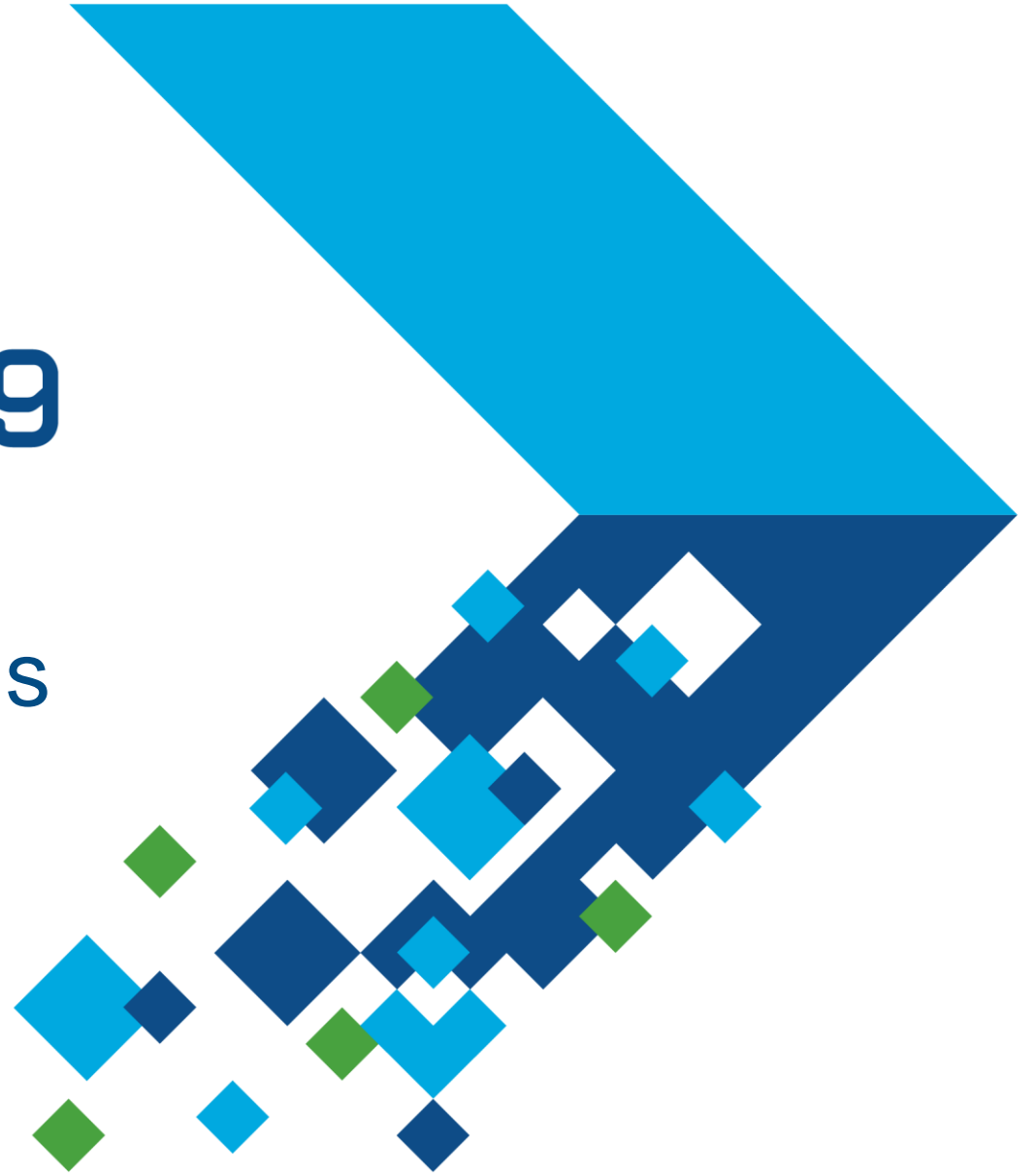


MATLAB EXPO 2019

Industrial IoT and Digital Twins

Coorous Mohtadi



Key Takeaways

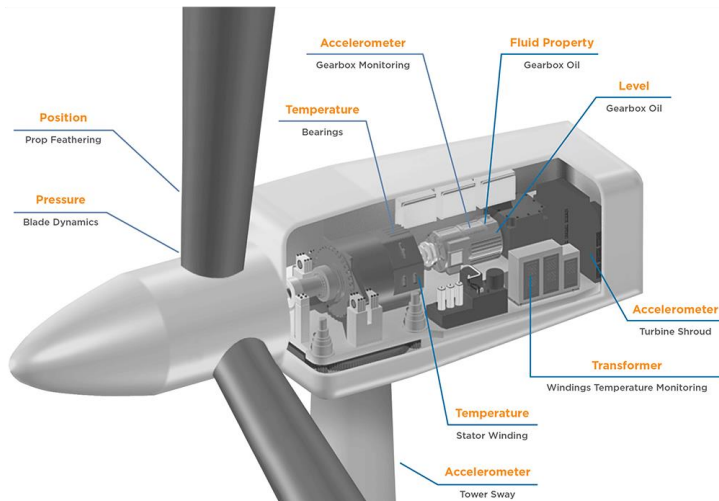
- You can use MATLAB and Simulink for IIoT and Digital Twin applications, leveraging their strong Modelling, system simulation, and data analytics capabilities
- MathWorks can help you get your project started with applications such as predictive maintenance, operations optimization, and fleet management

Megatrend: Digital Transformation and IoT

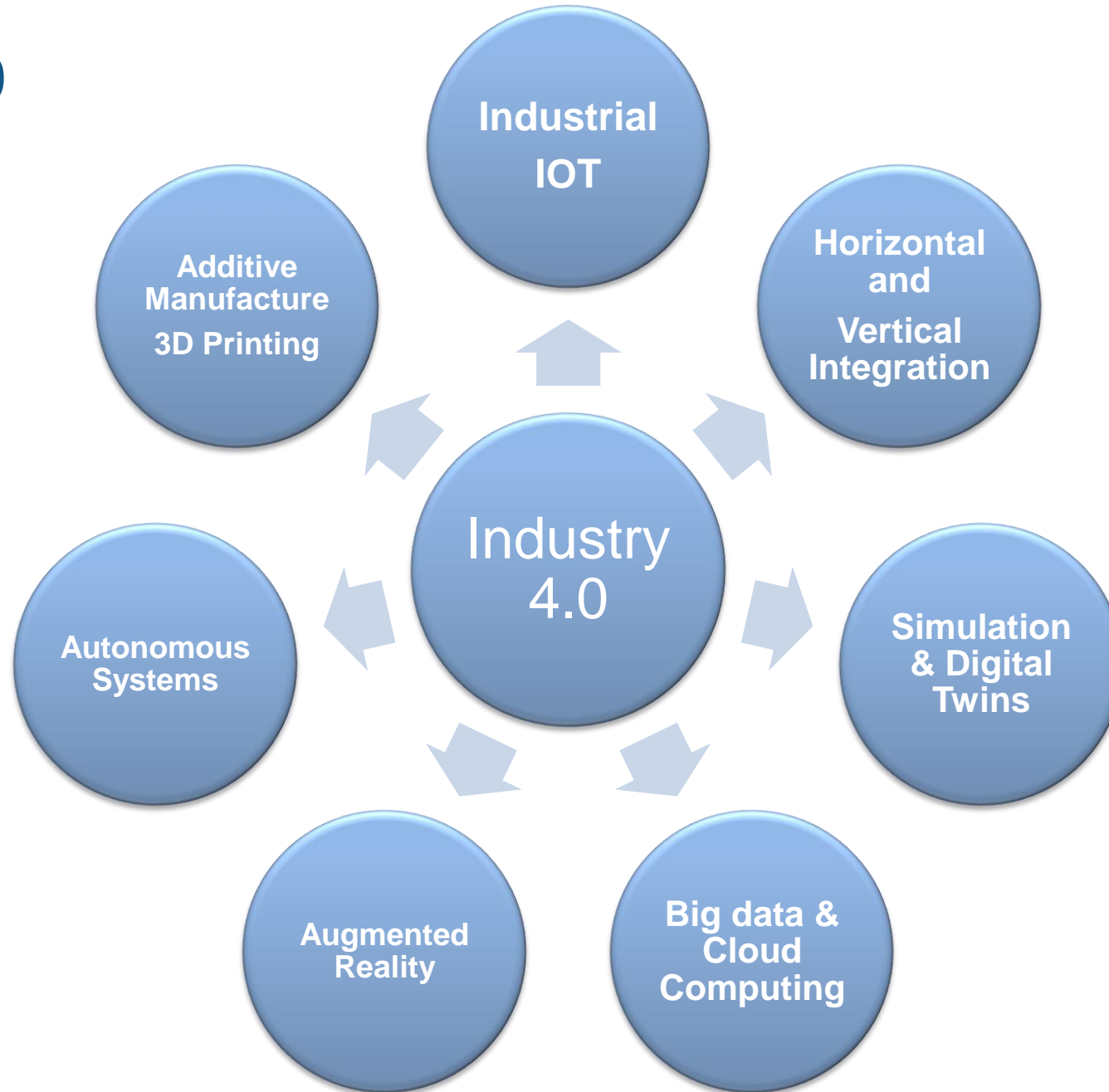
Overall Goals

By connecting machines in operation you can use data, algorithms, and models to make better decisions, improve processes, reduce cost, improve customer experience.

- Industrial IoT
- Digital Twin
- Industry 4.0
- Smart 'XYZ'
- Digital Transformation



