



Digital twins as enabler for data-driven process improvements in the industrial manufacturing of food and feed

Ali Baajour, Data Scientist

30.03.2022

Climate change widespread, rapid, and intensifying.

The Intergovernmental Panel on Climate Change (IPCC) released the first of three installments of the Sixth Assessment Report (AR6).

CO₂
concentration



Highest
in at least
2 million years

Sea level
rise



Fastest rates
in at least
3000 years

Arctic sea ice
areas



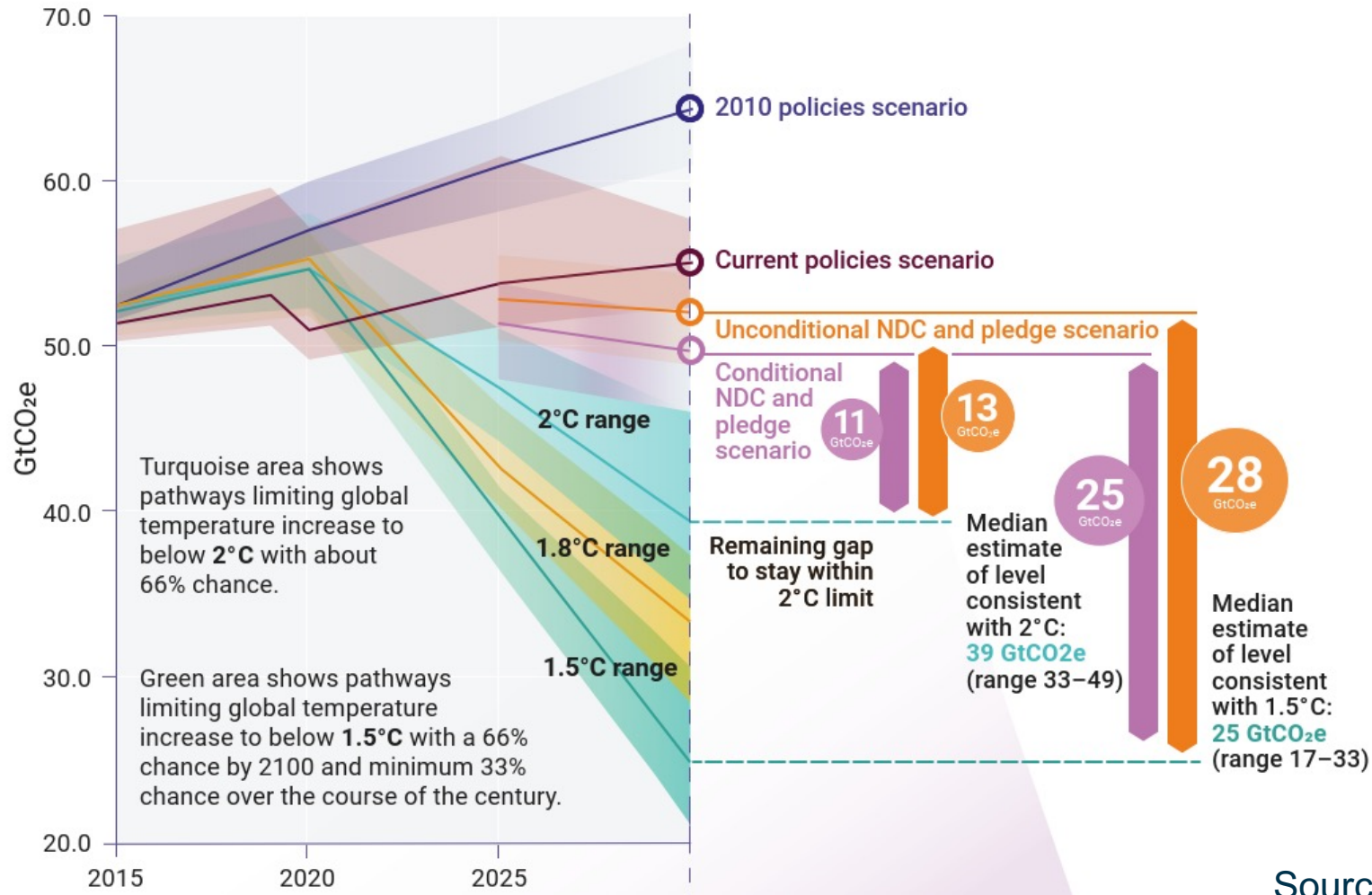
Lowest level
in at least
1000 years

Glaciers
retreat



Unprecedented
in at least
2000 years

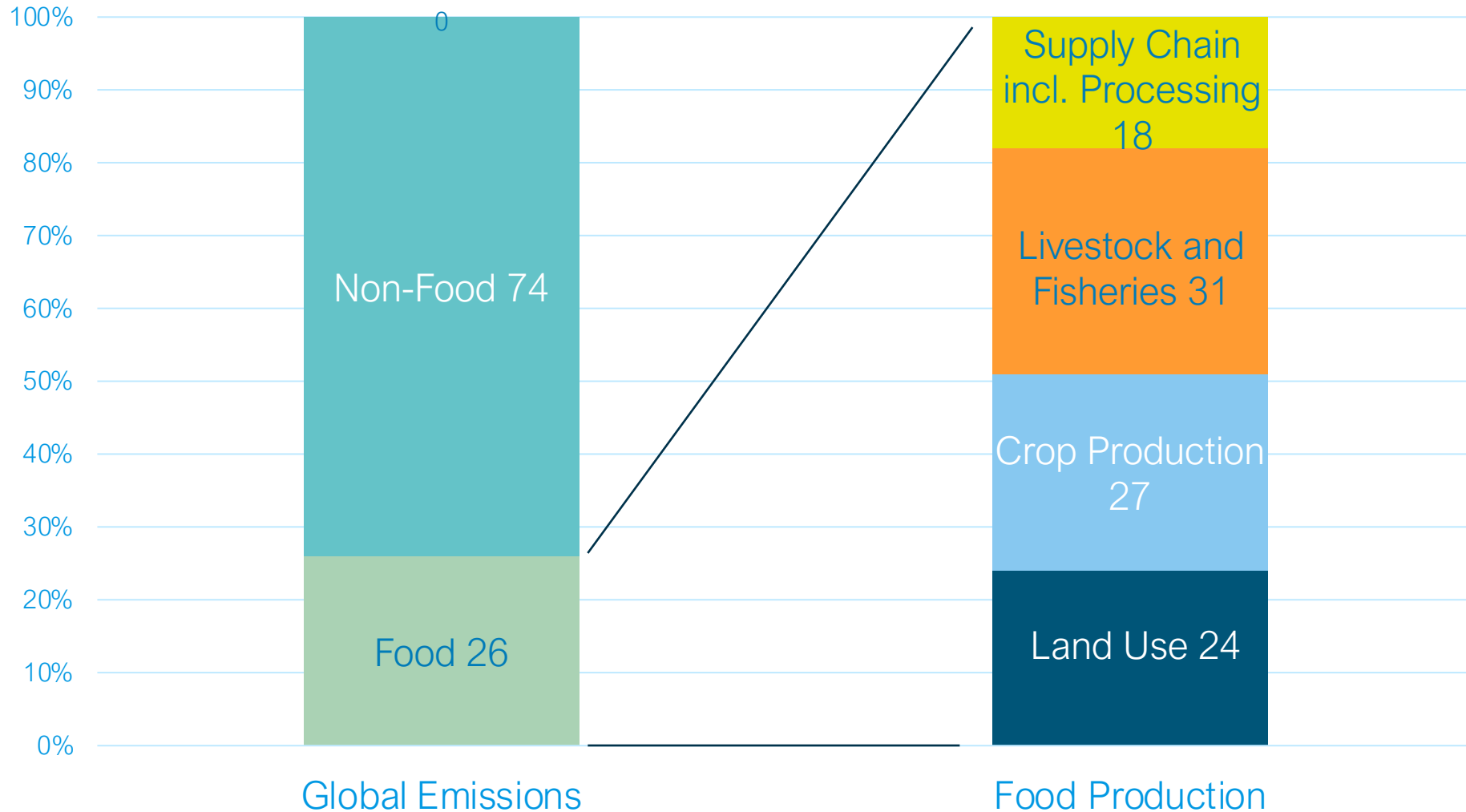
Urgency to act now to limit global warming to 1.5 °C. Emissions need to be halved in the next 8 years.



Source: UN Emissions Gap Report 2021.



