

LE RENDEZ-VOUS INTERNATIONAL  
CONFÉRENCES | ATELIERS | EXPOSITION

THE INTERNATIONAL MEETING  
CONFERENCES | WORKSHOPS | EXHIBITION

HPC  
SIMULATION  
BIG DATA

# Forum teratec

*Unlock the future!*

11 & 12 JUIN 2019  
JUNE 11 & 12

ÉCOLE POLYTECHNIQUE  
PALAISEAU-FRANCE

PLATINUM SPONSORS



GOLD SPONSORS



SILVER SPONSORS



PARTENAIRE  
CAFÉ EUROPÉEN  
DE LA RECHERCHE



AVEC LE SOUTIEN DE





# REAL-TIME ANOMALY DETECTION USING DEEP LEARNING TO PREDICT ROBOTS' FAILURES

Dr Jean-Laurent PHILIPPE, Senior HPC Technical Specialist, Intel DCG

With the great support from Nir LOTAN, Machine Learning, Deep Learning Products Manager  
Intel - Advanced Analytics

# Legal Notice

This presentation is for informational purposes only. INTEL MAKES NO WARRANTIES, EXPRESS OR IMPLIED, IN THIS SUMMARY.

Software and workloads used in performance tests may have been optimized for performance only on Intel microprocessors. Performance tests, such as SYSmark and MobileMark, are measured using specific computer systems, components, software, operations and functions. Any change to any of those factors may cause the results to vary. You should consult other information and performance tests to assist you in fully evaluating your contemplated purchases, including the performance of that product when combined with other products.

For more complete information about performance and benchmark results, visit [www.intel.com/benchmarks](http://www.intel.com/benchmarks)

Intel and the Intel logo are trademarks of Intel Corporation in the U.S. and/or other countries.

\* Other names and brands may be claimed as the property of others.

Copyright © 2019, Intel Corporation. All rights reserved.

# Manufacturing @Intel



# Advanced Analytics

- Applying IoT and AI at Intel, for example:



Fan filters  
predictive  
maintenance



Robots failure  
detection



Multi-params  
fault  
detection



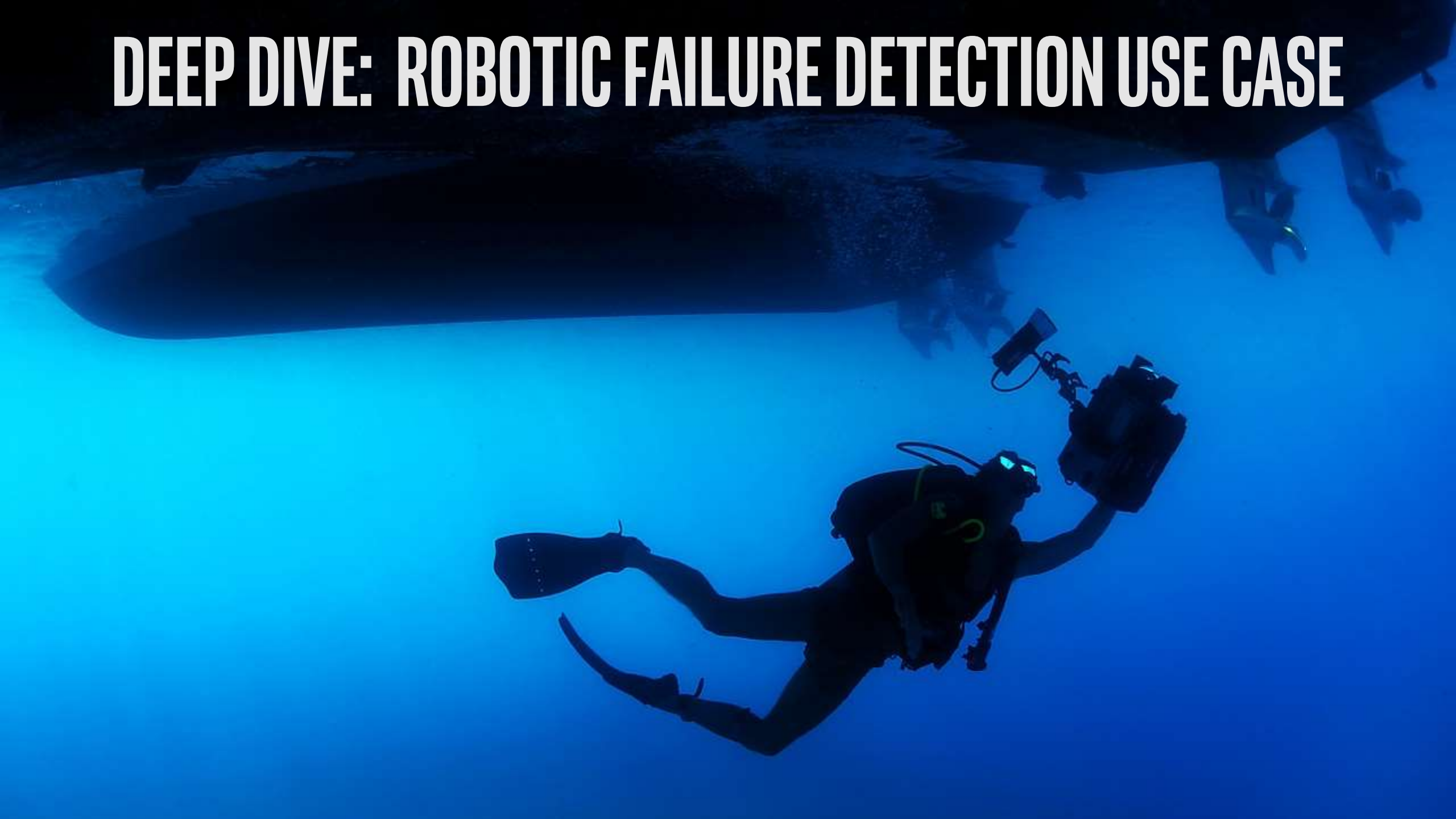
Visual  
inspection



Health  
Clinical Trial  
Platform

Vision: Put AI to work for human experts

# DEEP DIVE: ROBOTIC FAILURE DETECTION USE CASE



# Use Case Background Video



# Robotic failure – problem statement

- High volume manufacturing employ large number of robots
- Robots faults affect production yield, equipment downtime and factory throughput
- Detection of anomaly in the robots is done manually during scheduled maintenance





So what did we do?

# **ALGORITHMIC CHALLENGES**

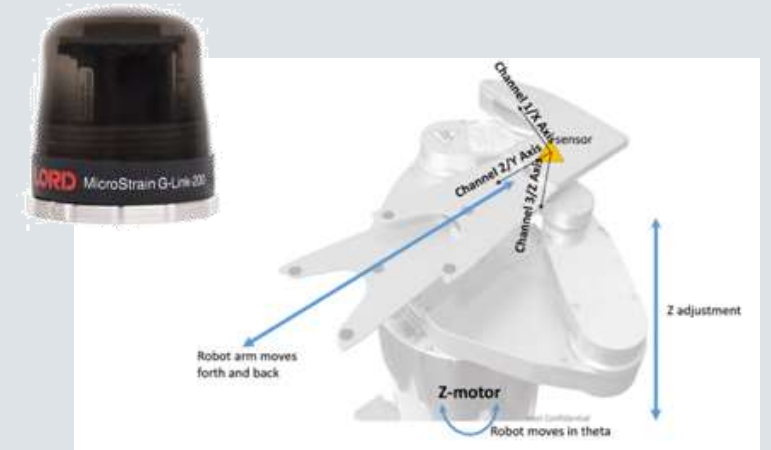
# How can we get data?

Consider that:

We want to be as little intrusive as possible.  
The robots are moving within a machine

Approach:

2 Accelerometers were placed on each robot  
Each accelerometer sends data at freq. of 512Hz  
Accelerometers transmit their readings wirelessly