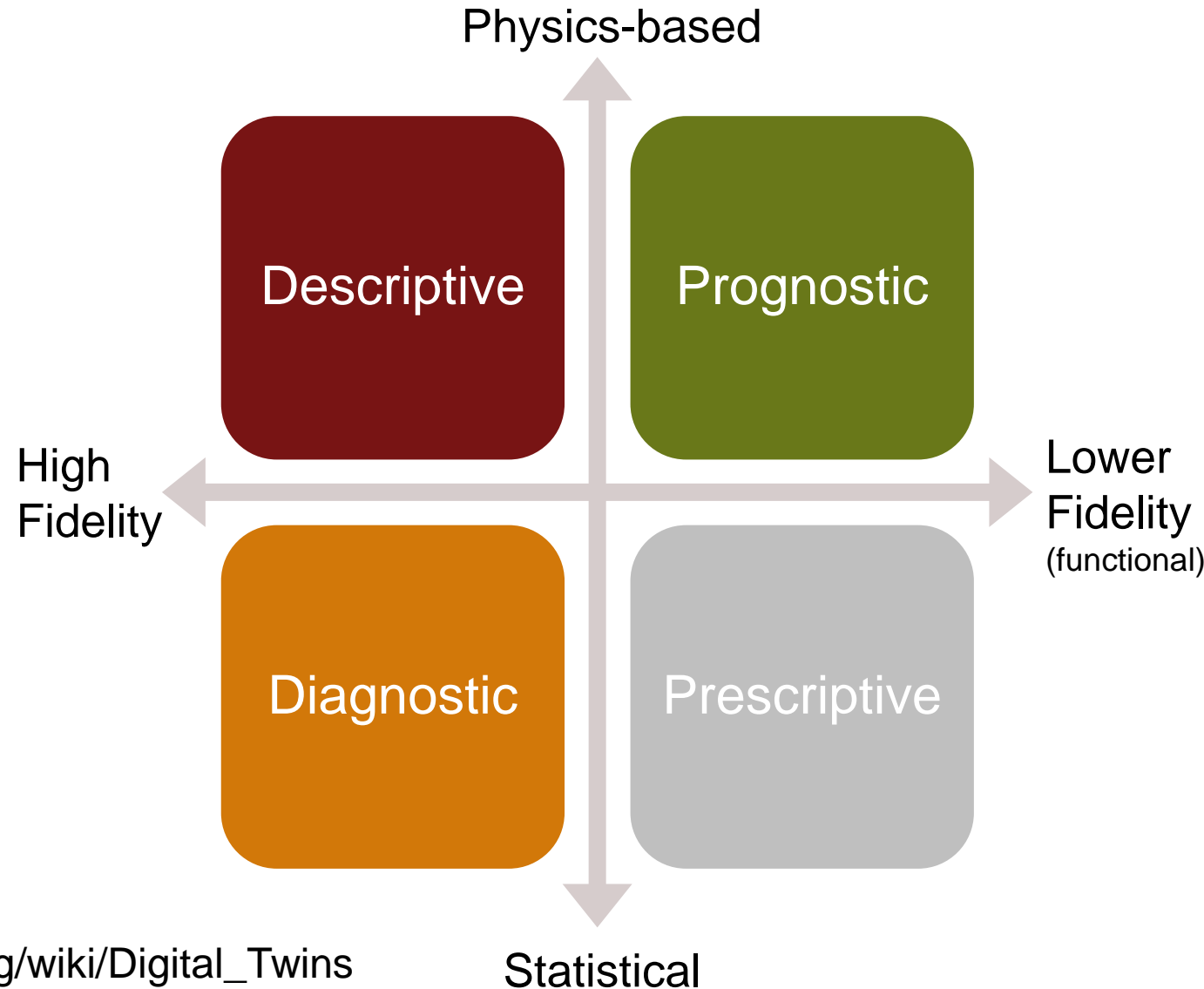
Industry 4.0



What is a Digital Twin?

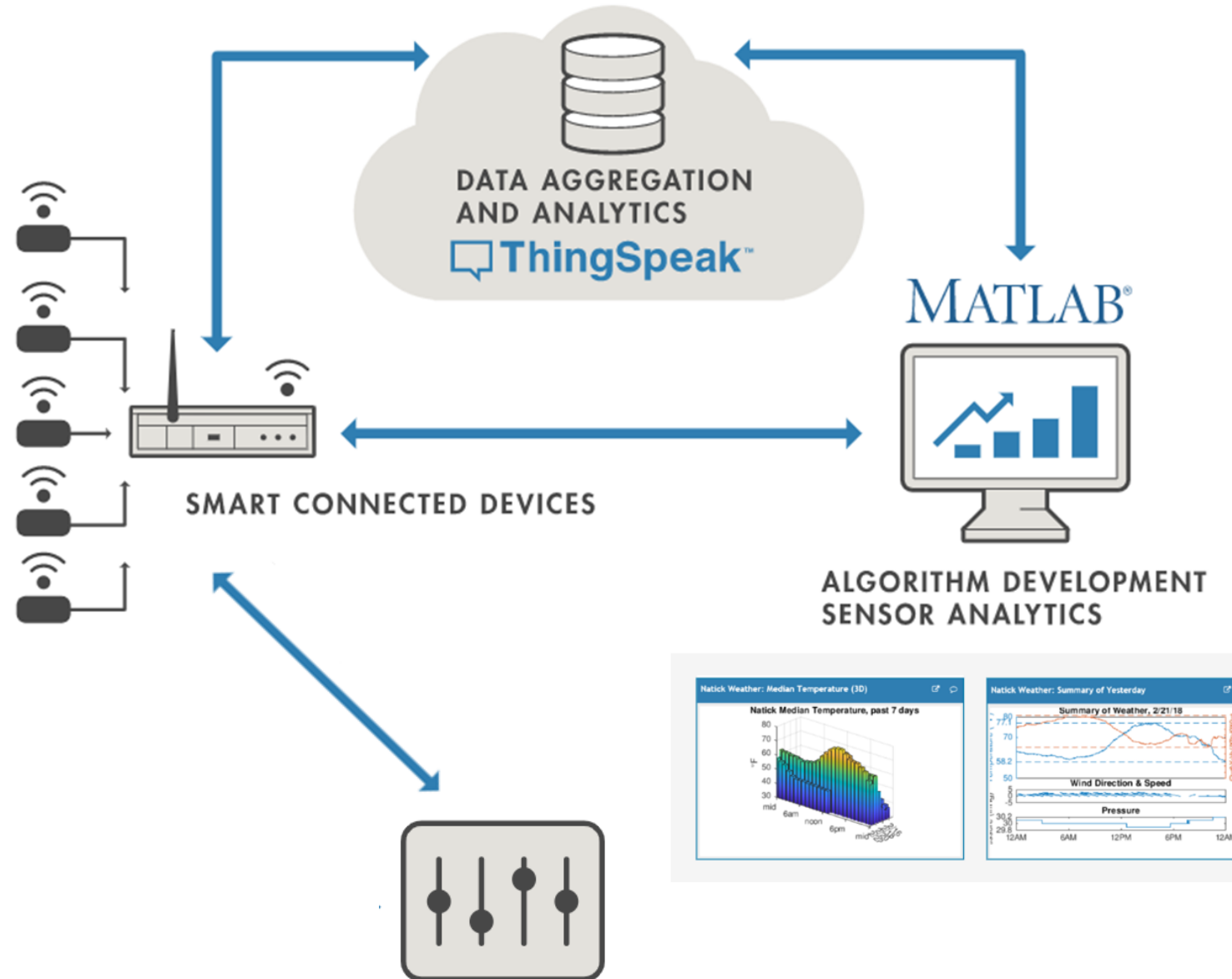
Digital twins refer to computerized companions of physical assets that can be used for **various purposes**.^[1]

- **Digital twins** use data from sensors installed on physical objects to represent their near real-time status, working condition or position.
- **Digital twins** can be also used for monitoring, diagnostics and prognostics.

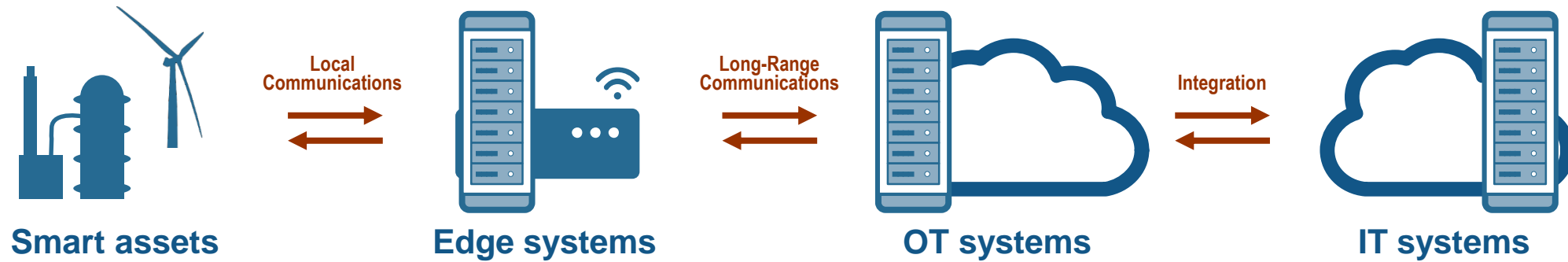


Internet of Things

- Connect to Hardware
- Data Aggregation
- Control Devices
- Custom Computations and Visualization

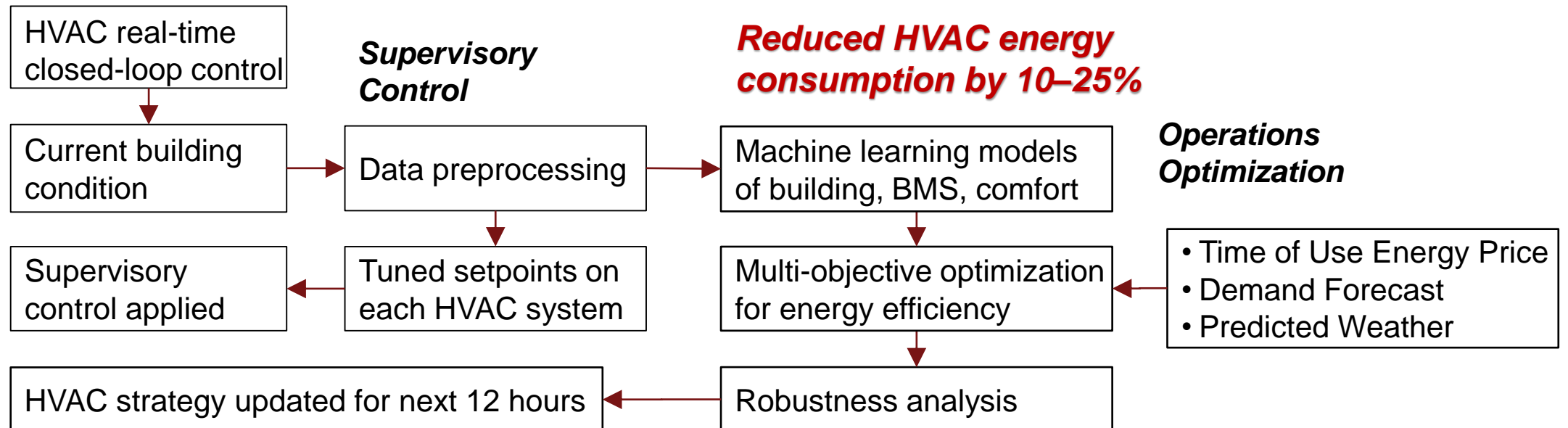
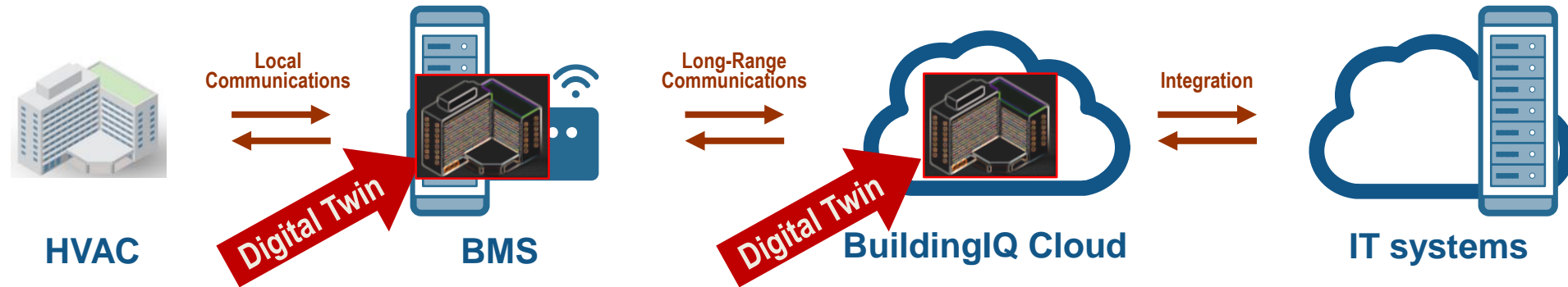


