



Digital twins in the water sector

Rand Water Chair in Mechanical Engineering at Stellenbosch University

Annie Bekker

Department of Mechanical and Mechatronic Engineering, Stellenbosch University, South Africa



Outline

DIGITAL TWINS IN THE WATER SECTOR

- **Introduction**
- What is a **digital twin**?
- A **generic patterns** in digital twin services / intended use.
- **Examples** of digital twins in the water sector.

Outline

DIGITAL TWINS IN THE WATER SECTOR

- **Introduction**

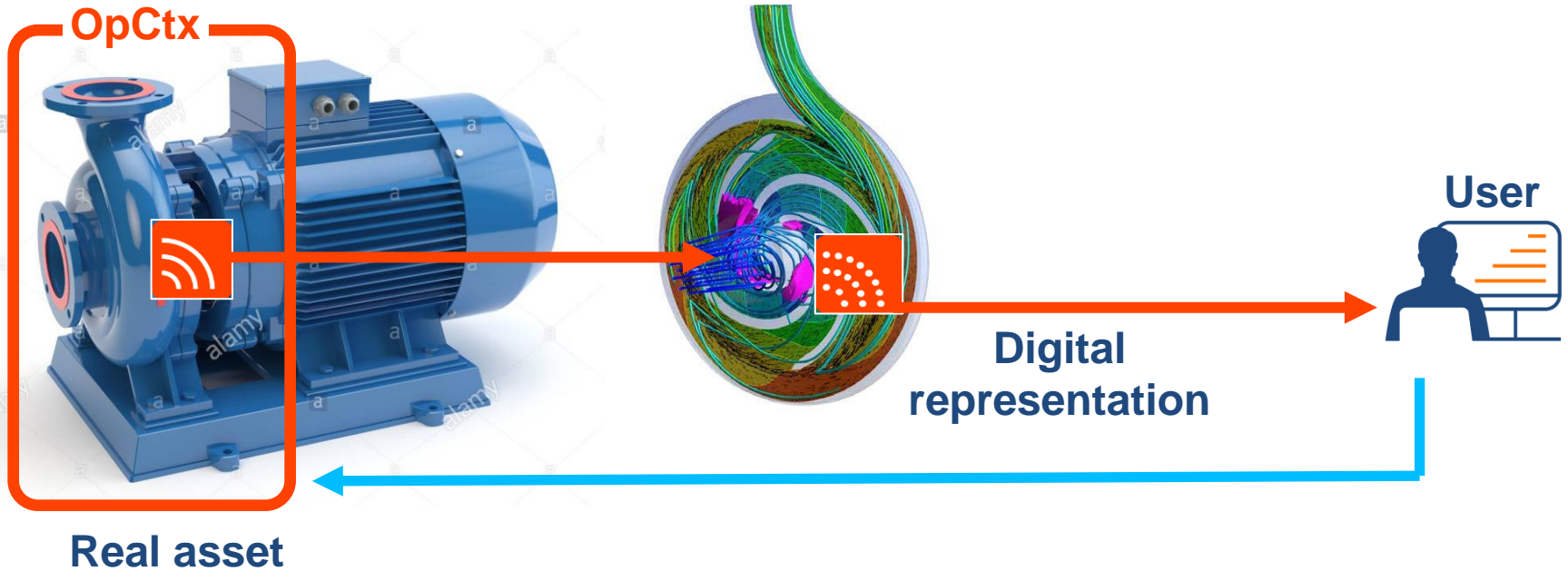
- What is a **digital twin**?

- A **generic patterns** in digital twin services / intended use.

- **Examples** of digital twins in the water sector.

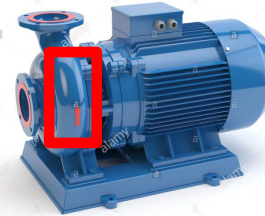
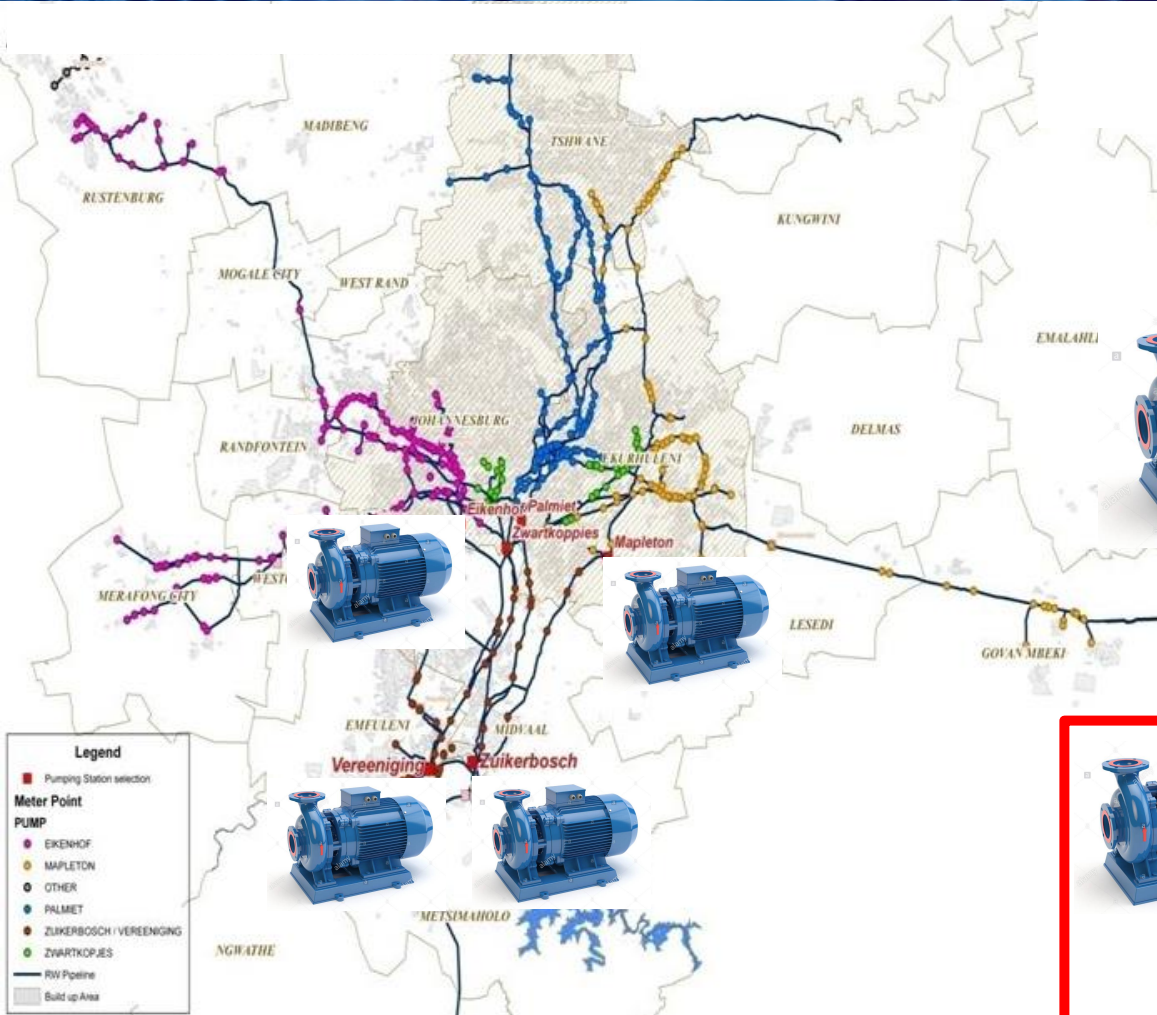
What is a digital twin