Food production responsible for 26% of global emissions



Source: Our World in Data

Our Relevance

8 Billion People
Worldwide

Two billion

people each day enjoy food
produced on Bühler equipment

One billion

people travel in vehicles partly
produced with Bühler machinery

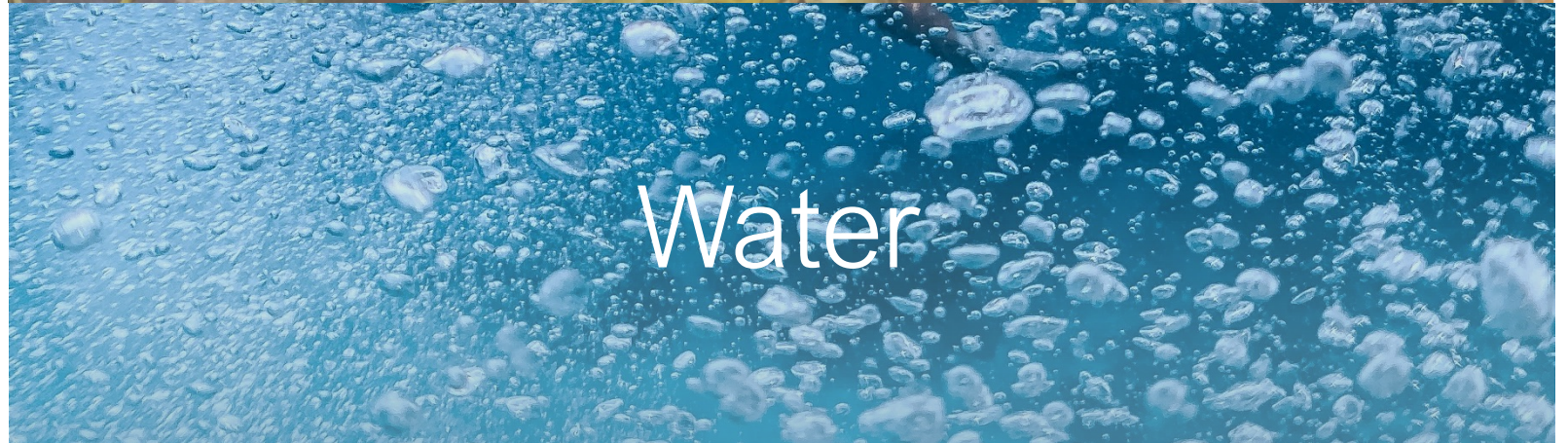
Our
commitment
50% less



Energy



Waste

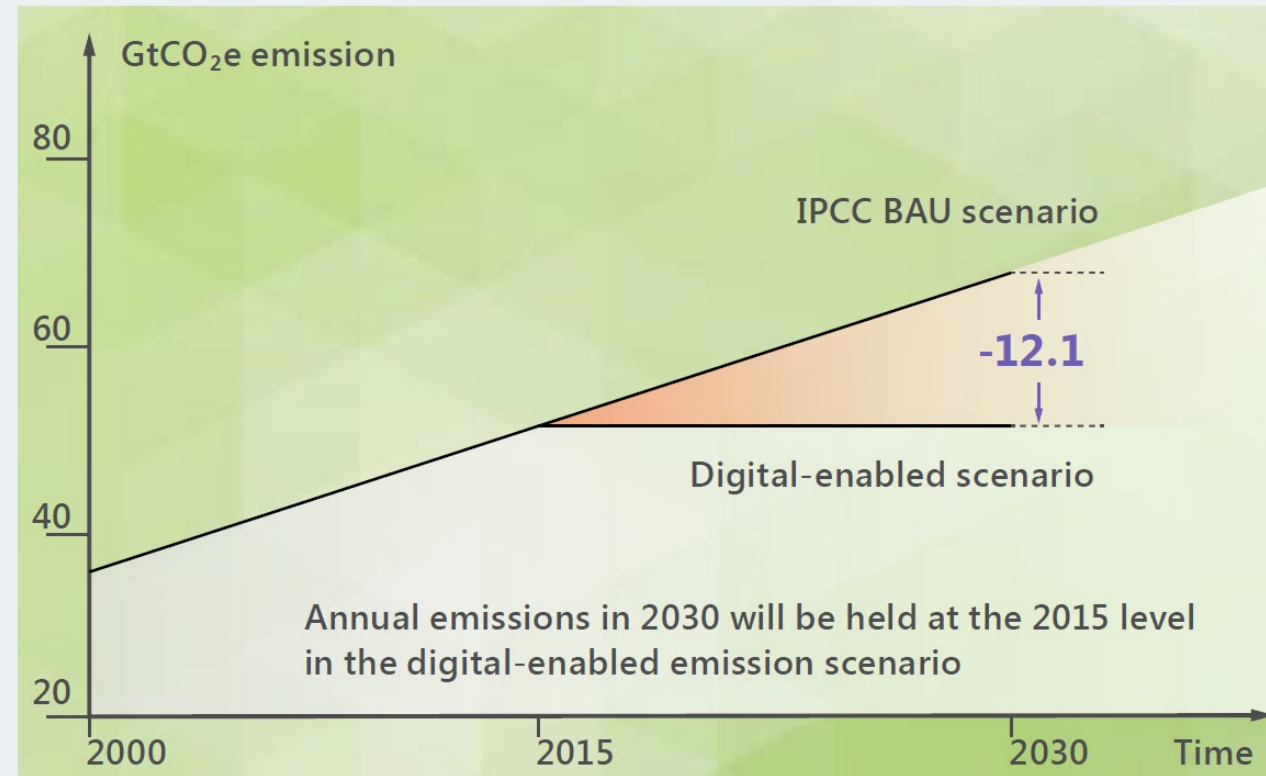


Water