Organizations are Defining Infrastructure for Digitalization

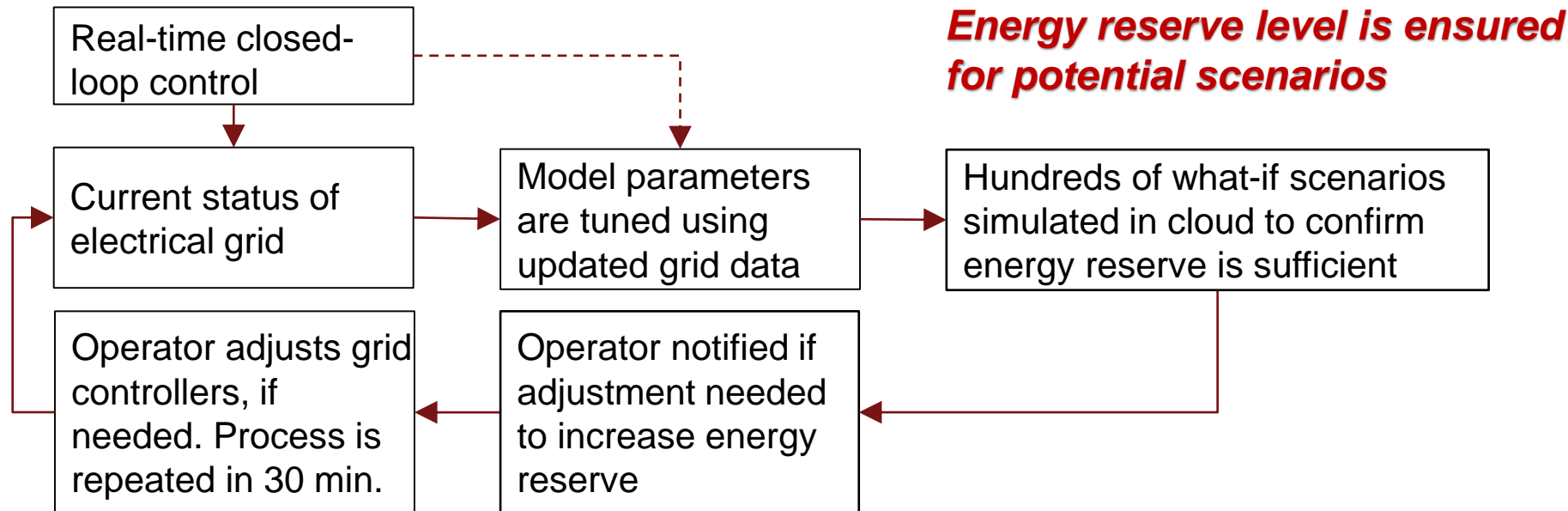
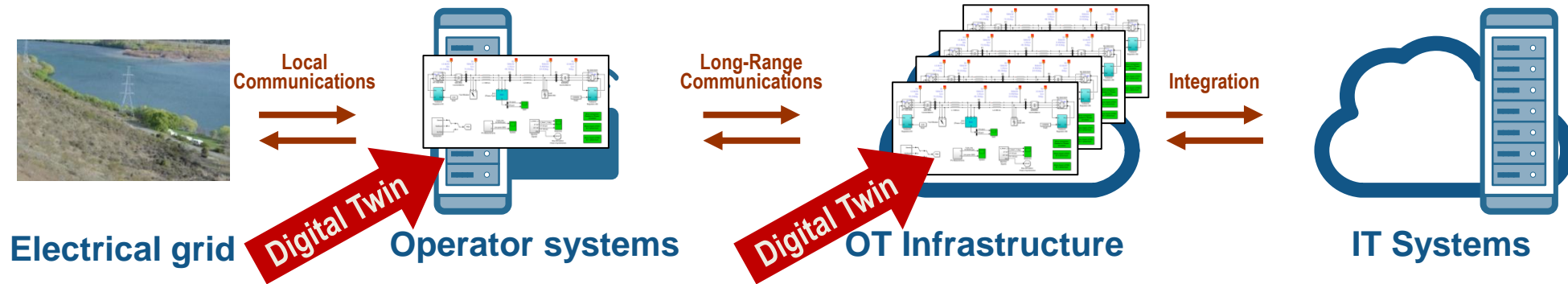


How are these used in an actual application?

Operations Optimization: BuildingIQ



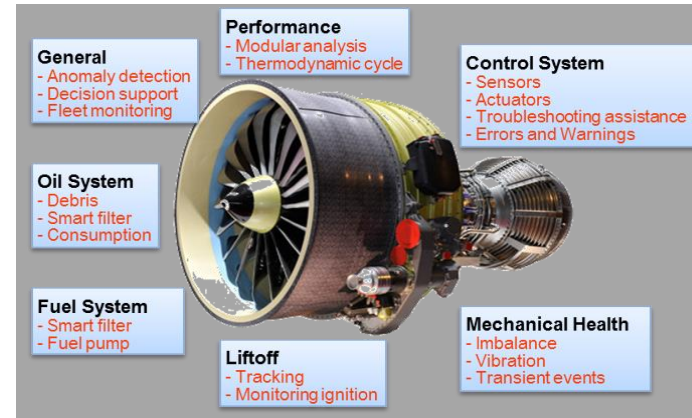
Performance Management: Electrical Grid Operator



Other Examples of Digital Twins Across Industries



Commercial Vehicles
Driving-data logs and digital twin used to verify and tune automatic braking system



Aerospace
Operation data used to plan maintenance, improve aircraft availability, and reduce engine out-of-service time

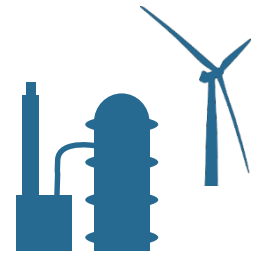


Space
Controller retuned to adjust for degraded thruster, confirmed with digital twin, and uploaded during deep space mission



Industrial Automation
Statistical models constantly updated to inform operators when plant is performing outside of optimal range

Applications at the Asset, the Edge, or Operational Technology Platform



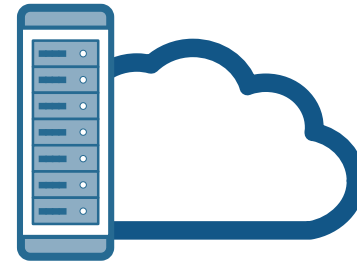
Smart assets

Local Communications



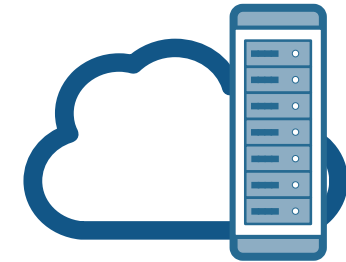
Edge systems

Long-Range Communications

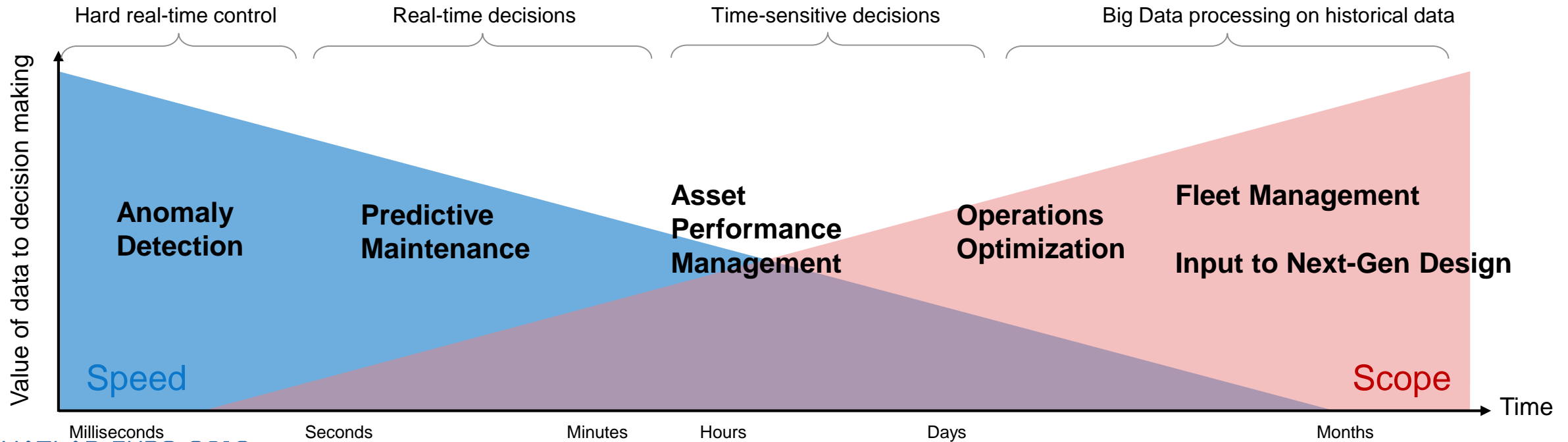


OT Infrastructure

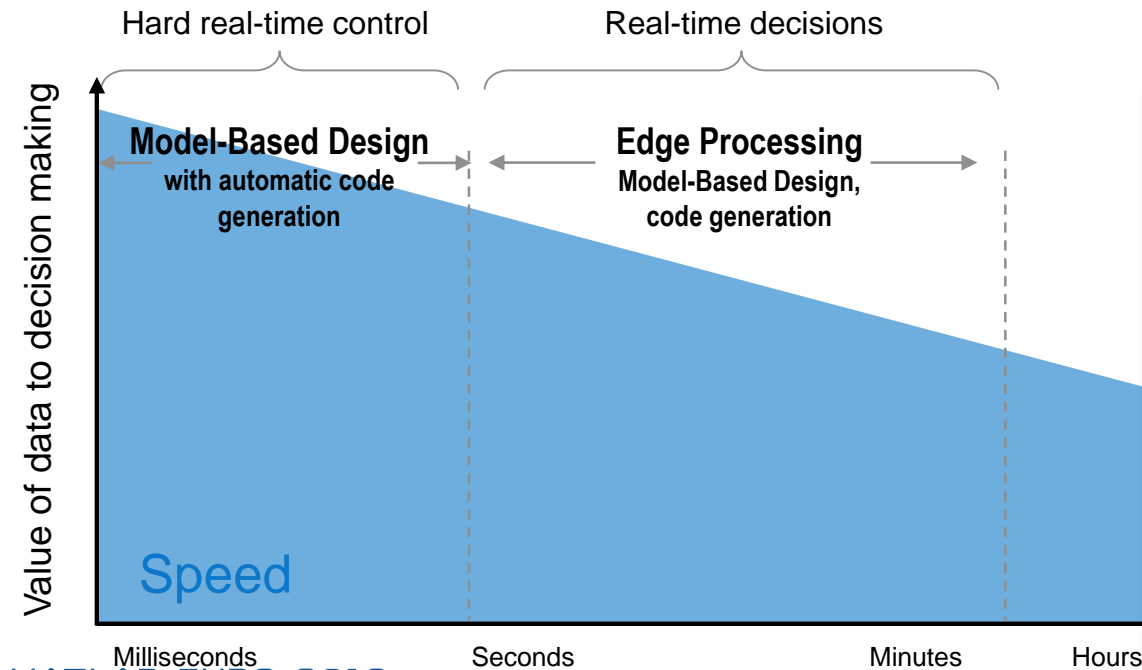
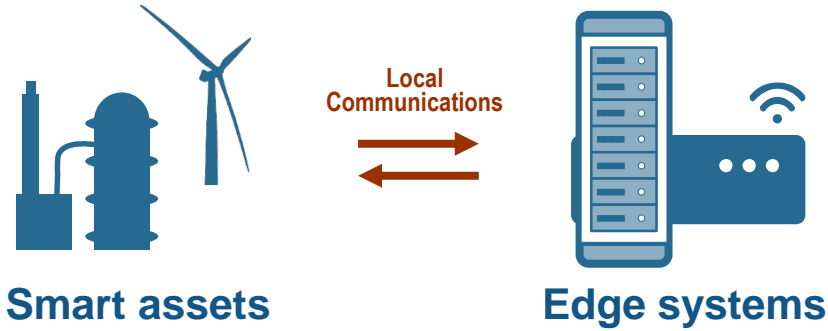
Integration