A DIGITAL REPRESENTATION OF THE STATE AND BEHAVIOR OF A REAL ASSET WITHIN ITS OPERATIONAL CONTEXT TOWARDS DECISION SUPPORT



Digital twin : real asset

A DIGITAL REPRESENTATION OF THE STATE AND BEHAVIOR OF A **REAL ASSET** WITHIN ITS OPERATIONAL CONTEXT TOWARDS DECISION SUPPORT



Component -
impeller



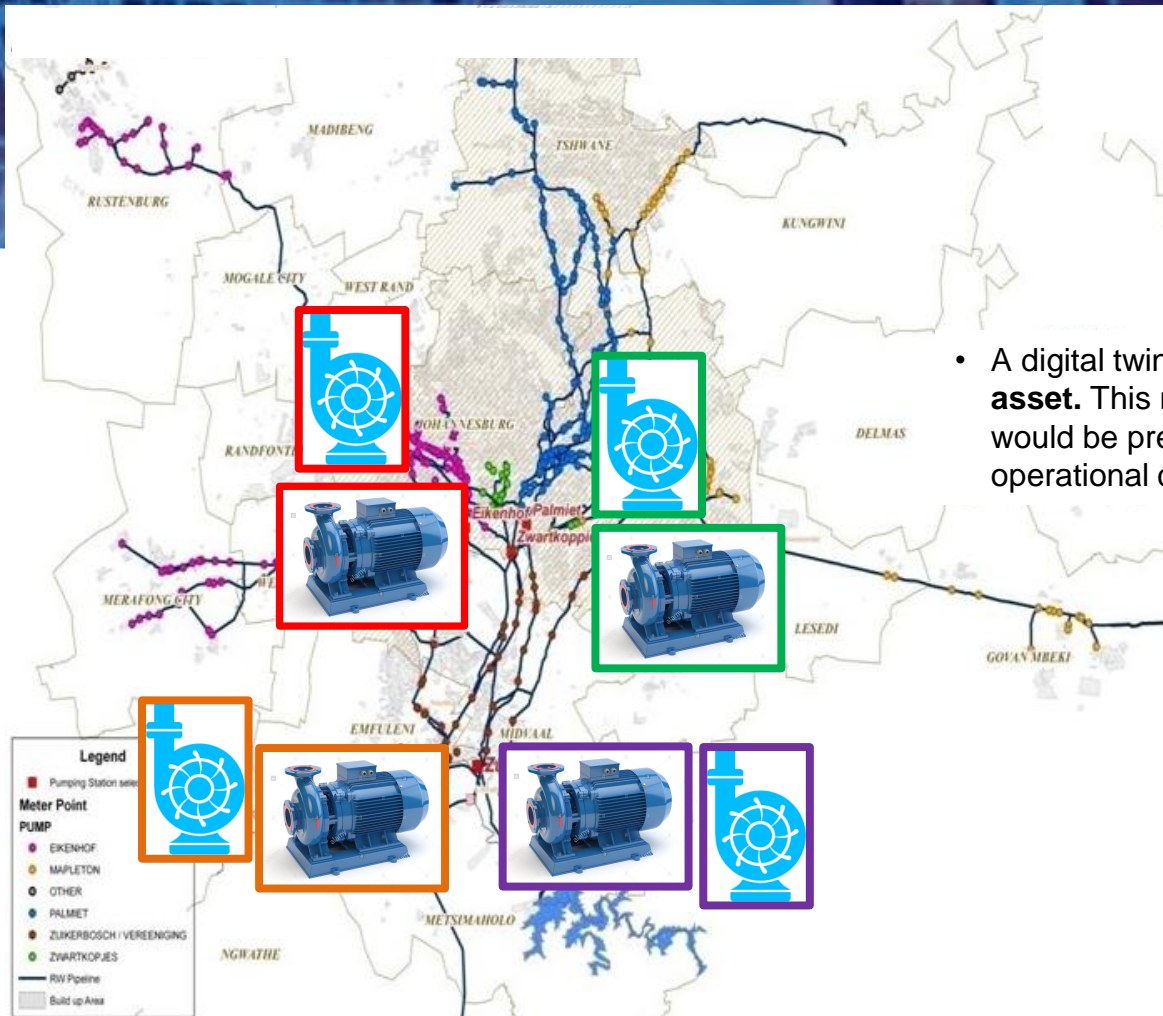
System - pump



System of
systems
(Pump station
with multiple
pumps)

Digital twin : digital representation

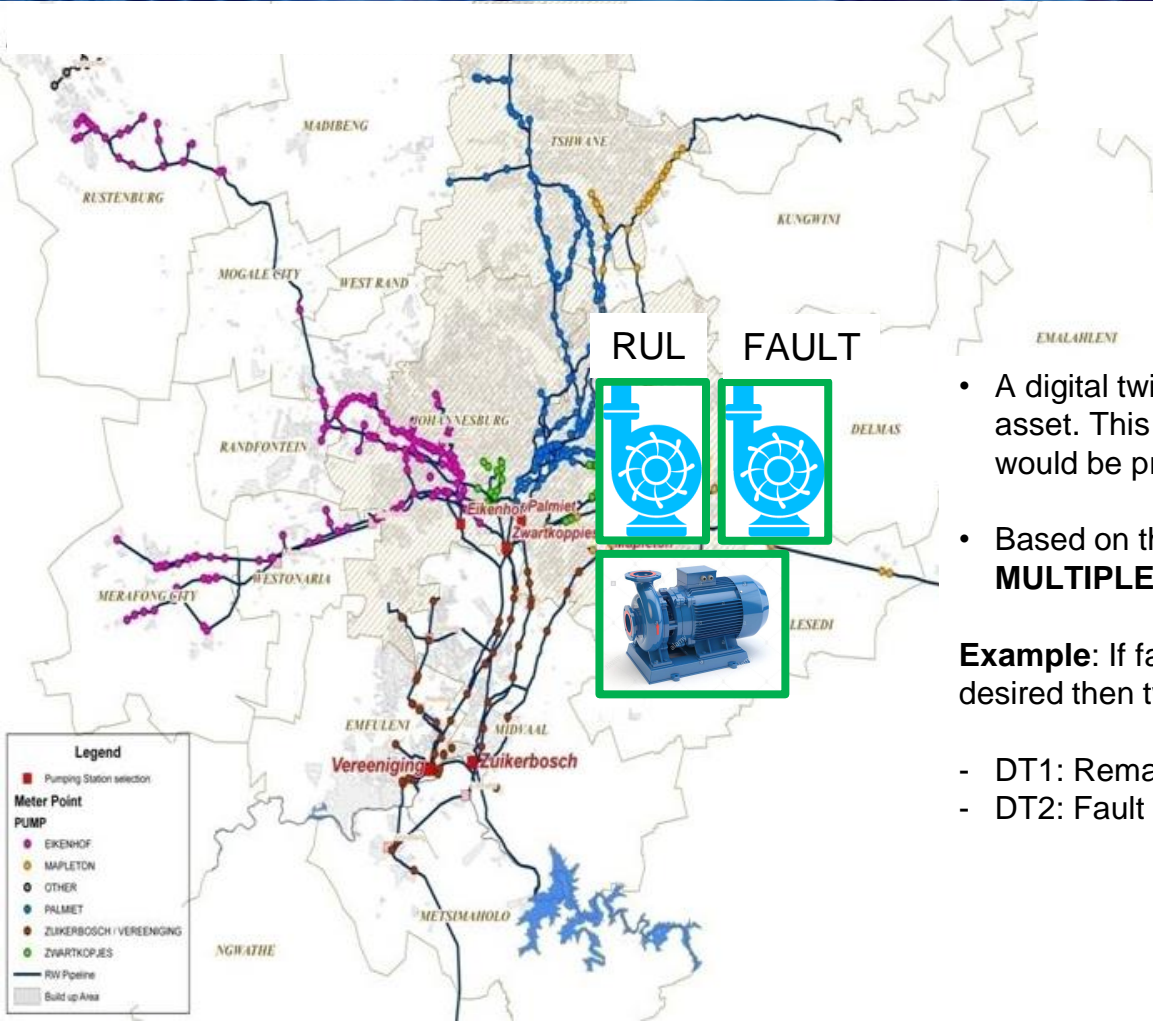
A **DIGITAL REPRESENTATION** OF THE STATE AND BEHAVIOR OF A REAL ASSET WITHIN ITS OPERATIONAL CONTEXT TOWARDS DECISION SUPPORT