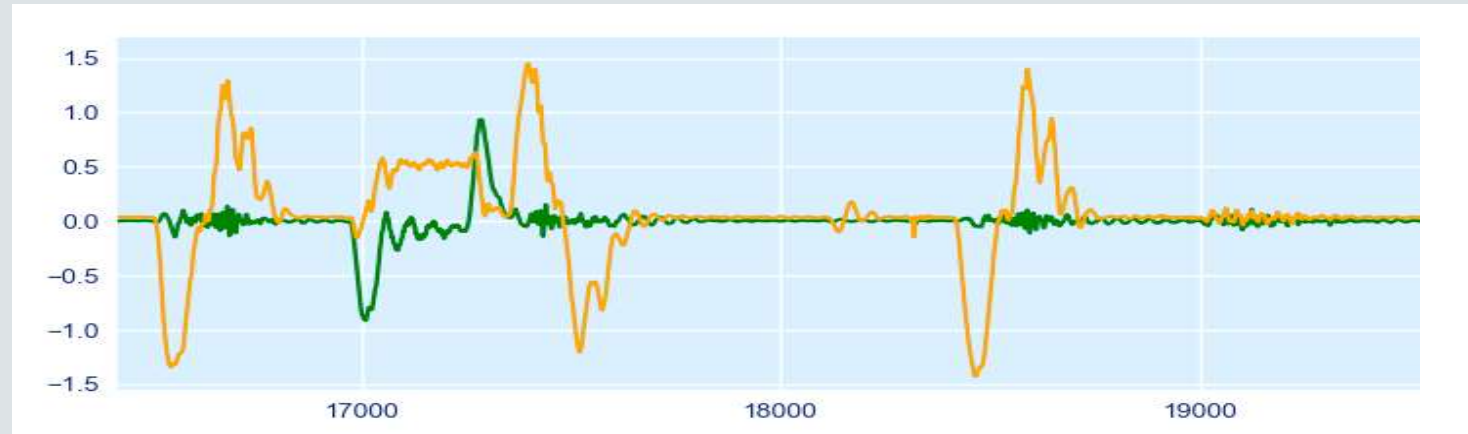


Target: Real time failures detection based on the robot's vibration

# How can we analyze the data?

Consider that:

Basic / User defined rule  
don't work on this kind of  
data



Approach:

Use machine learning (a.k.a. "A.I")

– implement a system that is able to "learn" with data, without being explicitly programmed

# How can we get “tagged” data?

Consider that:

Machine learning needs a lot of examples – good and bad

Approach:

Use an “unsupervised” approach:

Learn only the good behavior, and treat any anomaly as “bad”



Intuition!

Think about your  
spelling checker

# How to create a scalable solution?

Consider that:

We need an algorithm that works on hundreds of robots

Approach:

Take an “online learning” approach – the algorithm learns as it goes (or builds a baseline)

# How to create a good predictor?

Consider that:

The robot behavior is not repetitive and unpredictable, it has practically infinite number of "recipes"

Approach:

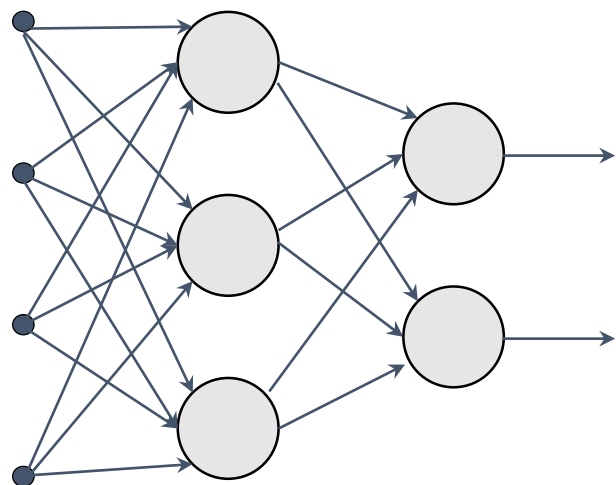
Traditional machine learning did not provide good prediction, so we selected Deep Learning RNN - LSTM

# Deep learning RNN - LSTM

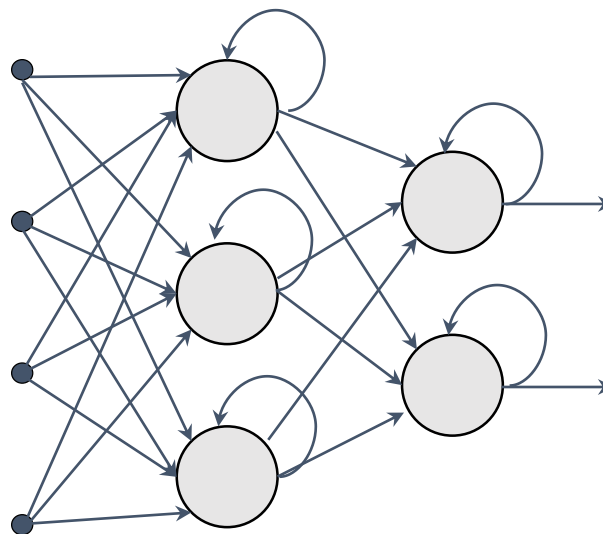


Intuition!