IT Systems



Development for Fast and Highly-Deterministic Systems



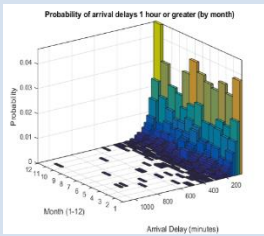
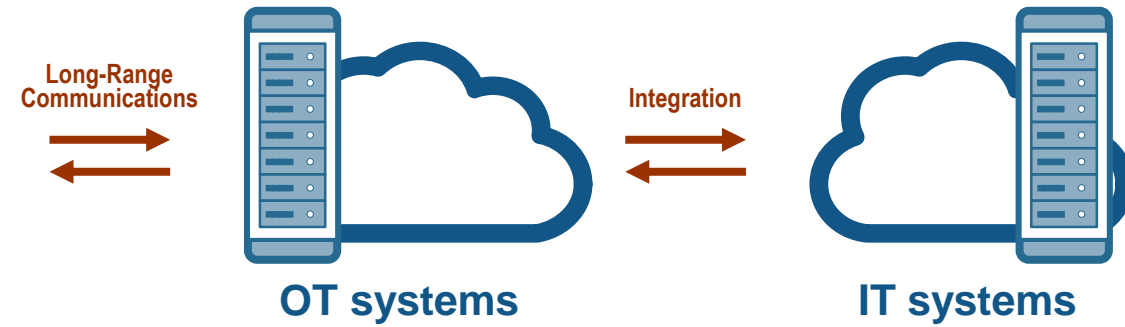
Model-Based Design

Multi-domain system Modelling

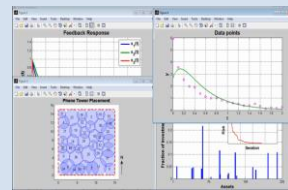
Parameter estimation

Automatic code generation

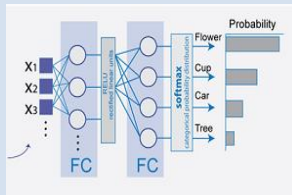
Development to OT/IT On-Prem and in Cloud



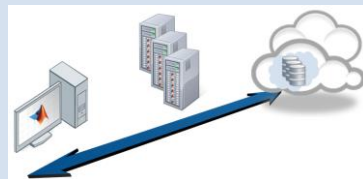
Variety and Volumes of Data



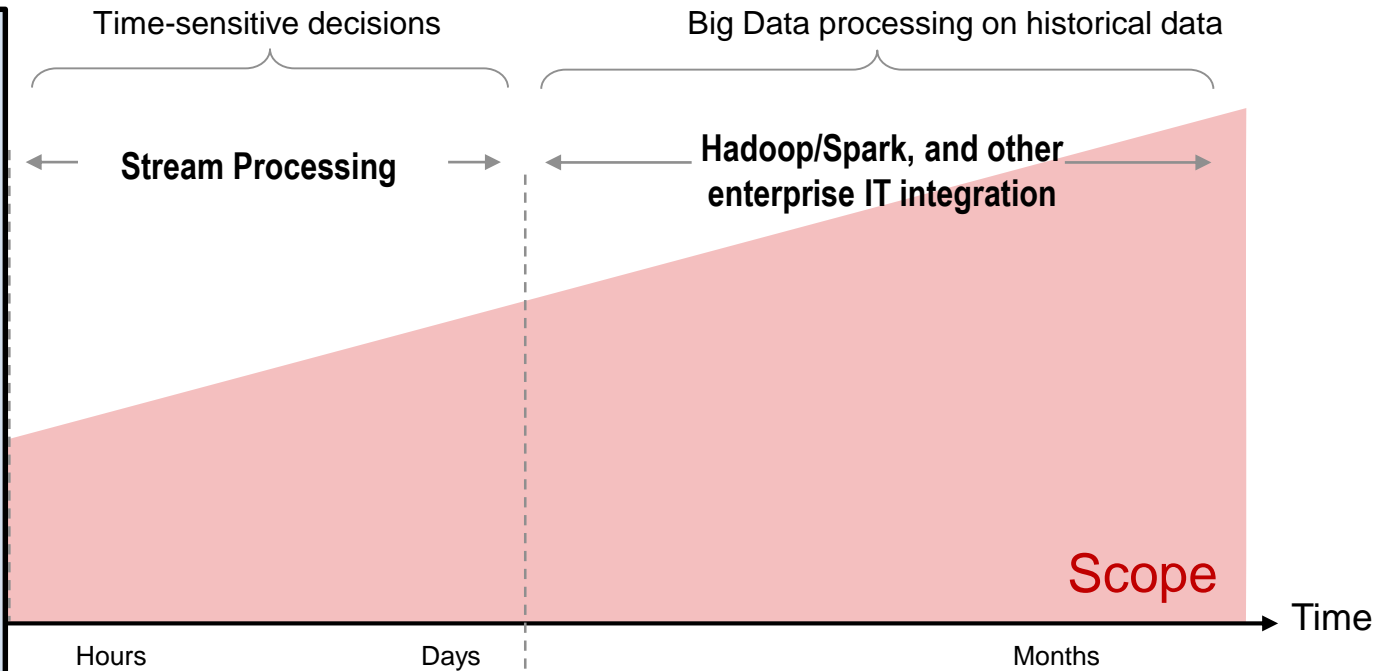
Optimization



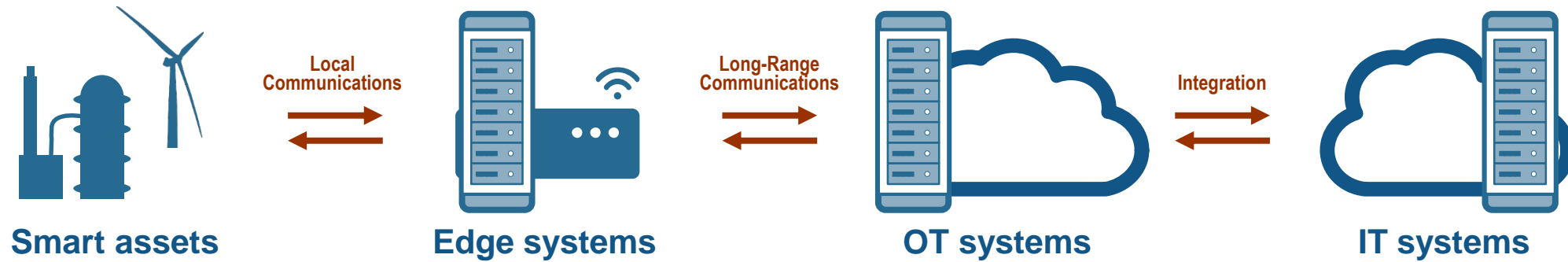
Machine Learning and Deep Learning



Enterprise system integration, (on-prem/cloud)

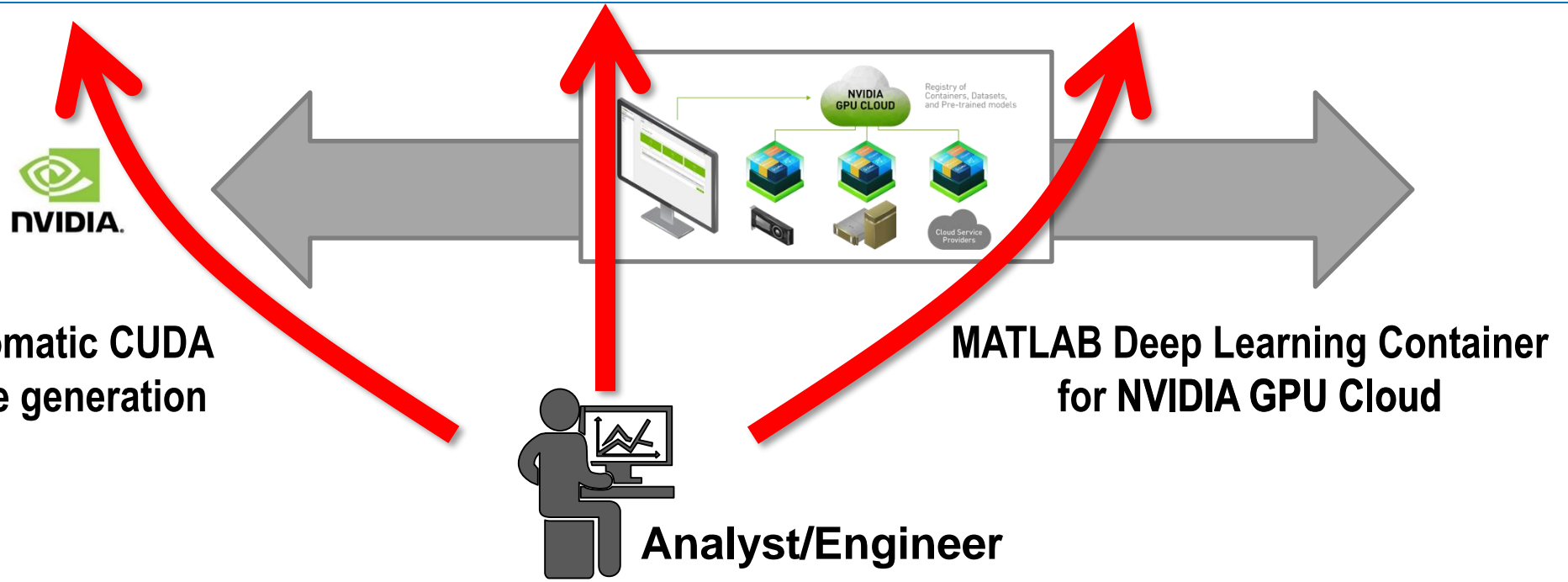
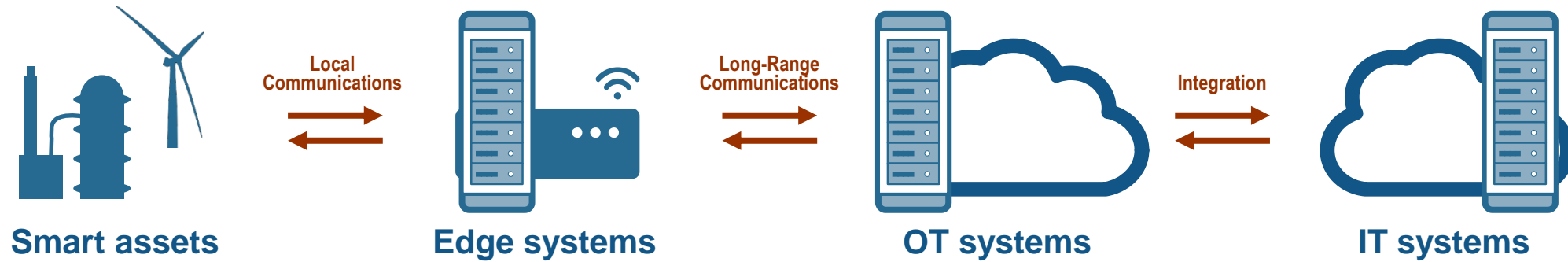