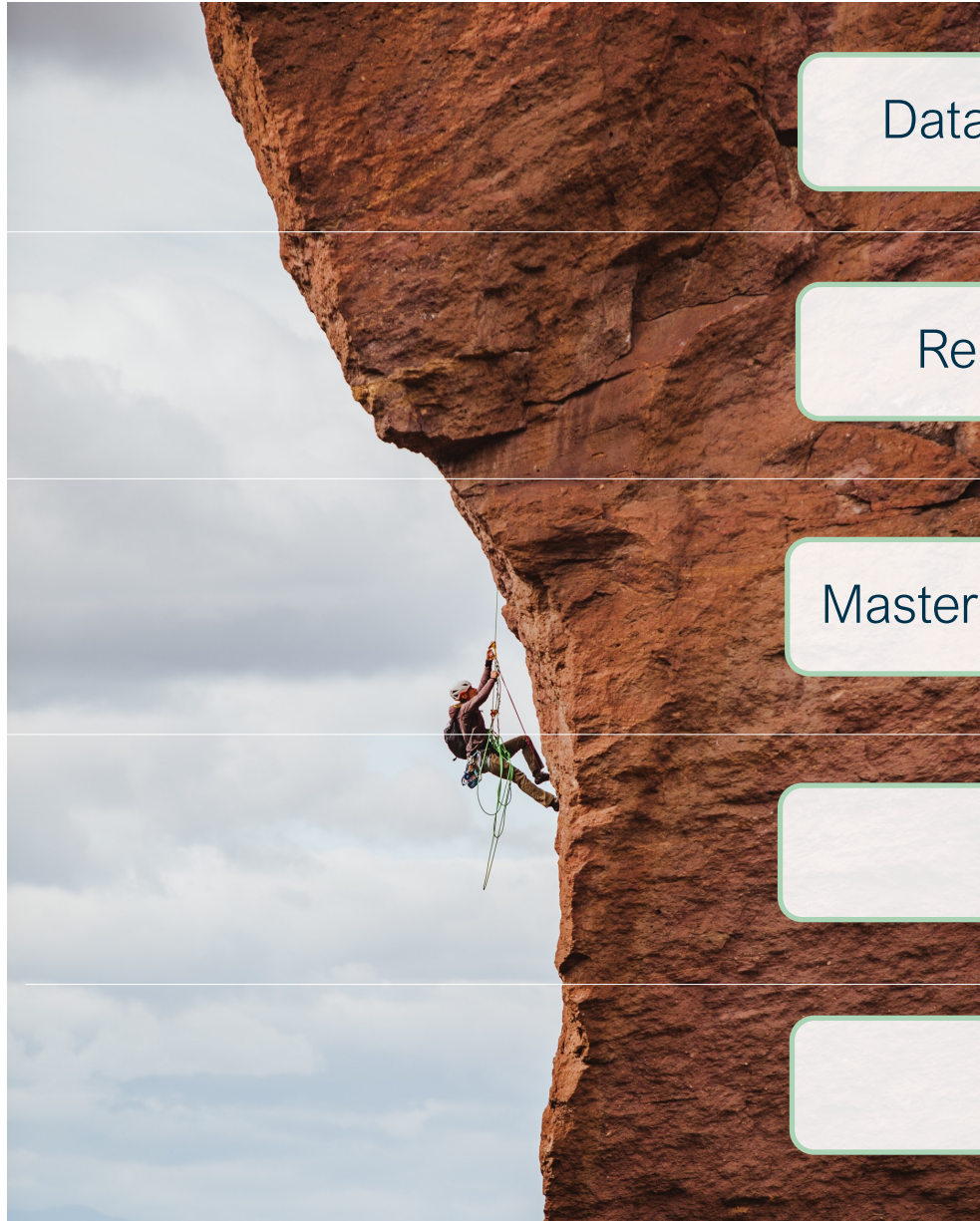
How can Digital Help?

- According to the Global e-Sustainability Initiative (GeSI), ICT has the potential to slash global GHG emissions by 20% by 2030
- The data centers used to power digital services contribute approximately 2% of global GHG emissions

Digital-enabled emission reductions amount to 12.1 GtCO₂e in 2030, decoupling emissions from economic growth