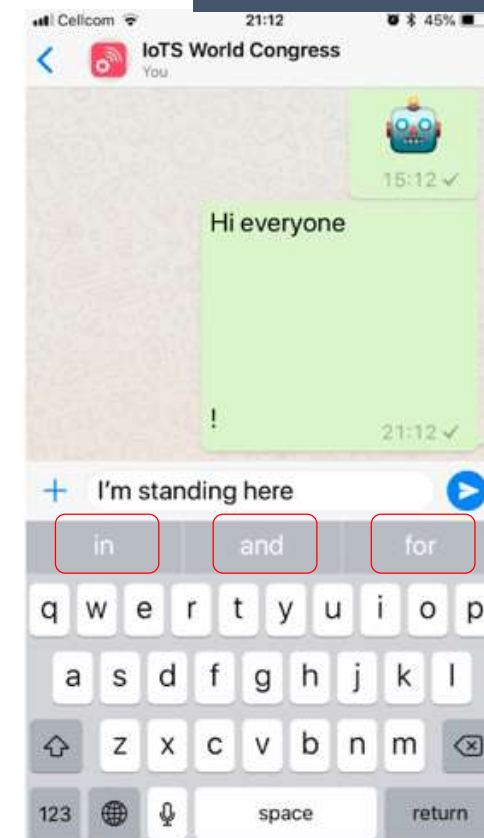
Think about your  
phone keyboard  
predicting your  
next word



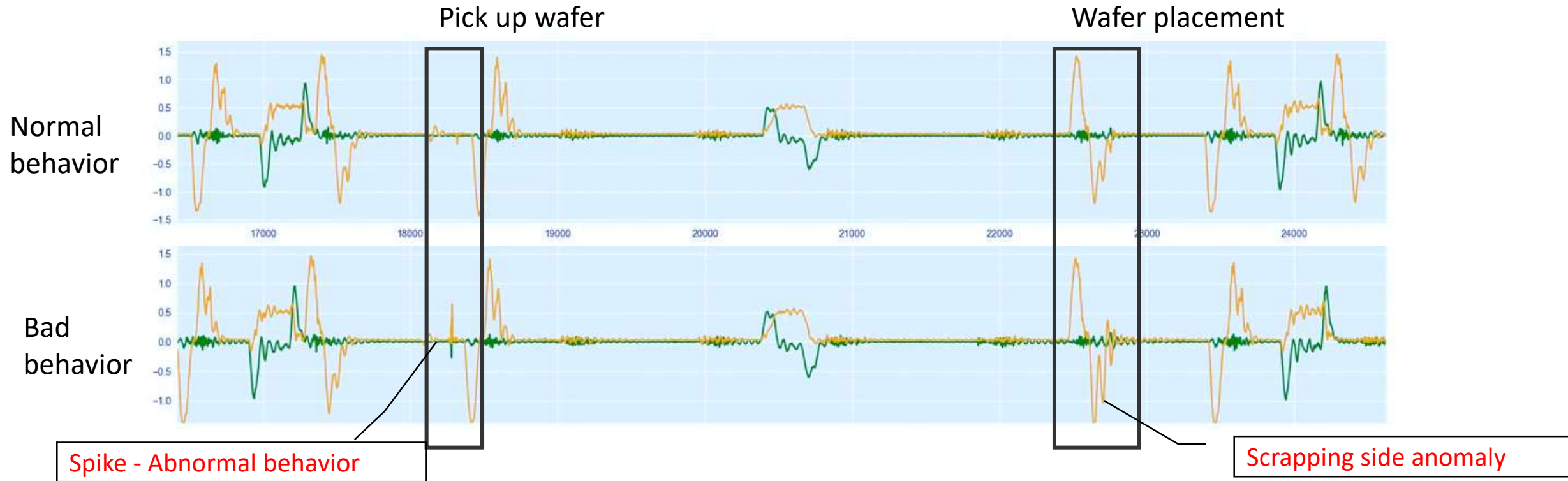
Feed-Forward Neural Network



Recurrent Neural Network



# Results



few seconds for detection  
prior to failure  
Allowing real time actuation

100% detection rate

~0% false alarm rate



# ENGINEERING CHALLENGES

# Data Size & Frequency, IP Sensitivity & security

Remember:

Each accelerometer provides 3 data points at rate of 512Hz

Data is sensitive, and we don't want the data to leak or anyone externally to have access to the system

Approach:

Choose/develop an on-premise solution

# Latency & Actuation

Remember:

Our algorithm predicts the robot failure just a few seconds before it happens

Approach:

We need to be close to the machine and act immediately – choose an edge/fog solution

# Scale

Remember:

We want the project to scale, and be as cost effective as possible

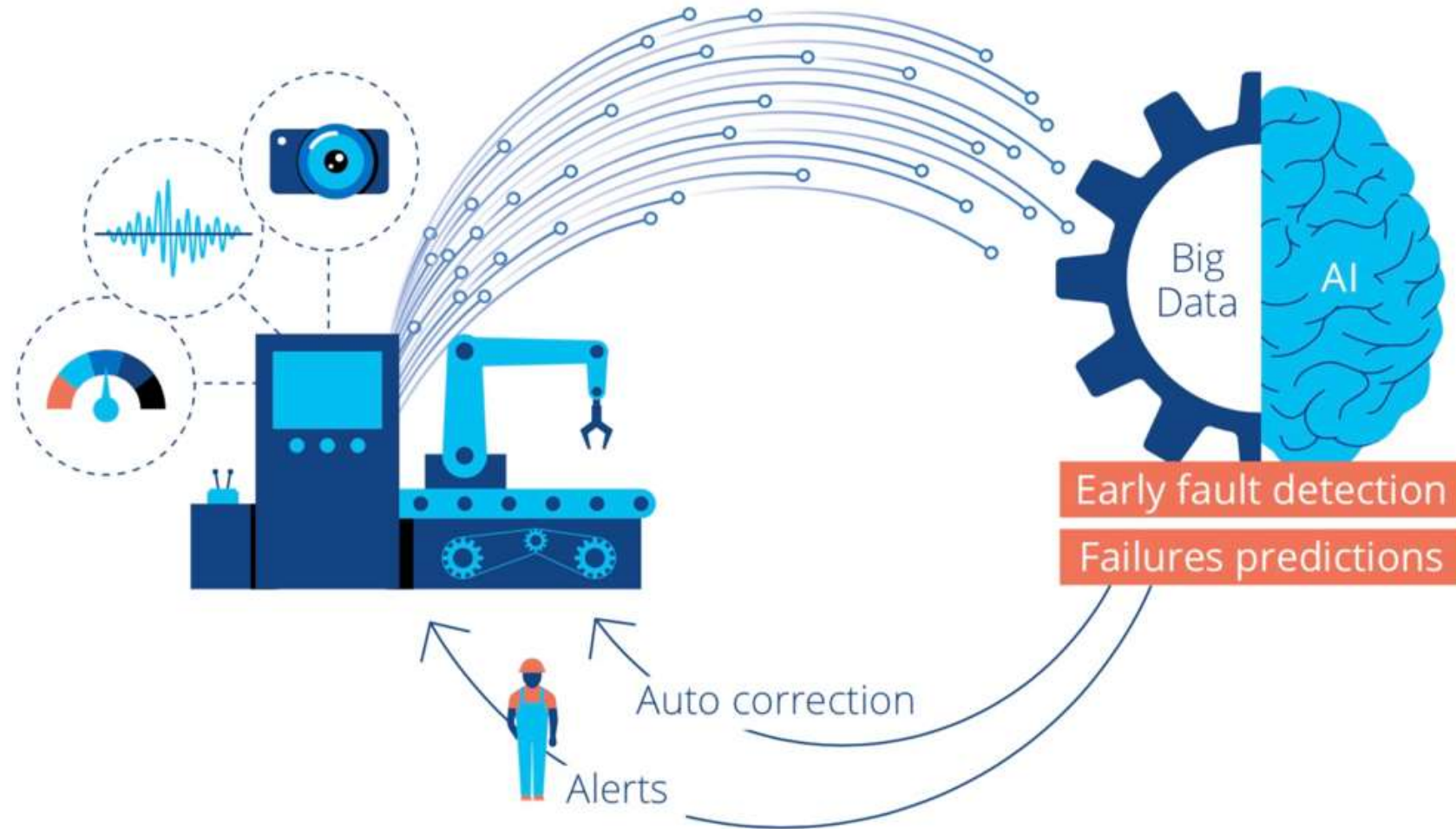
Approach:

Choose Intel core i5 platforms with small footprint (NUC)
















They are cheap, but have relatively powerful compute power

# Industrial AI platform

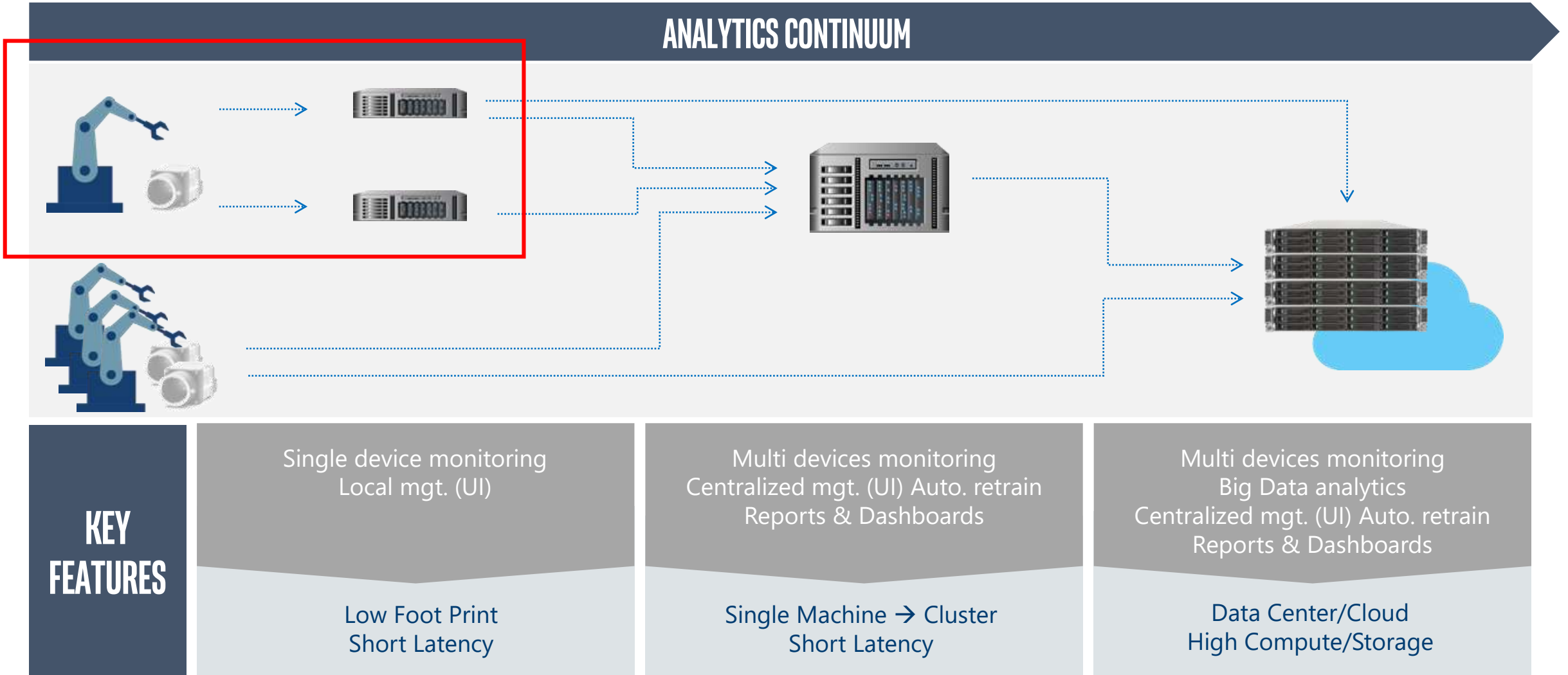
AI platform for continuous real time fault detection and failures prediction



# FOG SOFTWARE TECHNOLOGY STACK

PROGRAMMING LANGUAGES	    	
ML & DEEP LEARNING - INFERENCE	Intel® MKL & DAAL	
STREAM ANALYCS LAYER	Python for Kafka Streams	
STORAGE LAYER	 	
CONTAINER TECHNOLOGY	  	
OPERATING SYSTEM	 	