A Complex Collection of Tools, Platforms and Protocols



NXP, ARM, TCP/IP, MQTT, Azure Stream Analytics, Azure IoT Hub, Azure, TIBCO Spotfire, XILINX, NVIDIA, Rest APIs, amazon Kinesis, amazon web services, tableau, intel, life.augmented, Windows, MindSphere, AWS IoT, docker, Power BI, thingworx, Analyst/Engineer

A Complex Collection of Tools, Platforms and Protocols



Triplex Pump

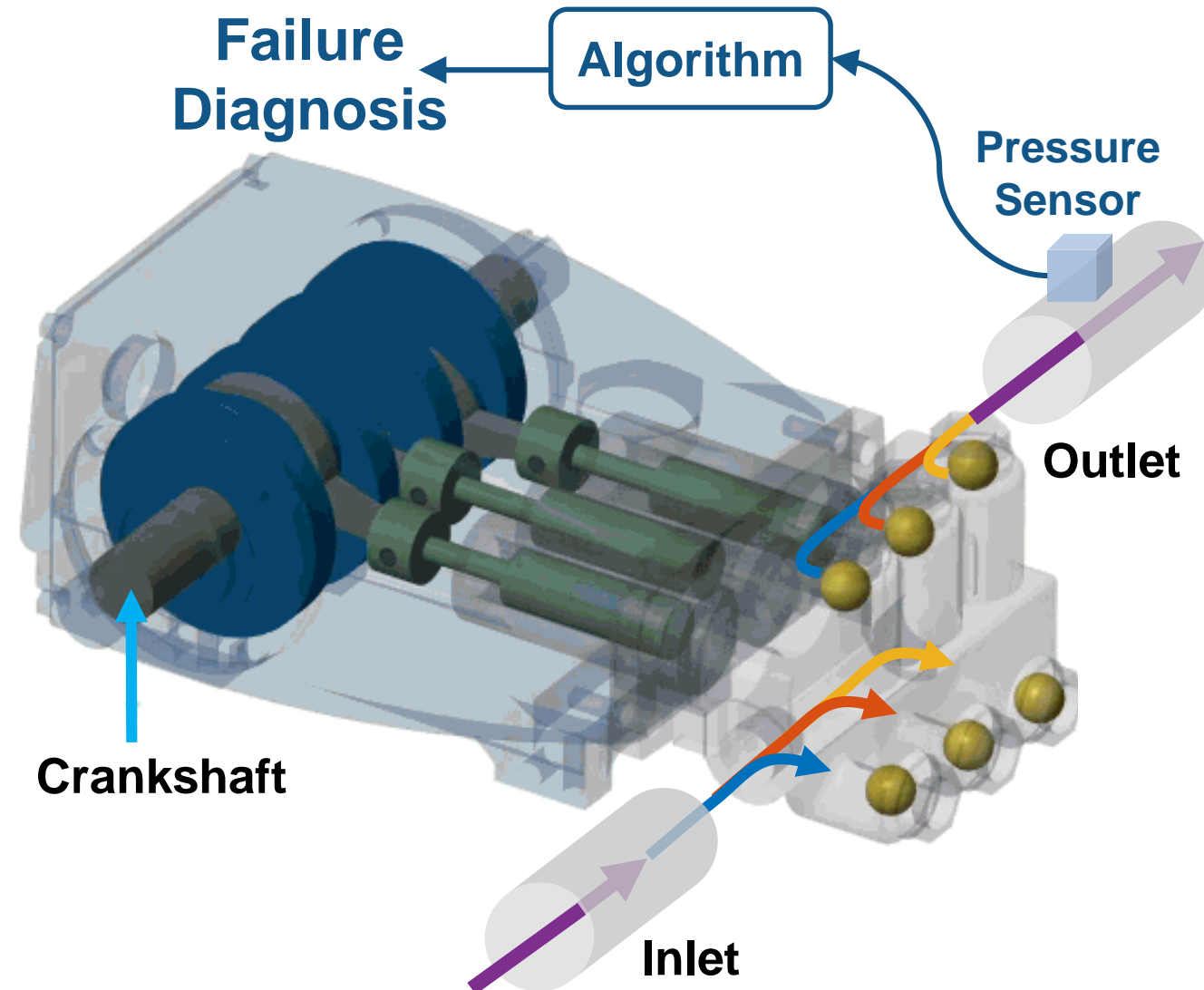
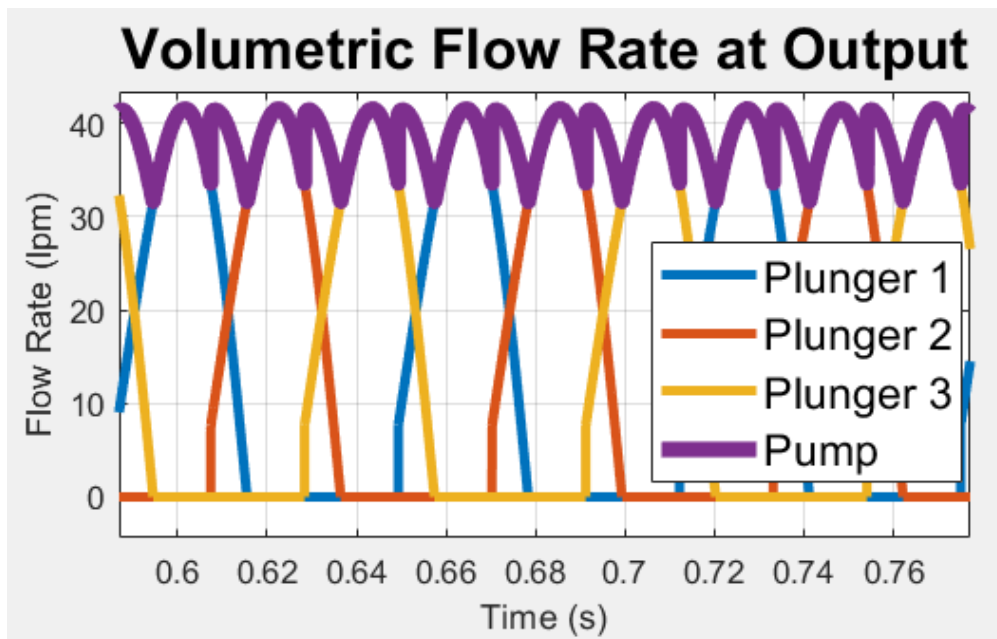


**BAKER
HUGHES**
a GE company

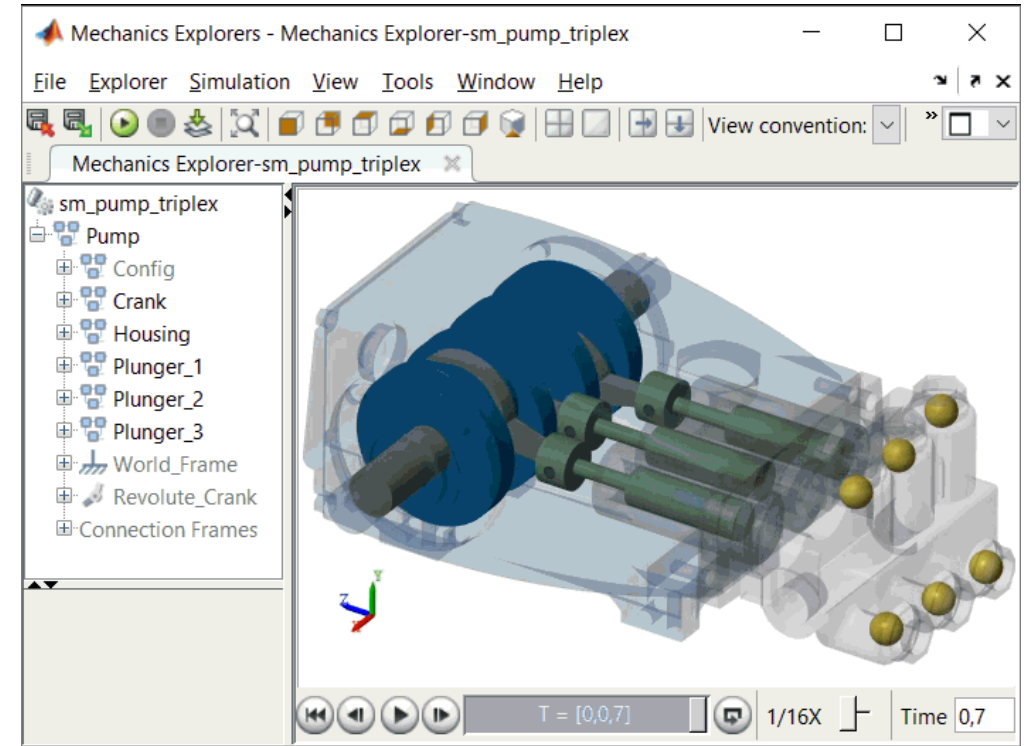
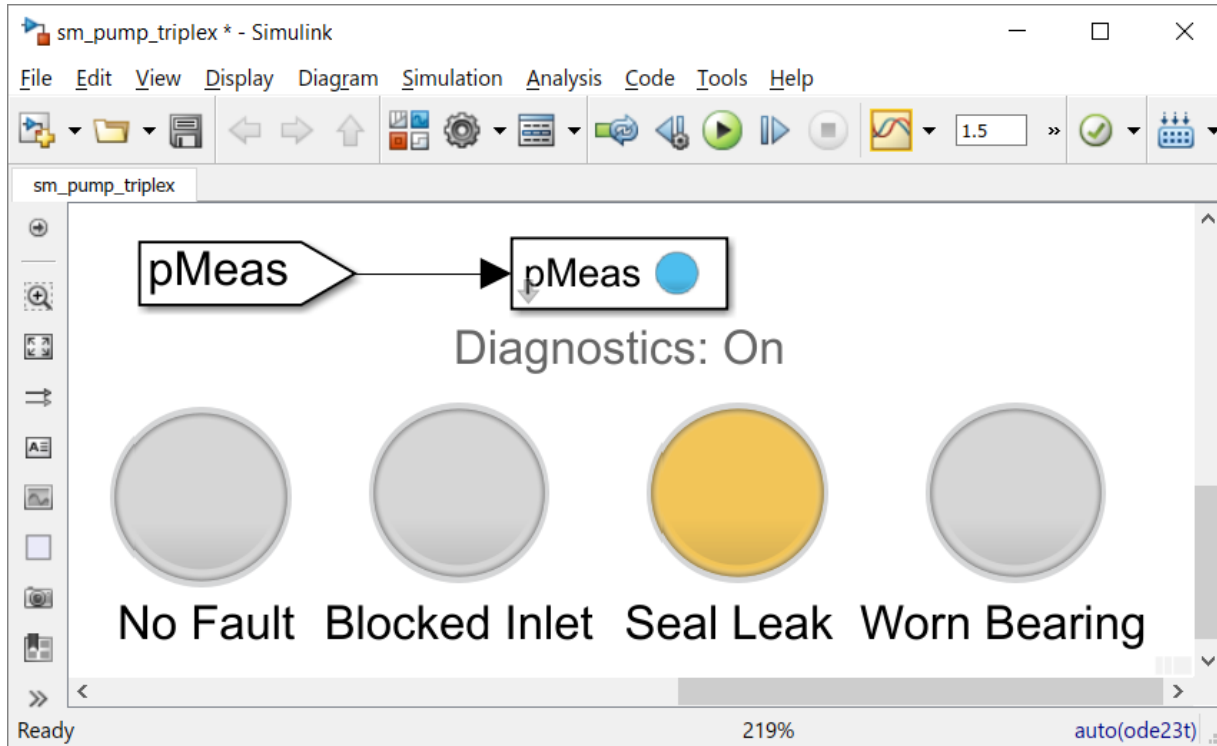