The Path to Data Science Maturity



Data Science, Machine Learning & AI

- Self-optimized operations
- Business transformation

Reporting & Business Intelligence

- Transparency
- Digitally enhanced services

Master Data Management & Governance

- FAIR data principles

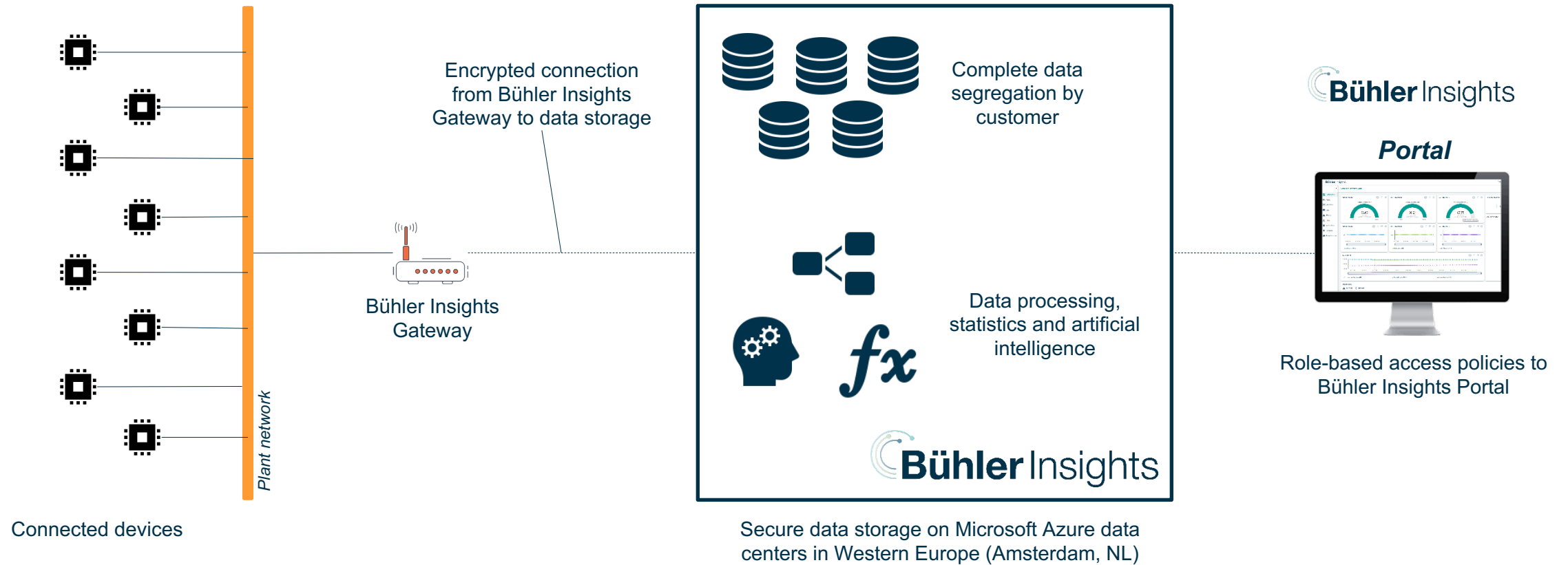
Data Engineering

- Data architecture
- Standardized APIs

Data Acquisition

- Standard connectivity solutions
- Data quantity & quality

High Level Architecture of an Industry 4.0 Cloud Platform





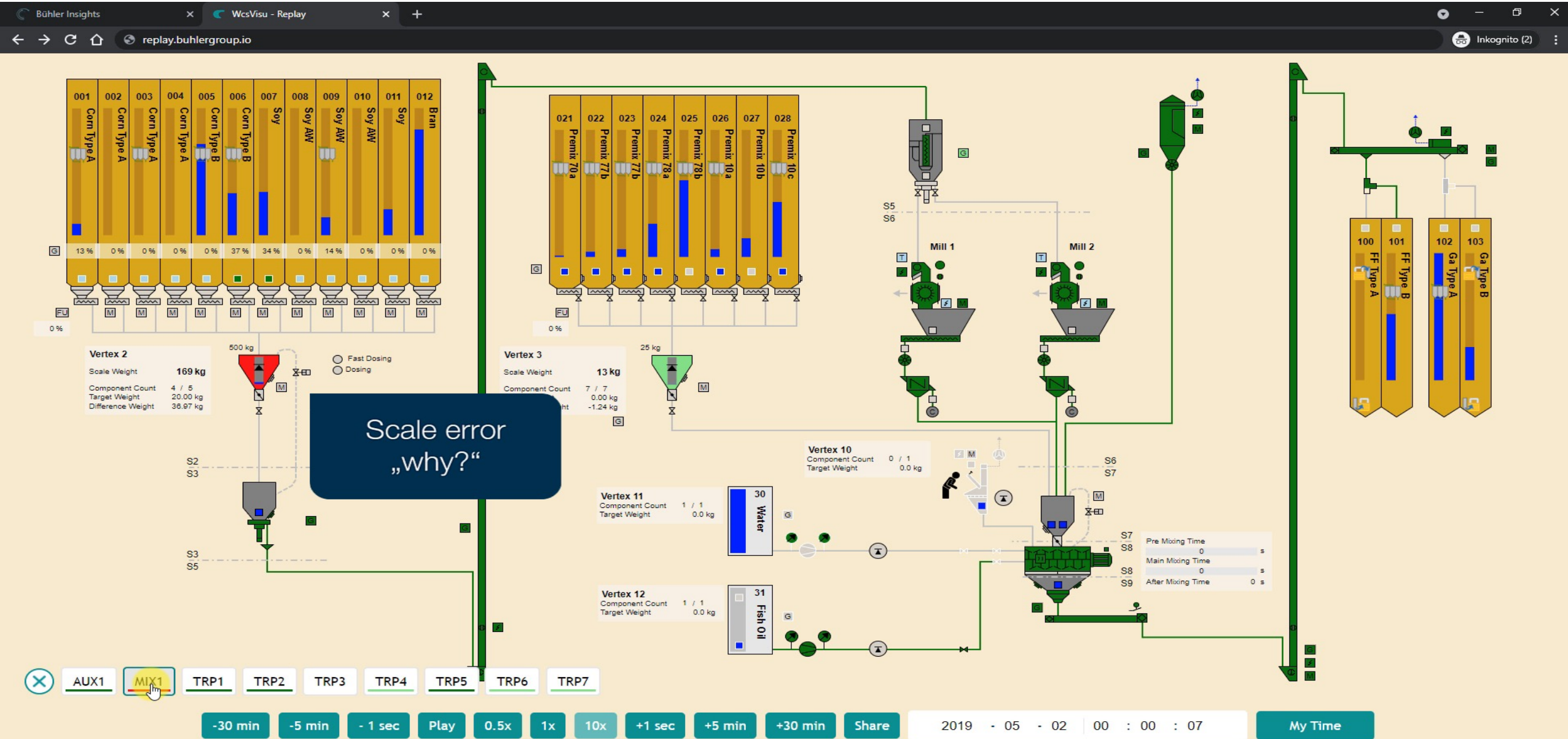
Digital Twins

Our Definition:

A Digital Twin is a sufficiently accurate representation of a physical process in the virtual space which can be used to model and optimize performance of the physical process.