- A digital twin is a **one-to-one coupling with a real asset**. This means that every pump in a network would be presented by its own DT subject to its own operational conditions, state and behavior.

Digital twin – digital representation

A **DIGITAL REPRESENTATION** OF THE STATE AND BEHAVIOR OF A REAL ASSET WITHIN ITS OPERATIONAL CONTEXT TOWARDS DECISION SUPPORT



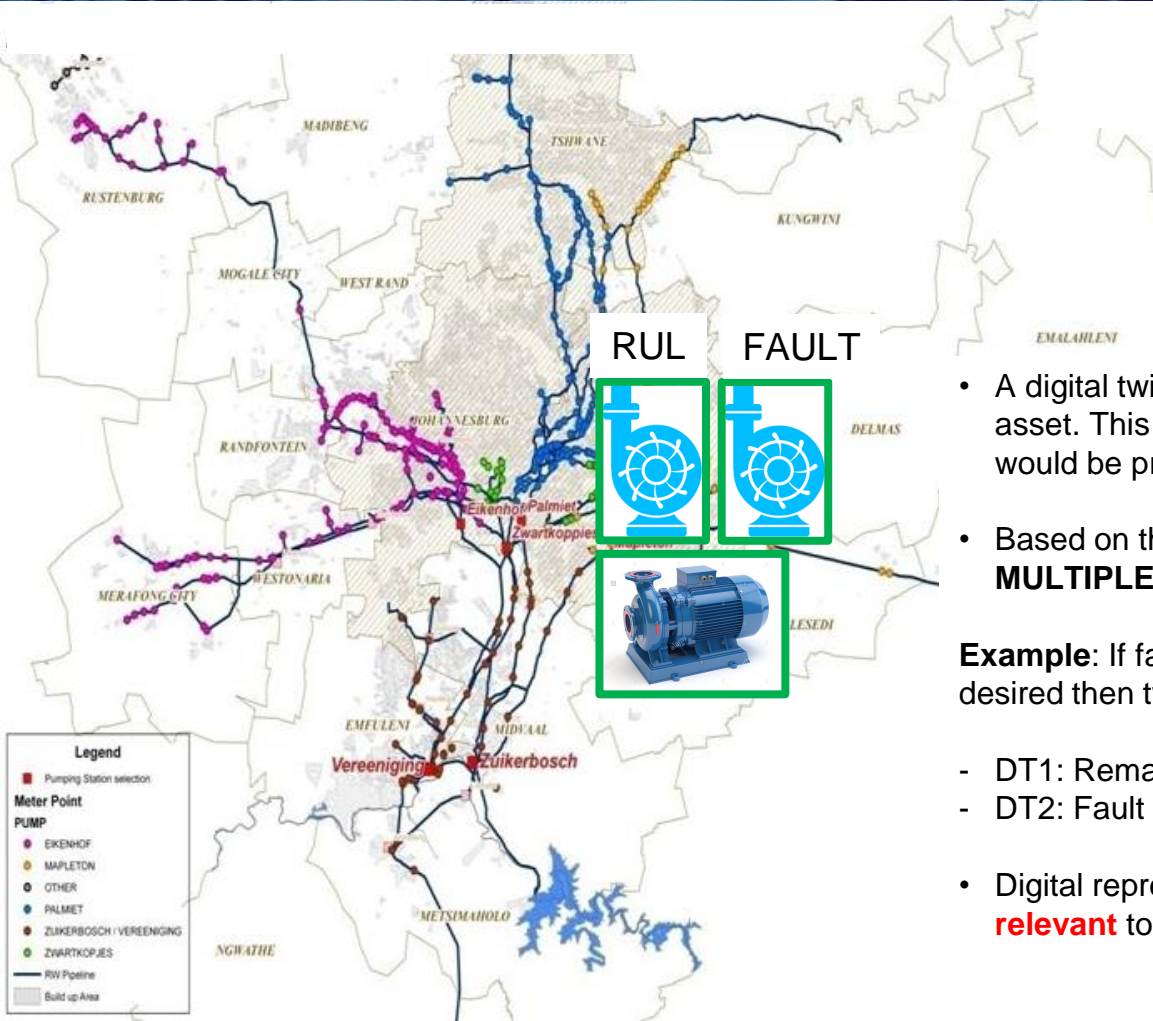
- A digital twin is a one-to-one coupling with a real asset. This means that every pump in a network would be presented by its own DT.
- Based on the intended use a pump may have **MULTIPLE DIGITAL TWINS**.

Example: If failure prediction and fault classification are desired then two different DT models must be created.

- DT1: Remaining useful life
- DT2: Fault classification

Digital twin – digital representation

A **DIGITAL REPRESENTATION** OF THE STATE AND BEHAVIOR OF A DIGITAL ASSET WITHIN ITS OPERATIONAL CONTEXT TOWARDS DECISION SUPPORT



- A digital twin is a one-to-one coupling with a real asset. This means that every pump in a network would be presented by its own DT.
- Based on the **intended use** a pump may have **MULTIPLE DIGITAL TWINS**.

Example: If failure prediction and fault classification are desired then two different DT models must be created.