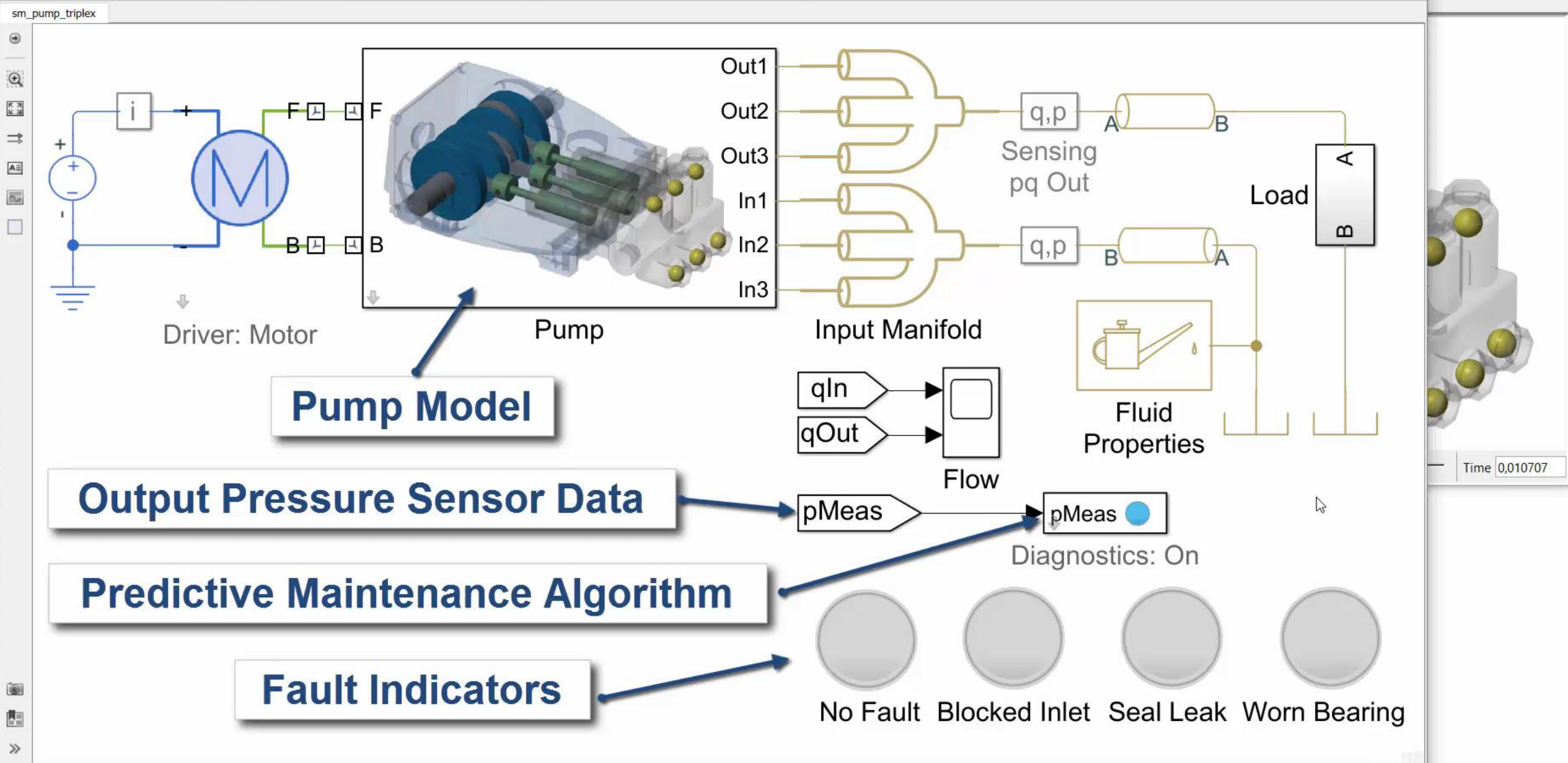
Triplex Pump

- Crankshaft drives three plungers
 - Each 120 degrees out of phase
 - One chamber always discharging
 - Smoother flow than single or duplex piston pumps



Predictive Maintenance Using Digital Twins





Pump Model

Output Pressure Sensor Data

Predictive Maintenance Algorithm

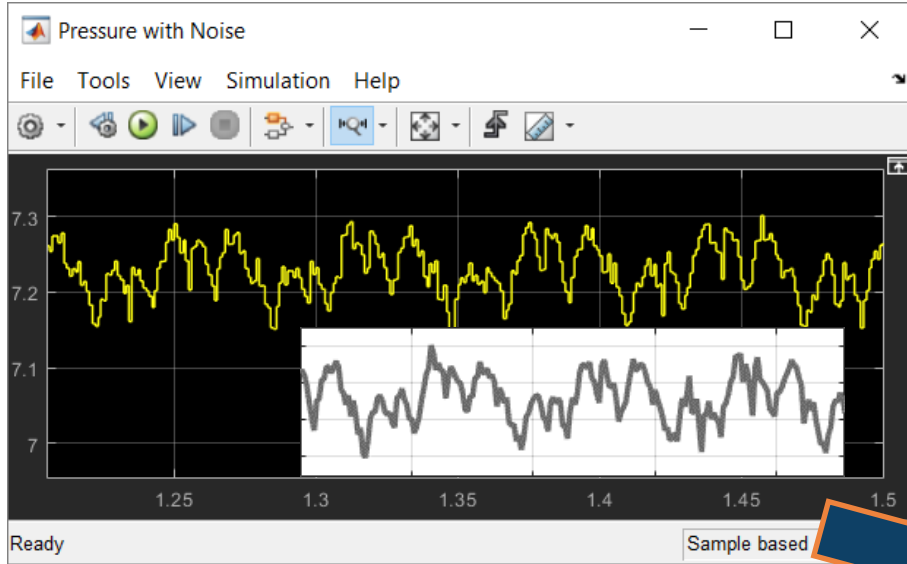
Fault Indicators

No Fault Blocked Inlet Seal Leak Worn Bearing



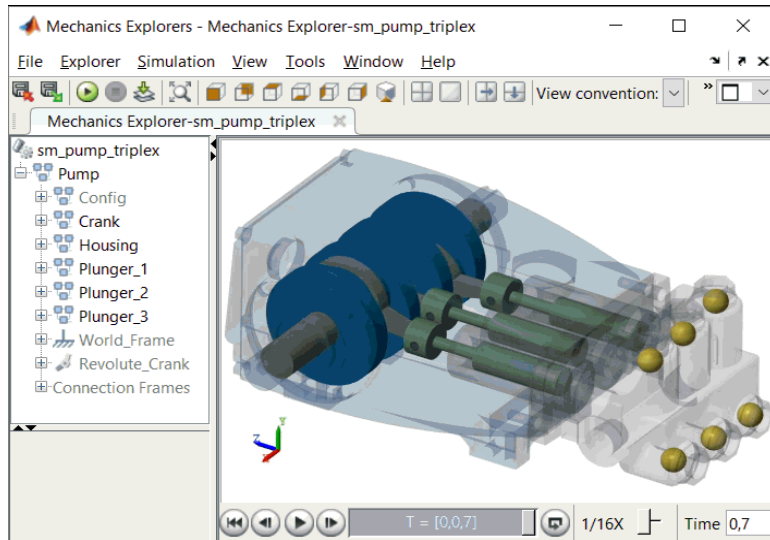
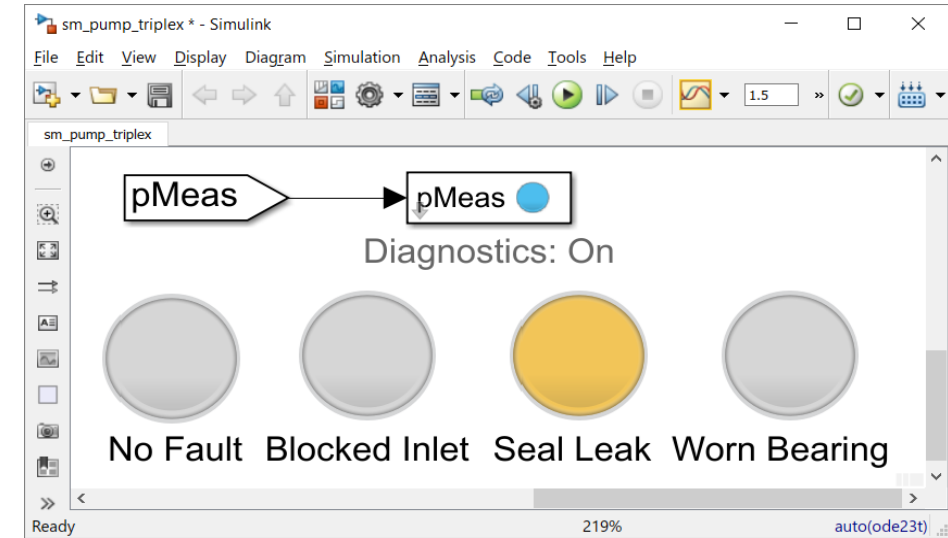
Time 0,010707

Prevent system downtime



by sending
Sensor Data

to a Predictive
Maintenance
algorithm



created using a
Digital Twin and

Machine
Learning model
in MATLAB.