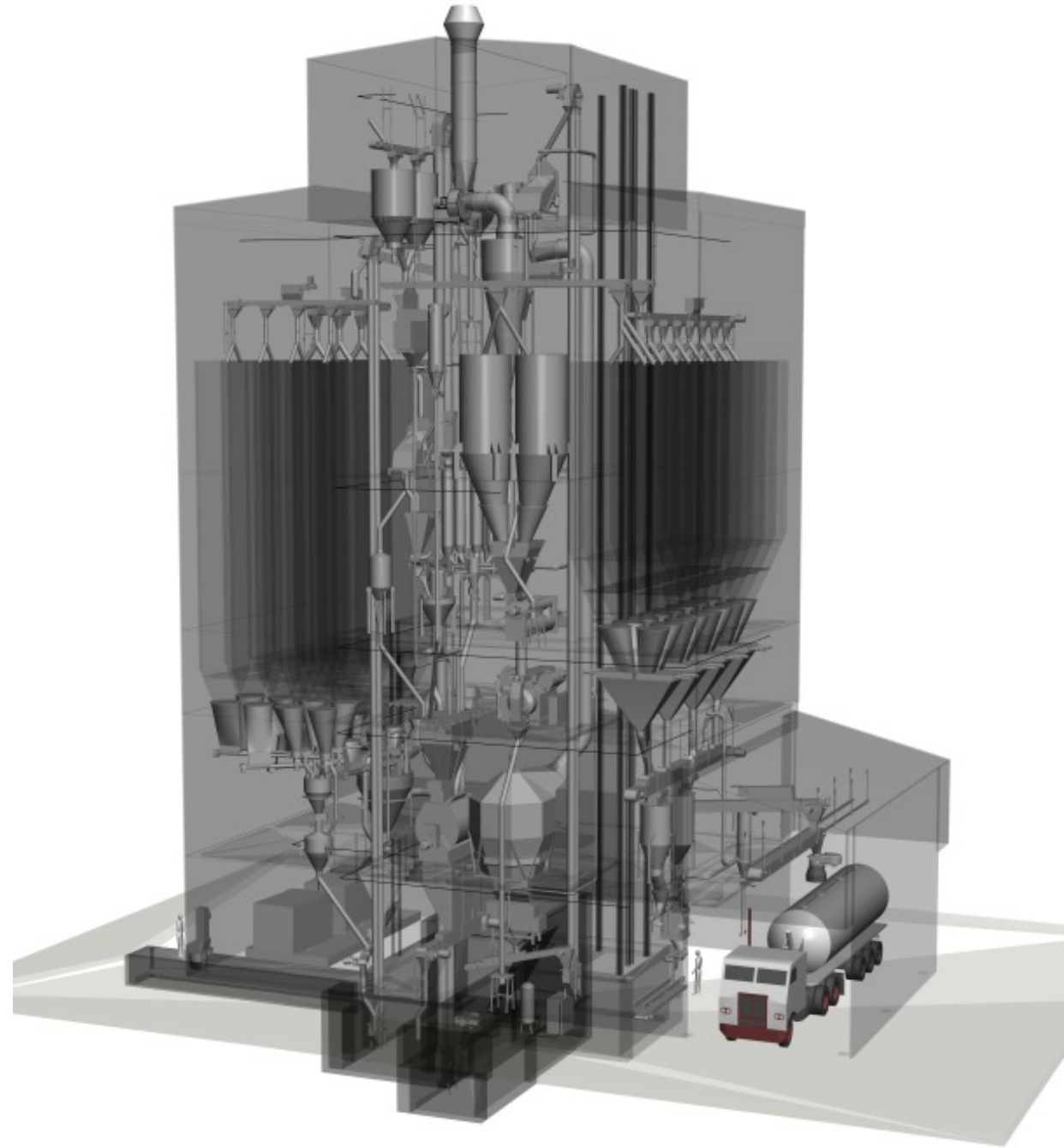
Digital Process Twin of a Dosing, Grinding, and Mixing Plant