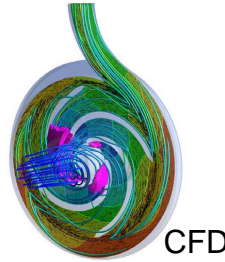
- DT1: Remaining useful life
- DT2: Fault classification
- Digital representation includes **the states which are relevant** to the intended use of the DT.

Digital twin – digital representation

A **DIGITAL REPRESENTATION** OF THE STATE AND BEHAVIOR OF A DIGITAL ASSET WITHIN ITS OPERATIONAL CONTEXT TOWARDS DECISION SUPPORT



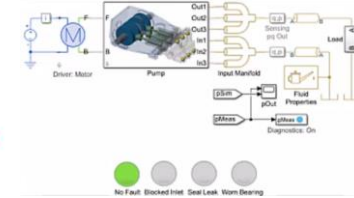
Physics-based



CFD



FEM



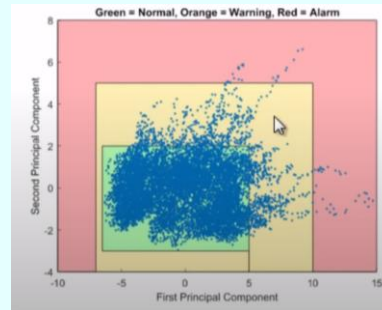
SYSTEM & COMPONENTS

$$P = \frac{Q\rho gh}{\eta_t}$$

EQUATION

Kalman filter (Best linear combination of data and physics)

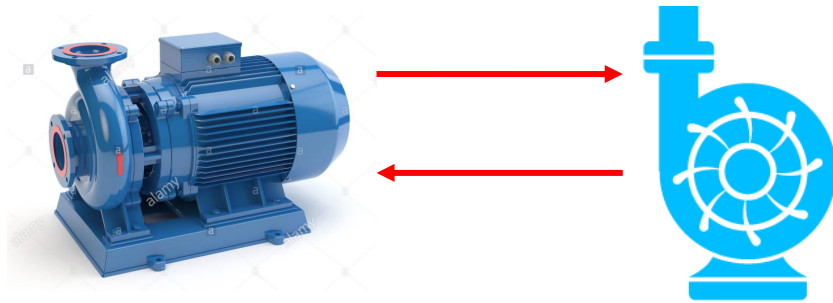
Data-driven



- Curve-fit
- Multi-variable regression
- Machine learning

Digital twin – entanglement

A DIGITAL TWIN requires **entanglement / connection** between the real asset and



Entanglement – There must be a link (direct or indirect) between the Real asset and digital representation to enable an update to the digital reflection of the state / behavior of the real asset. (Governed by connectivity, promptness and association)

Weak entanglement

- Information inferred by indirect observations

Simple entanglement

- Link can be interrupted
- Unidirectional communication
- Not necessarily real-time

Strong entanglement

- Constant link
- Direct, bidirectional communication
- Digital twin can be controlling instance

INCREASED SOPHISTICATION & COST



Outline

DIGITAL TWINS IN THE WATER SECTOR

- **Introduction**
- What is a **digital twin**?
- A **generic patterns** in digital twin services / intended use.
- **Examples** of digital twins in the water sector.

Digital twin – service scoping map

A DIGITAL TWIN requires **entanglement / connection** between the real asset and



DECISION LEVEL

- What is the time horizon which the DT service should impact?
 - Long term (Strategic)
 - Medium term (Tactical)
 - Short term (Operational)

TEMPORAL SCALE

- Should the DT model provide insight, hindsight or foresight
- The temporal aspect drives the direction of investment
 - Hindsight: Invest in Analysis
 - Insight: Invest in sensing
 - Foresight: Invest in predictive modelling

Digital twin – service patterns

A DIGITAL TWIN requires **entanglement / connection** between the real asset and

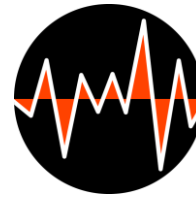
Virtual sensor



Root cause



Remaining useful life



Scout / "What if"



Anomaly



Fingerprint



Mirror

Outline

DIGITAL TWINS IN THE WATER SECTOR

- **Introduction**
- What is a **digital twin**?
- A **generic patterns** in digital twin services / intended use.
- **Examples** of digital twins in the water sector.

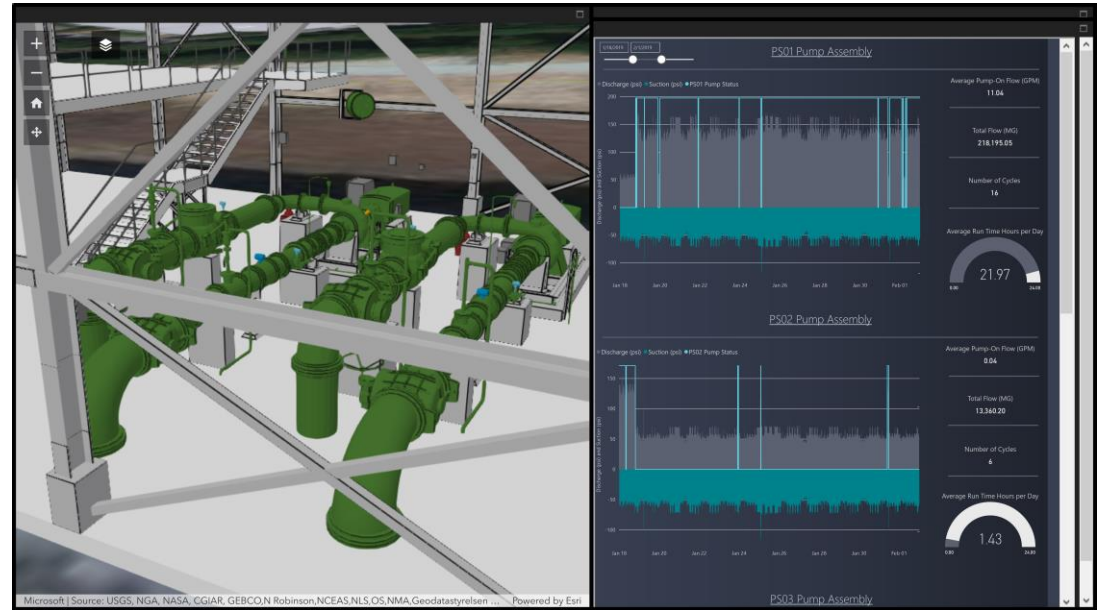


Mirror

Dynamic (real-time) display of the performance of KCI Wastewater Pumping Station assets

3D model of “as is” state of Pump Station

- System information from LiDAR scans, drone imagery and traditional surveys.
- Asset information from mechanical, electrical and wastewater assets information through surveying Gwinnett’s station.
- Assets IDs and data such as make, model and serial number.
- Pressure, flow, temperature, vibration, and volume sensor outputs from their equipment