# Choose the right solution for your problem



# Takeaways

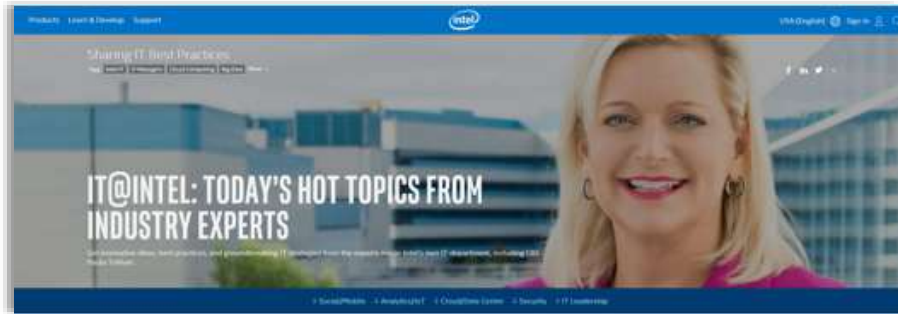
- **Its not trivial** – analytics/algorithmics (don't expect miracles)
- It is doable! **Take the leap of faith!**
- Come and talk to us –we are doing this every day!

Thank you!

[nir.lotan@intel.com](mailto:nir.lotan@intel.com)  
[www.linkedin.com/in/lotan/](http://www.linkedin.com/in/lotan/)  
Twitter: @nirlotan



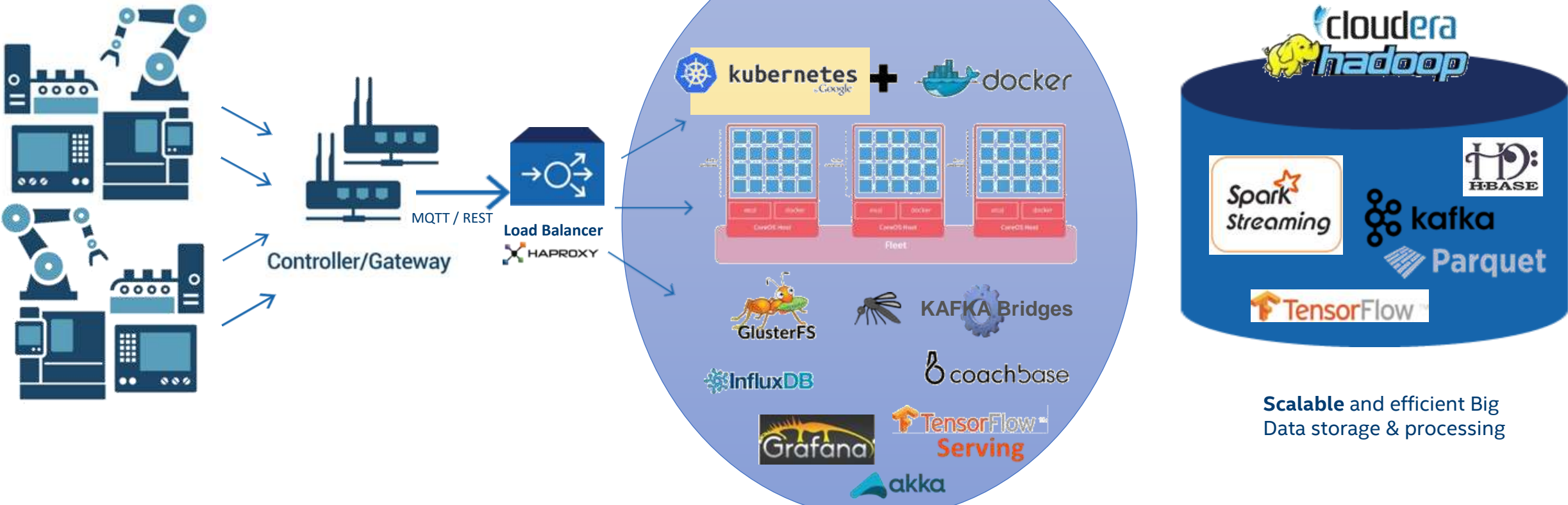
# IT@INTEL: Sharing Intel IT Best Practices With the World



Learn more about Intel IT's initiatives at: [www.intel.com/IT](http://www.intel.com/IT)



# HIGH LEVEL ARCHITECTURE



Set of containerized **managed micro-services** for **modularity** & ease of deployment

**Scalable** and efficient Big Data storage & processing

# software Architecture