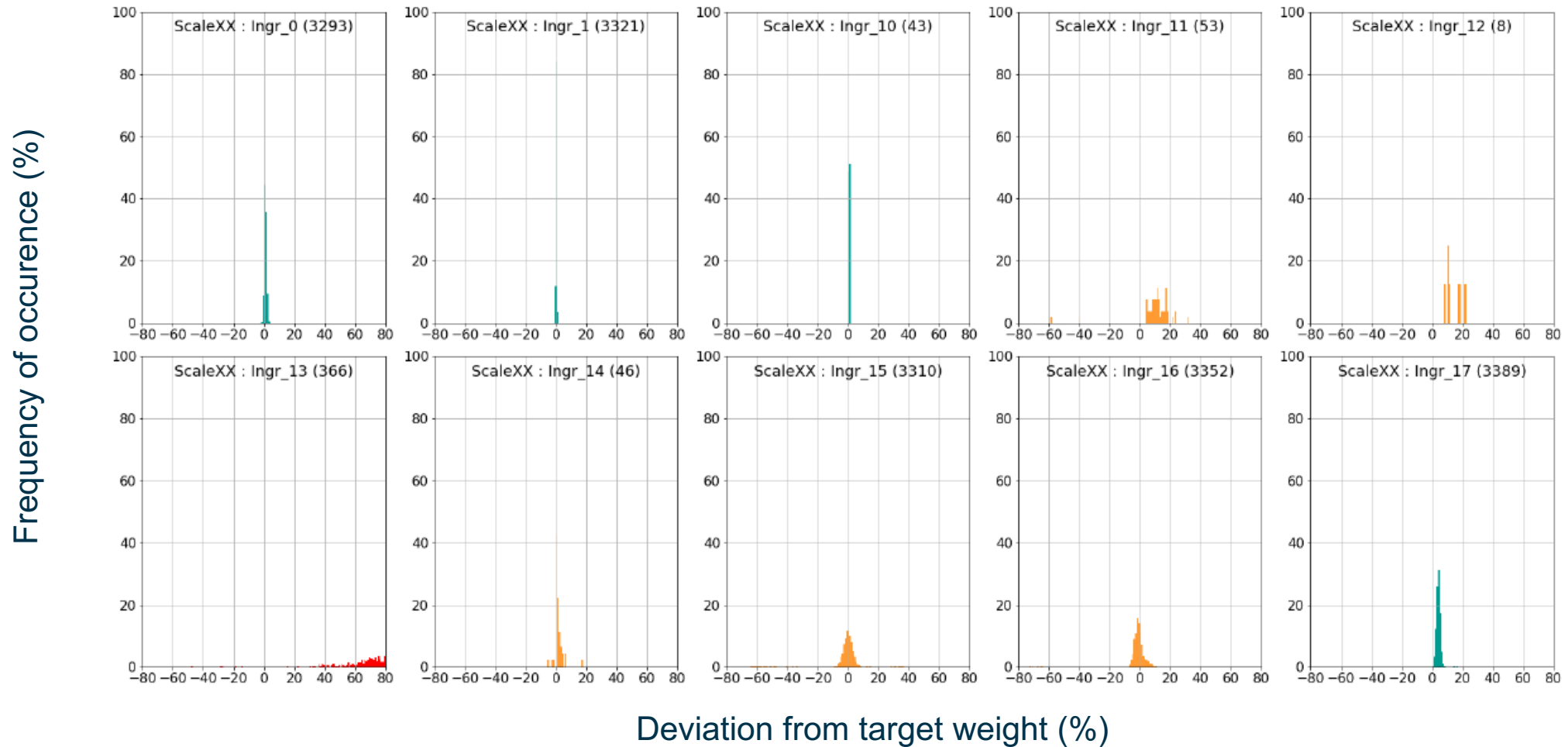
Data Driven Plant Optimization

Examples of digital optimization potential:

- **Plant performance analysis**
- **Dosing scales efficiency improvement**
- **Grinding analysis**
- **Mixing cycle optimization**
- **Pelleting line summary**
- **Inline quality measurements**
- **Error and downtime trends**