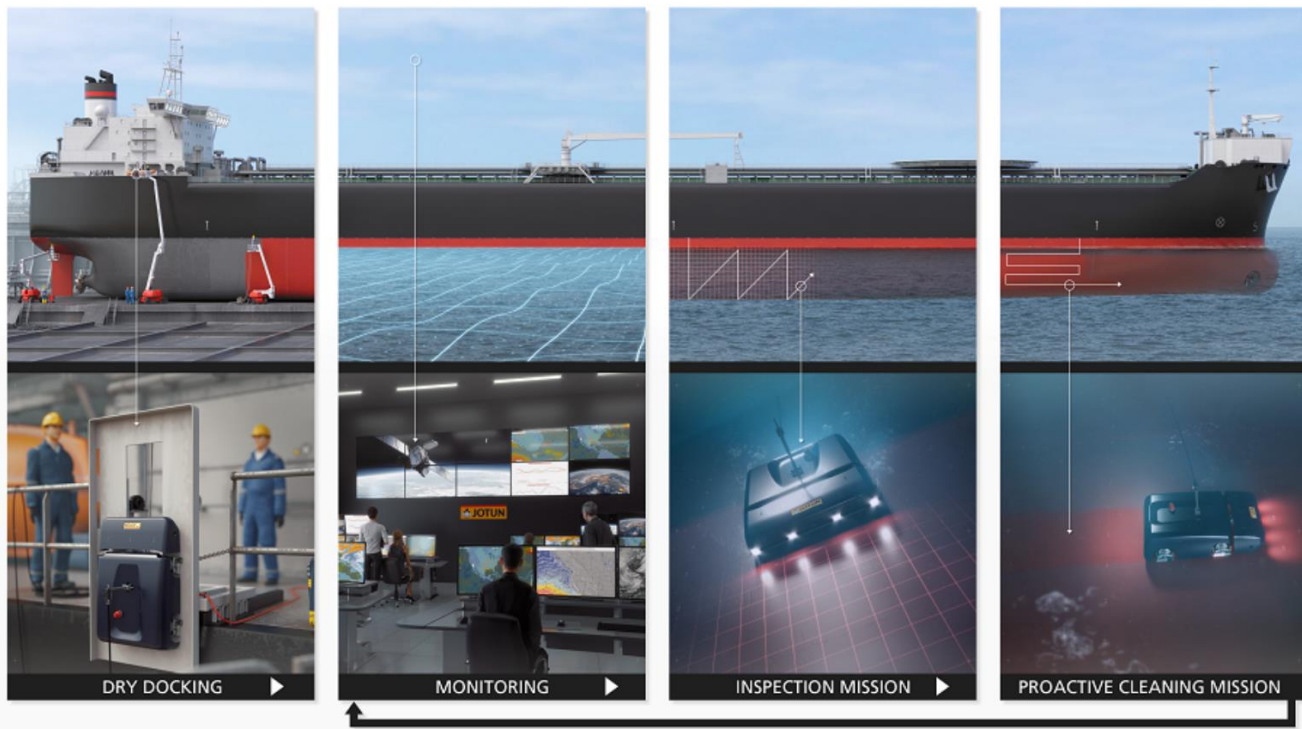




Underwater robotics for active anti-fouling operations

Mirror

Digital model is used to reflect the current state of an asset to visualize a remote operation / hazardous operation.



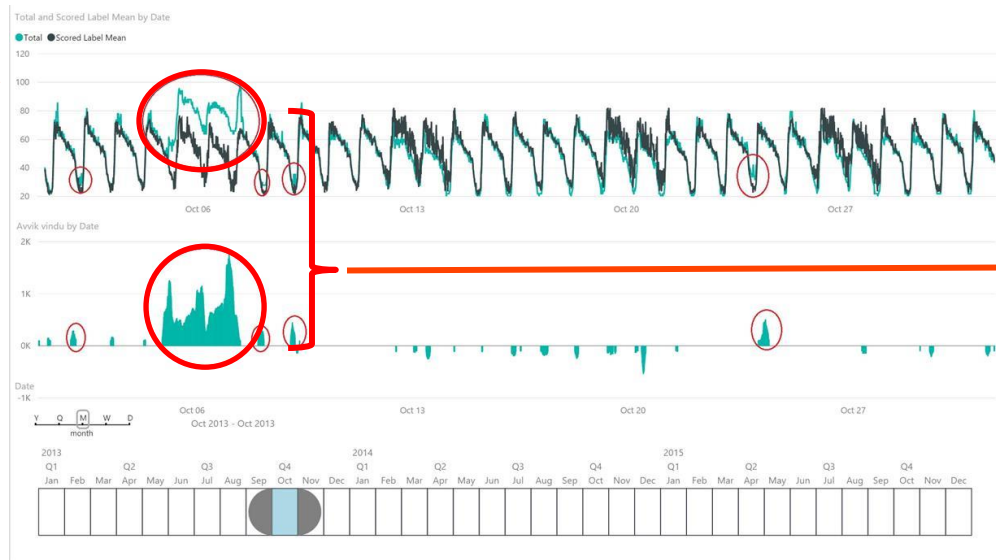
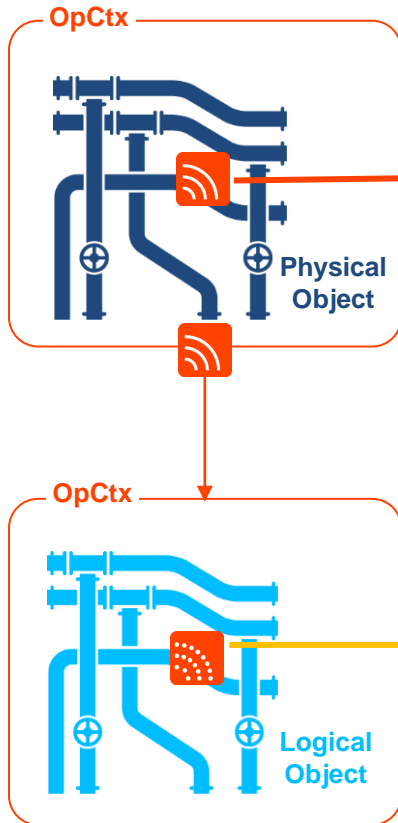


