturity) are indicators of this potential ROI increases**
- + **Examples using main condition monitoring (vibration) in rotary machines successfully showed the potential of MEMS accelerometer to correctly predict different types of bearings related faults / failures**
- + **Thanks to the very low price, temperature sensors represent also cheap solutions for condition monitoring in some cases**
- + **Example of catastrophic bearing's failures prediction was shown based on temperature monitoring**
- + **Condition monitoring could be used not only to monitor the condition of the asset but also to optimize its performance**



# Questions?

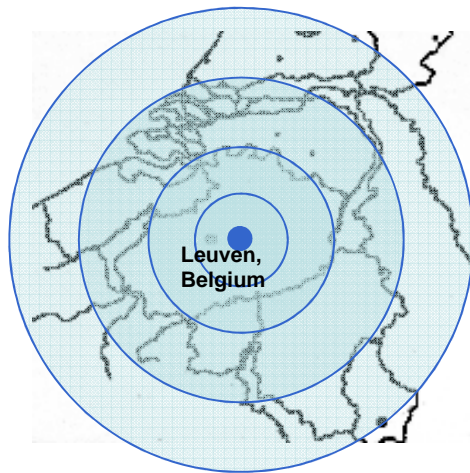


## FMTC vzw

Celestijnenlaan 300 D  
3001 Leuven

T: +32 16 32.80.50  
F: +32 16 32.80.64

Mail: [info@fmtc.be](mailto:info@fmtc.be)  
Web: [www.fmtc.be](http://www.fmtc.be)



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