Dosing Health Monitoring



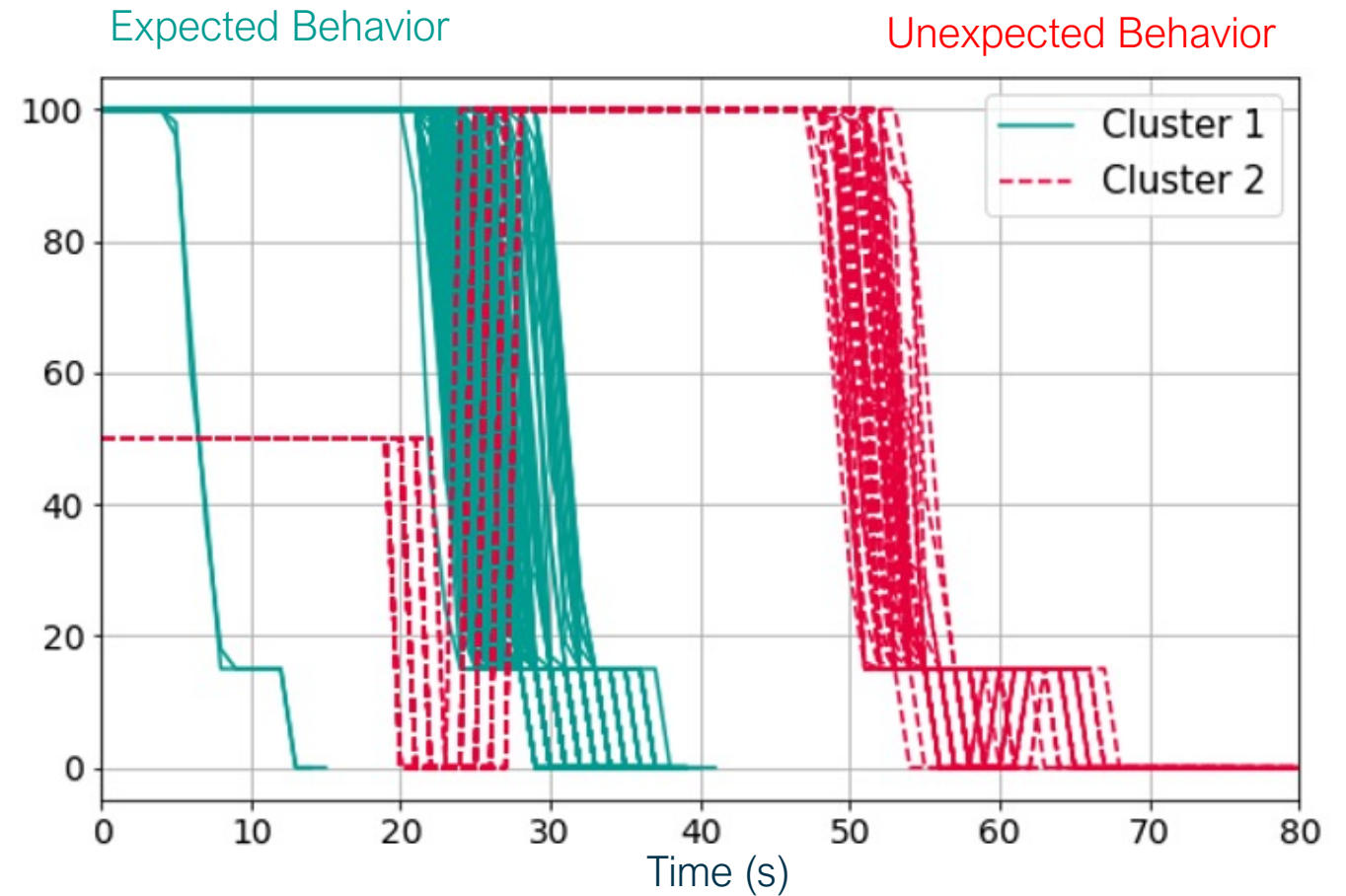
Anomaly detection with Dynamic Time Warping(DTW)

1. Compare
waveforms with
DTW

2. Density based
clustering

3. Detect
Anomalies

Dosing speed (%)



AI for Process Optimization

- Using Machine Learning for more resource-efficient raw material processing
- Example from Coffee optical sorting



Using AI to set up optical sorters for higher efficiency

+20% higher accuracy and 3x less waste thanks to machine learning.

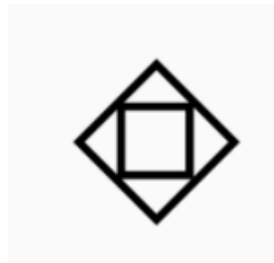
AI for
equipment
setup.



- Sorter uses shape and color features.
- No single feature provides a perfect separation between good and defective product.
- Find combination of features that provide the best possible separation.



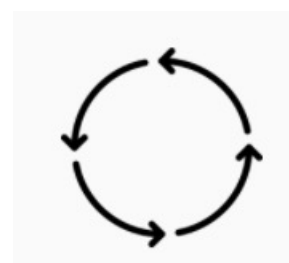
Feature 1



Feature 2



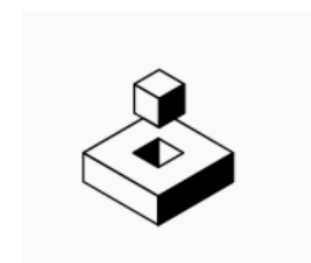
Feature 3



Feature 4



Feature 5



Feature 6

A machine learning application for shape sorting.

+20% accuracy (true negative) and 3x less waste (false negatives) using machine learning.

INPUT



ACCEPT



REJECT



Precision storage



Specific energy
reduction



Data services to reduce losses & CO₂e / ton across installed base.

Precision sorting,
cleaning & dosing



Yield increase



Summary & Outlook

- Data, Analytics and AI is a key enabler to enhance efficiency of food and feed production lines
- Small improvements can create significant impact due to large installed base of Bühler machines & lines globally
- We are further developing next-generation data-driven technologies to boost raw material efficiency and reduce energy consumption in e.g. drying processes

ali.baajour@buhlergroup.com

Internship Opportunities available!



Buhler Data Science Ecosystem





INNOVATIONS FOR A BETTER WORLD