Leak detection

Anomaly

DT is used to benchmark expected state

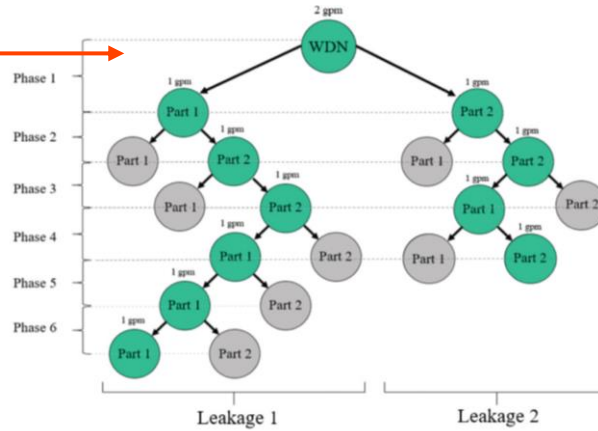
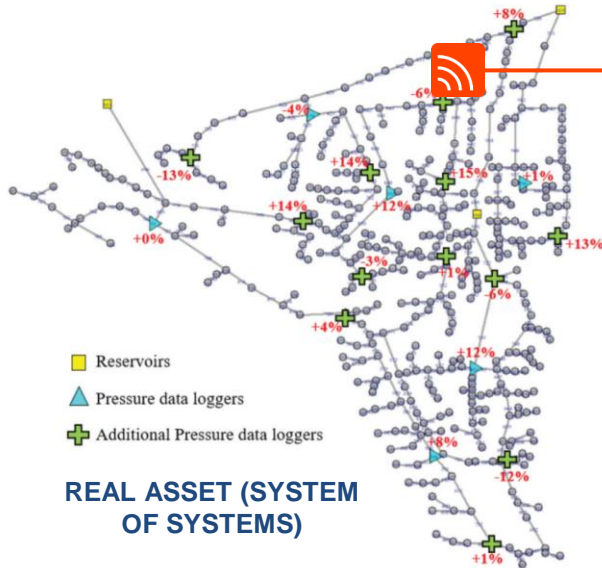
- Compared to measured state
 - Deviations indicate an anomaly which is communicated to the user



Root
cause



Leak detection & Localisation: Balerna water distribution network



**DIGITAL
REPRESENTATION**
Data-driven machine
learning model (ANN)

LEAK AREA 1
LEAK AREA 2
LEAK AREA 3



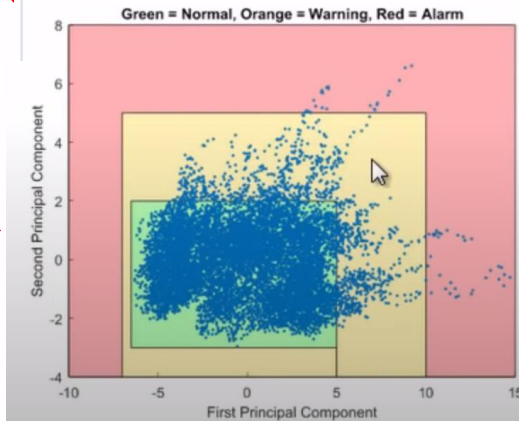
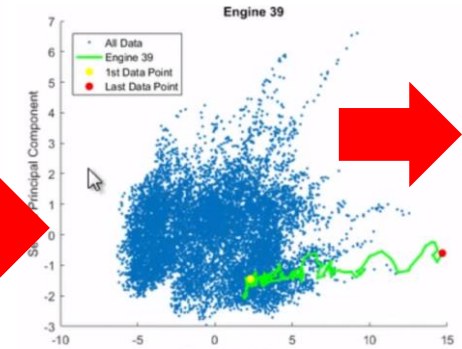
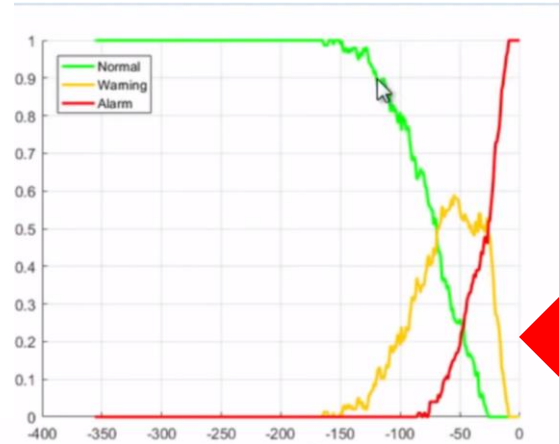
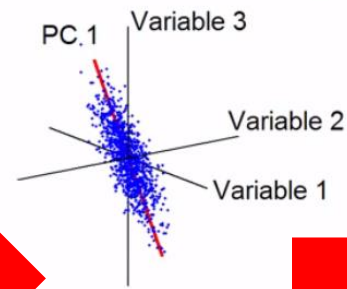
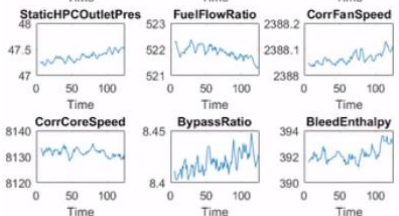
Remaining useful life



Digital twins for prognostics

Scenario 1: NO data from failures

Can we be smarter about scheduling maintenance intervals without knowing what failure looks like?



Machine Learning

Supervised Learning

Develop predictive model based on both input and output data

Unsupervised Learning

Data from multiple sensors

PC analysis

Identify trends of degraded performance

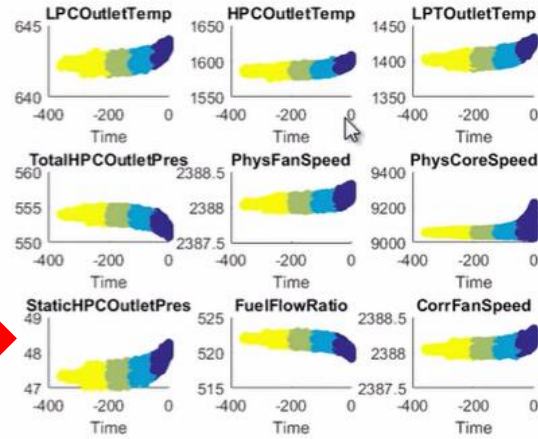
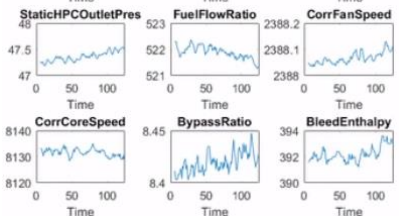
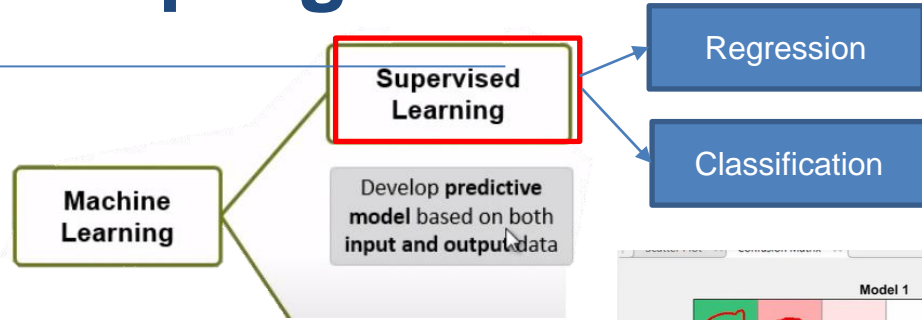
Create clustering

Remaining useful life



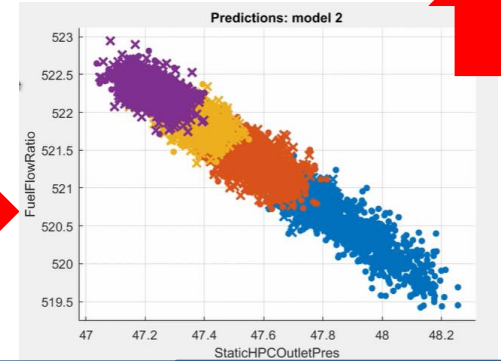
Digital twins for prognostics

Scenario 2: HAVE data from failures
Can we predict how long until failures occur?