Model 1.18

| | | | | | | | |
|--|------------------------|-----|------|------|-----|------|------|
| | Block P1 | 88% | | 12% | | | |
| | Block P1, Worn Bearing | | 100% | | | | |
| | Leak P1 | | | 100% | | | |
| | Leak P1, Block P1 | 4% | | | 96% | | |
| | Leak P1, Worn Bearing | | | | | 100% | |
| | Nominal | | | | | 100% | |
| | Worn Bearing | | | | | | 100% |

Example Problems with a Triplet Replicating Pump



Triplex Pump

1 *Fault Classification is a time consuming manual process*

Current system requires operator to manually monitor operational metrics for anomalies. Their expertise is required to detect and take preventative action

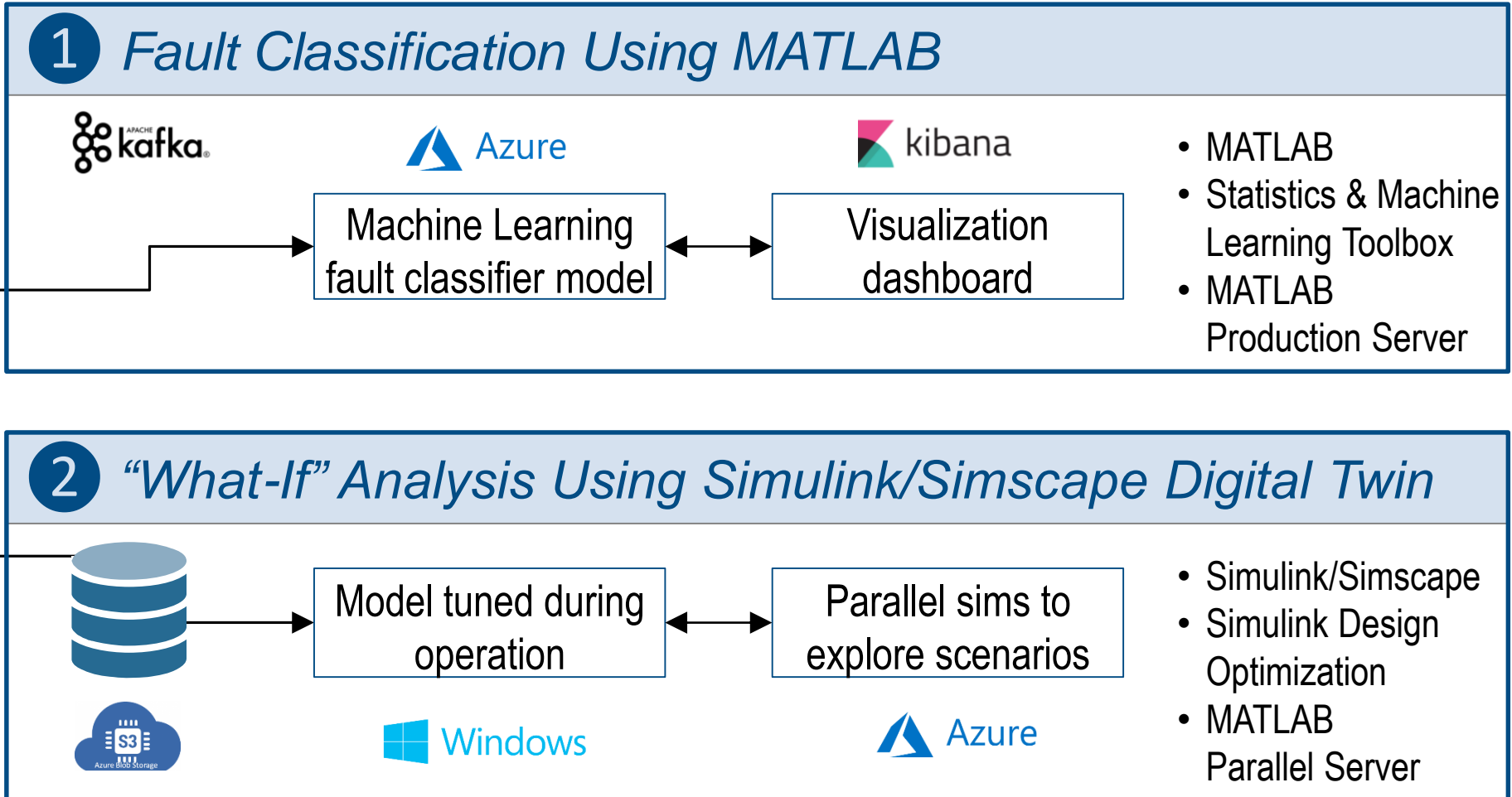
2 *Trouble using data to update digital twin and make use of it*

Current system gathers operational data from the pump, but not expertise on how to leverage data to update the digital twin and apply it to run what-if analysis in a scalable way

Two Demos



Triplex Pump



Demo 1



Triplex Pump

1 *Fault Classification Using MATLAB*



Machine Learning
fault classifier model

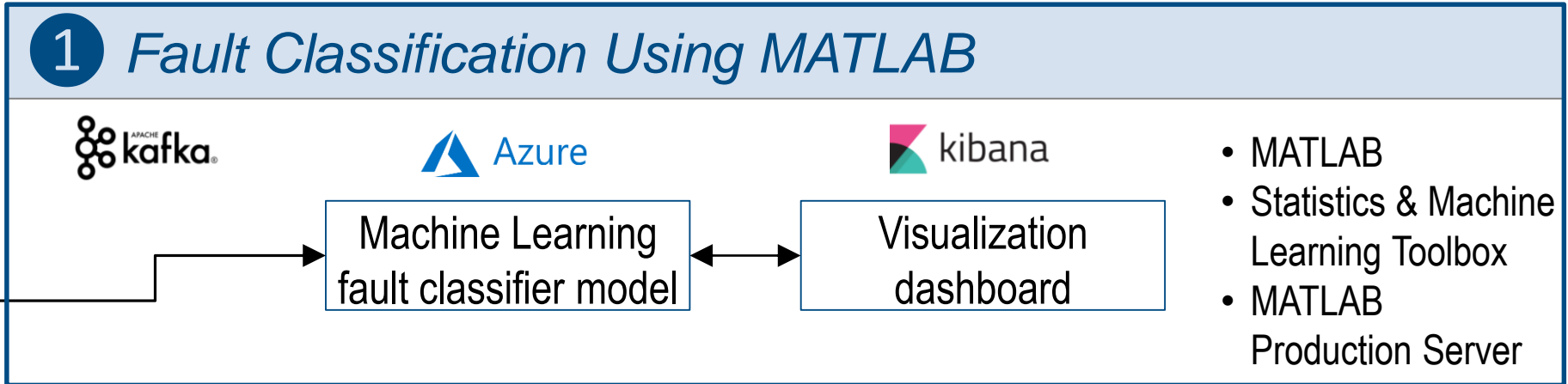
Visualization
dashboard

- MATLAB
- Statistics & Machine Learning Toolbox
- MATLAB Production Server

Fault Classification is a time consuming manual process

Current system requires operator to manually monitor operational metrics for anomalies. Their expertise is required to detect and take preventative action

Demo 1



Triplex Pump

- Data:
 - Processed in chunks or
 - Streaming continuously via Kafka
- A previously designed classifier, processes incoming stream, identifying faults
 - Processing is elastic and can scale to any number of incoming streams/pumps via MATLAB Production Server
- Visualization dashboard (Kibana) shows data stream and deduced fault classification

kafka server kafka topic MATLAB R2018b

HOME | PLOTS | APPS | SHORTCUTS | Search Documentation | Heather

/ local Demos PredictiveMaintenance Repo

| Current Folder | | Git |
|---------------------|--|-----|
| Name | | |
| + mech_hydro... | | |
| + ACI | | |
| + Dashboard | | |
| + Data | | |
| + Documents | | |
| + Elasticsearch | | |
| + fakeResultsToK... | | |
| + MachineLearning | | |
| + MATLAB_Kafka... | | |
| + mps_stream | | |
| + SimExecutable | | |
| + Simulation | | |
| + slprj | | |
| _1\Data\pdmR... | | |
| _2\Data\pdmR... | | |
| _3\Data\pdmR... | | |
| _4\Data\pdmR... | | |
| DigitalTwinApp... | | ● |
| DocExample_... | | ● |
| fakeResultsToK... | | ● |
| fakeResultsToK... | | ● |
| FakeStreamin... | | ● |

Command Window
 fx >> |

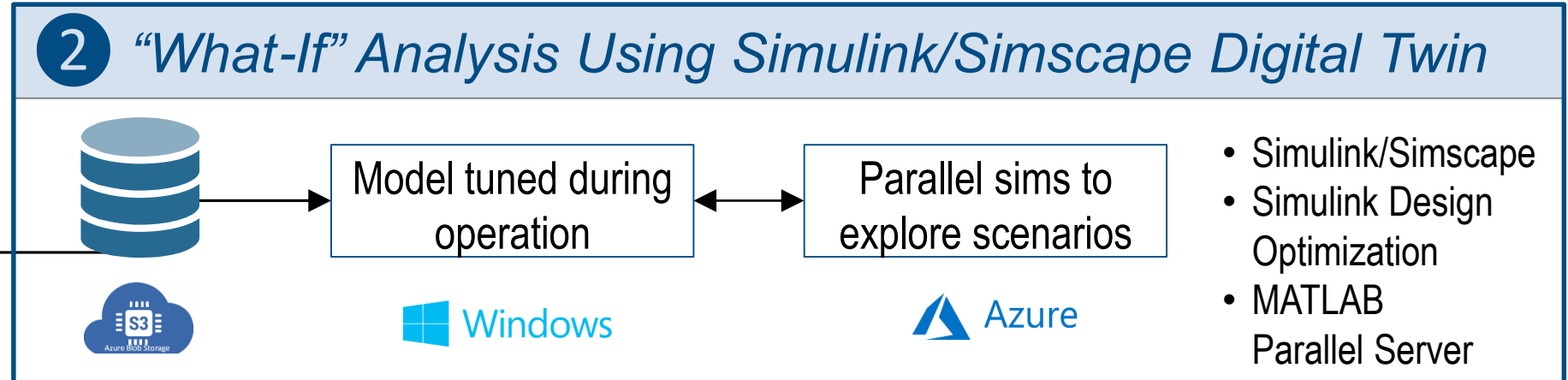
writeToEnsemble.m (Fu...

Workspace | Command History

Demo 2



Triplex Pump



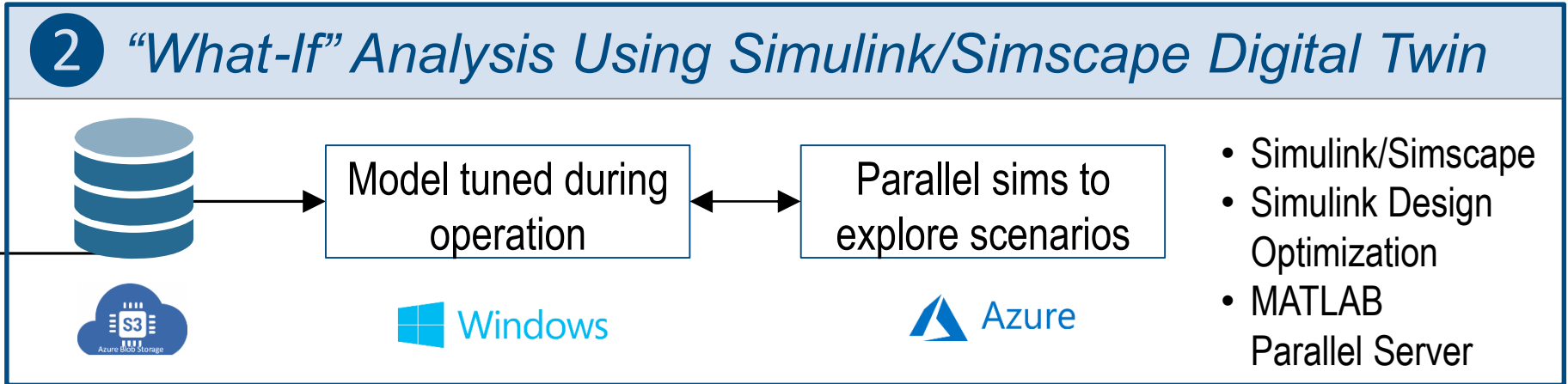
Trouble using data to update digital twin and make use of it