Model 1

True class \ Predicted class	urgent	short	medium	long	True Positive Rate	False Negative Rate
urgent	75%	24%	1%		75%	25%
short	3%	82%	15%		82%	18%
medium		45%	54%	1%	54%	46%
long		41%	56%	3%	3%	97%



Virtual flow metering

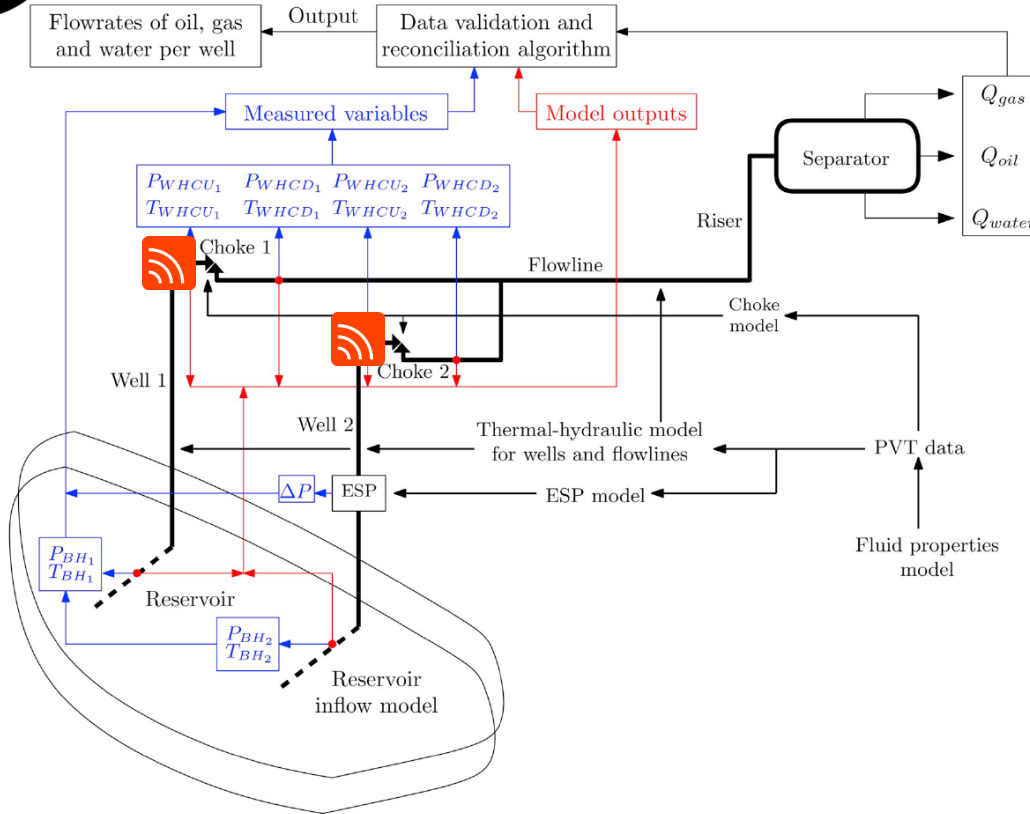


FLOW METERS

- Expensive ~R30k to R600k per meter for large diameter pipes.

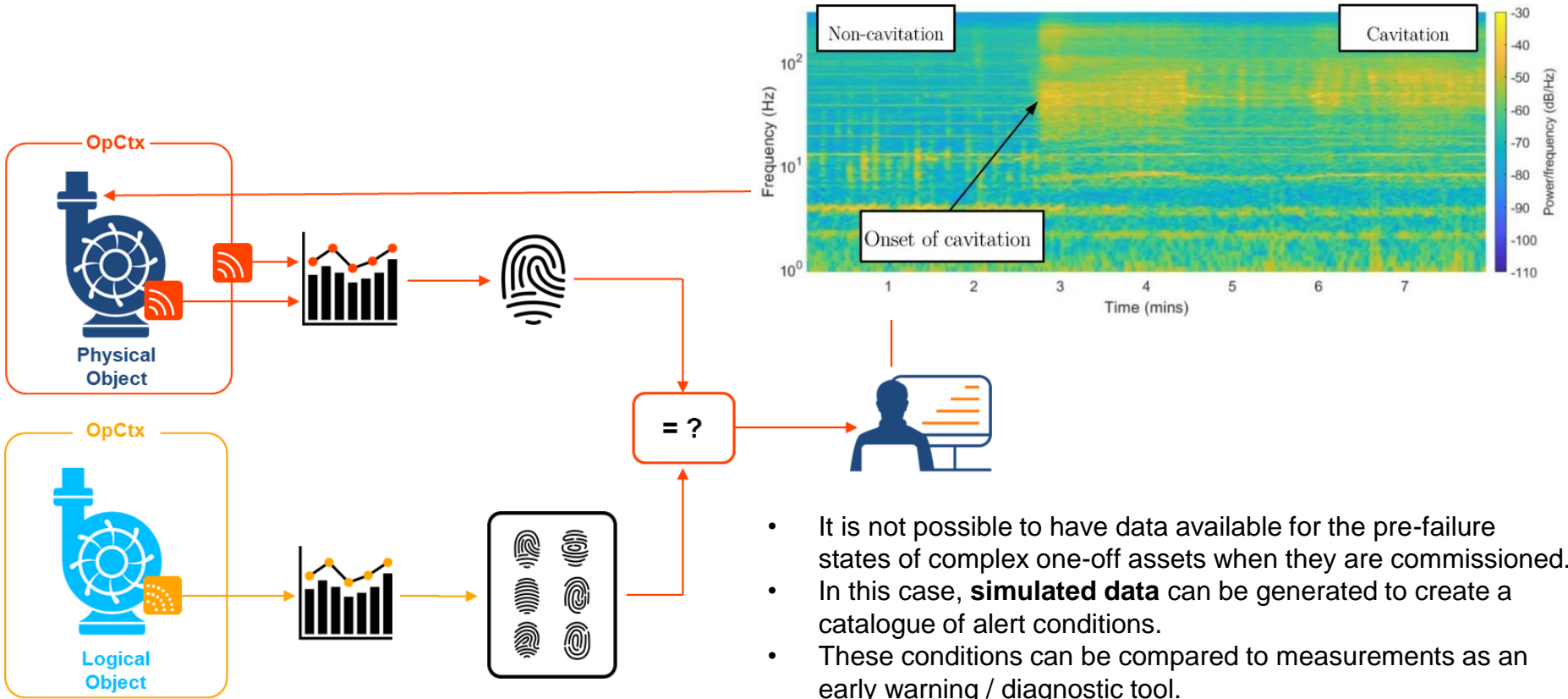
DT can act as a virtual sensor

- Example from oil industry
- Real subsea oil and gas production systems are equipped with more cost effective sensors and use digital models to infer flowrate of production from wells.
- Can offset cost, obtain information in hazardous or inaccessible environments, can use model to determine critical measurement.