Current system gathers operational data from the pump, but not expertise on how to leverage data to update the digital twin and apply it to run what-if analysis in a scalable way

Demo 2

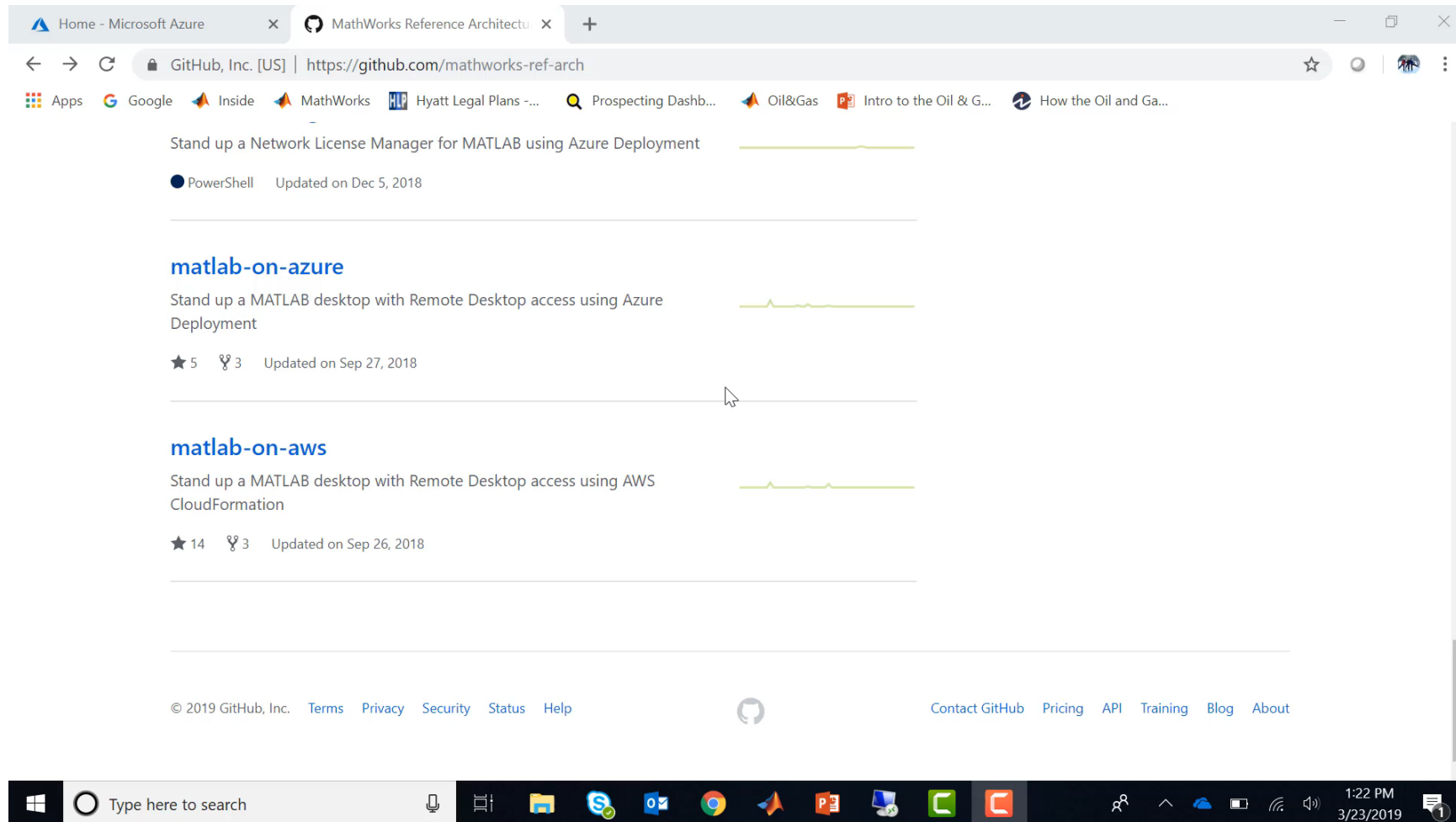


Triplex Pump



- Data streaming from asset, saved and selected for tuning using cloud storage connectivity
- Tune Digital Twin Parameters from latest available data from real asset using Simulink Design Optimization
- Run 100s “what-if” Scenarios with Parallel Server reference architecture on Azure
- Process output for possible operational decision

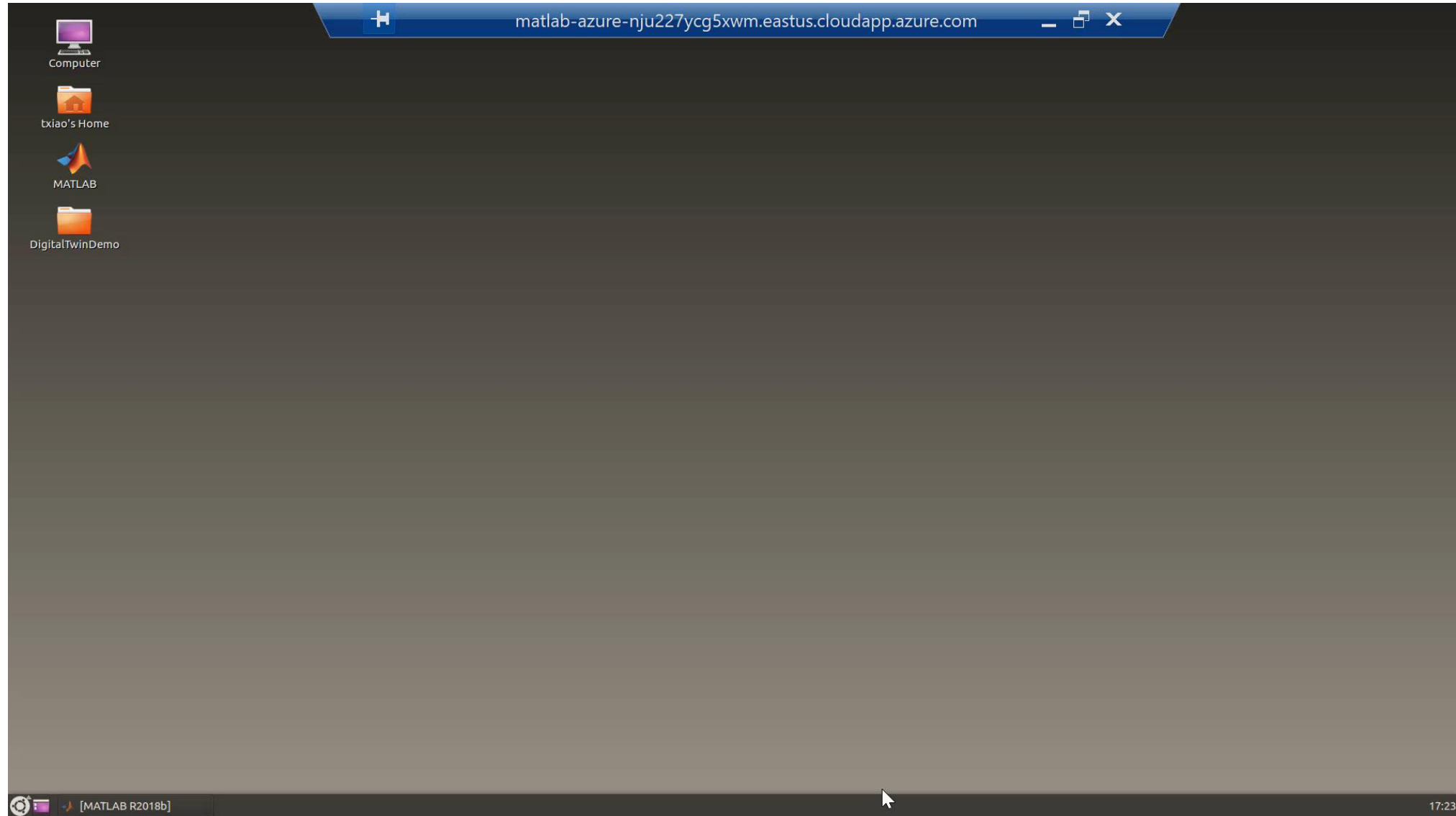
Demo 2 part I: Setting up MATLAB Reference Architect on Azure



The screenshot shows a web browser window with the following content:

- Browser Tabs:** Home - Microsoft Azure, MathWorks Reference Architectu...
- Address Bar:** GitHub, Inc. [US] | https://github.com/mathworks-ref-arch
- Search Results:**
 - matlab-on-azure:** Stand up a Network License Manager for MATLAB using Azure Deployment. PowerShell. Updated on Dec 5, 2018.
 - matlab-on-azure:** Stand up a MATLAB desktop with Remote Desktop access using Azure Deployment. 5 stars, 3 forks. Updated on Sep 27, 2018.
 - matlab-on-aws:** Stand up a MATLAB desktop with Remote Desktop access using AWS CloudFormation. 14 stars, 3 forks. Updated on Sep 26, 2018.
- Footer:** © 2019 GitHub, Inc. Terms Privacy Security Status Help. Contact GitHub Pricing API Training Blog About.

Demo 2 Part II: Updating Digital Twin with Parameter Estimation



Demo 2 Part III: Run What-if Analysis From Current State

The screenshot displays the MATLAB R2018b environment. The top toolbar includes options for HOME, PLOTS, APPS, EDITOR, PUBLISH, and VIEW. The main workspace is divided into several panes:

- Current Folder:** Shows the file structure of the project, including folders like CAD, Fault_Detect, and files like main.m.
- Editor - main.m:** Contains the following code:


```

1 %% Set Up
2 startup_sm_pump_triplex
3
4 %% SDO
5 sm_pump_triplex_paramest_compare
6
7 %% Parsim
8 parsim_sm_pump_triplex|
9
10
      
```
- Workspace:** Lists various variables and their values, such as bearing_fault_f..., block_in_facto..., and simlog_pO_init.
- Command Window:** Shows the execution of the command `>> bdclose all` and the resulting message:


```

>> bdclose all
Simscape Multibody Multiphysics Library v2.7
Copyright 2013-2018 The MathWorks, Inc.
/home/txiao/Desktop/DigitalTwinDemo/Libraries/MPL_Libs/Libraries/Multibody_Multiphysics_Lib.slx % block diagram
fc >>
      
```
- Output Pressure Plot:** A small plot in the bottom left shows a signal fluctuating between 7.05 and 7.3 over time.

Two of Many Options



Triplex Pump

- In addition to the approaches shown in these two demos, there are other ways to use MATLAB and Simulink to operationalize your applications
- These include running MATLAB and Simulink directly on the platform, deploying compiled applications, running generated code, and more
- We can work with you to define the right approach, based on your application requirements

In Conclusion

- You can use MATLAB and Simulink for IIoT and Digital Twin applications, leveraging their strong Modelling, system simulation, and data analytics capabilities
- MathWorks can help you get your project started with applications such as predictive maintenance, operations optimization, and fleet management

Call to Action:

Talk to us about your IIoT and Digital Twin applications today

IIoT and Digital Twin Relevant Solution Pages

- [A view on the breath of MathWorks IIoT integration options](#)
- [MathWorks support on-prem and public cloud operations](#)
- [Physical Modelling](#)
- [Predictive Maintenance](#)
- [Data Science with MATLAB](#)
- [MathWorks products access for startups](#)
- [Service offering with consulting](#)
- [Third Party Connections](#)