A fingerprint DT to create a catalogue of states

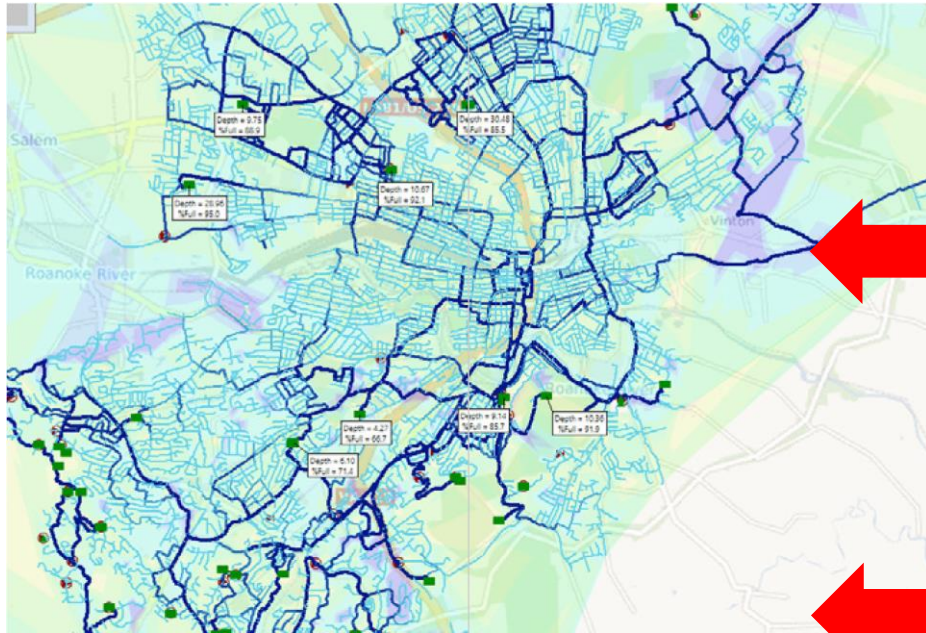


- It is not possible to have data available for the pre-failure states of complex one-off assets when they are commissioned.
- In this case, **simulated data** can be generated to create a catalogue of alert conditions.
- These conditions can be compared to measurements as an early warning / diagnostic tool.



System of system distribution network models

Hydraulic models, some extremely detailed and sophisticated, support planning decisions, problem solving, what-if analysis, forecasting and even regulatory reporting



Scenario 1: Population growth



Scenario 2: Flash flood



Newcastle University &
Northumbrian Water Group
DT of Newcastle - a digital
city.

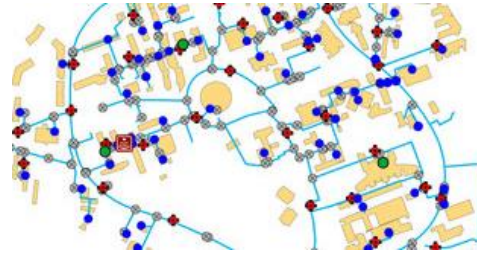


System of system distribution network models

Hydraulic models, some extremely detailed and sophisticated, support planning decisions, problem solving, what-if analysis, forecasting and even regulatory reporting



Scenario 1: Water supply + cost



Scenario 2: Water supply + cost



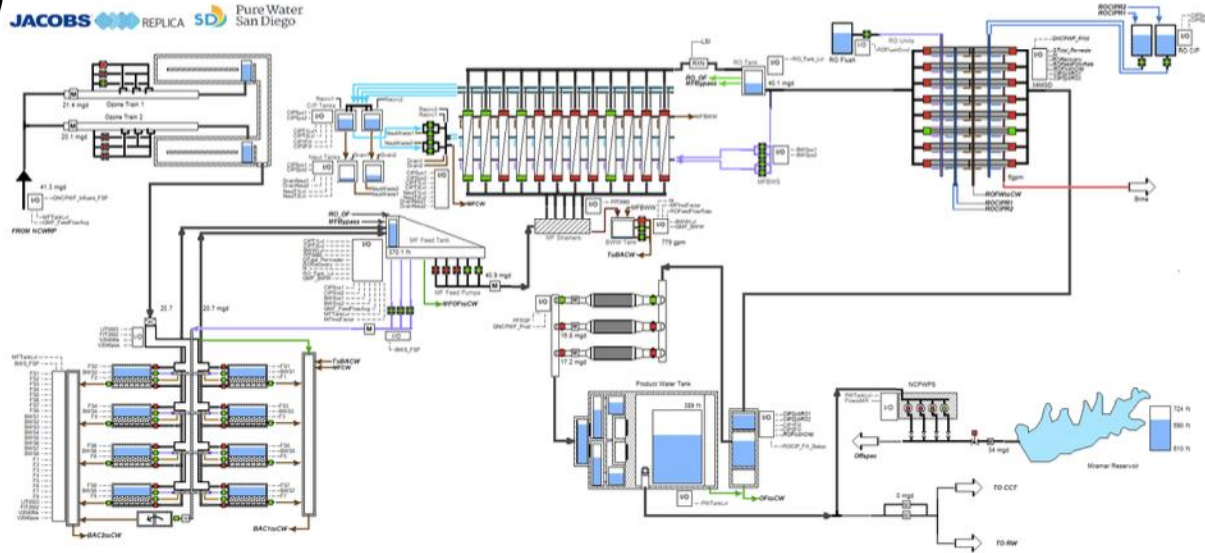
Companhia Águas de Joinville

- DTR for hydraulic simulations of WDN
- Scenarios using the master water plan as a future reference.
- OpenFlows WaterGEMS for the hydraulic simulations and attribute data from ArcGIS
- The project resulted in a consistent water supply at a low implementation cost of BRL 250,000.

San Diego Pure Water Facility



DT used during design – even before commissioning



Used to:

- Improve commissioning and long-term operations as an operator training platform
- Reduce potential future operational challenges
- Verify control points to sync process units
- Mimic control schemes
- Predictive process modelling

- Scheme to supply 1/3 of San Diego’s water locally by 2035
- Includes multiple facilities
- Digital twin of advanced water purification facility

Conclusion



- Digital twins are transpiring everywhere in the water sector. Opportunities seem boundless.
- **DTs offer strategic, tactical and operational benefits.**
- Massive trend towards **system of system DT integration of water assets into smart cities.**
- **DT technology using artificial intelligence is revolutionizing asset management.** Inferring patterns from data clusters.

Questions?



Prof Annie Bekker | BEng, MScEng, PhD

Professor

Director of the Sound and Vibration Research Group | Direkteur van die Klank en Vibrasie Navorsingsgroep

Department Mechanical and Mechatronic Engineering | Departement Meganiese en Megatroniese Ingenieurswese

e: annieb@sun.ac.za | t: +27 21 808 3914 | a: M&M Engineering Building, Banhoek Road, Stellenbosch 7600



www.eng.sun.ac.za

<https://svrg.sun.ac.za/>

