

25 MAY 2022

Digital Transformation

Unlocking the power of data

Hannes Bram

AVEVA





Sanofi Geel

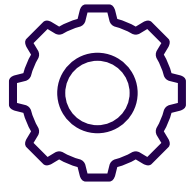
Employees: Approx. 800

Key activities: Biomanufacturing of therapeutic proteins (enzymes & monoclonal antibodies)

Capacity:

- 12,000 L perfusion cell culture capacity
- 80,000 L fed-batch cell culture capacity
- 1600 m² QC laboratories
- 930 m² MSAT laboratories

Digital Transformation – Factory of the Future



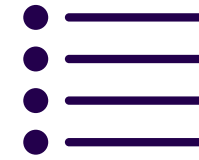
Challenge

Building a state-of-the-art biotechnological production facility with real-time monitoring and analytics capabilities.



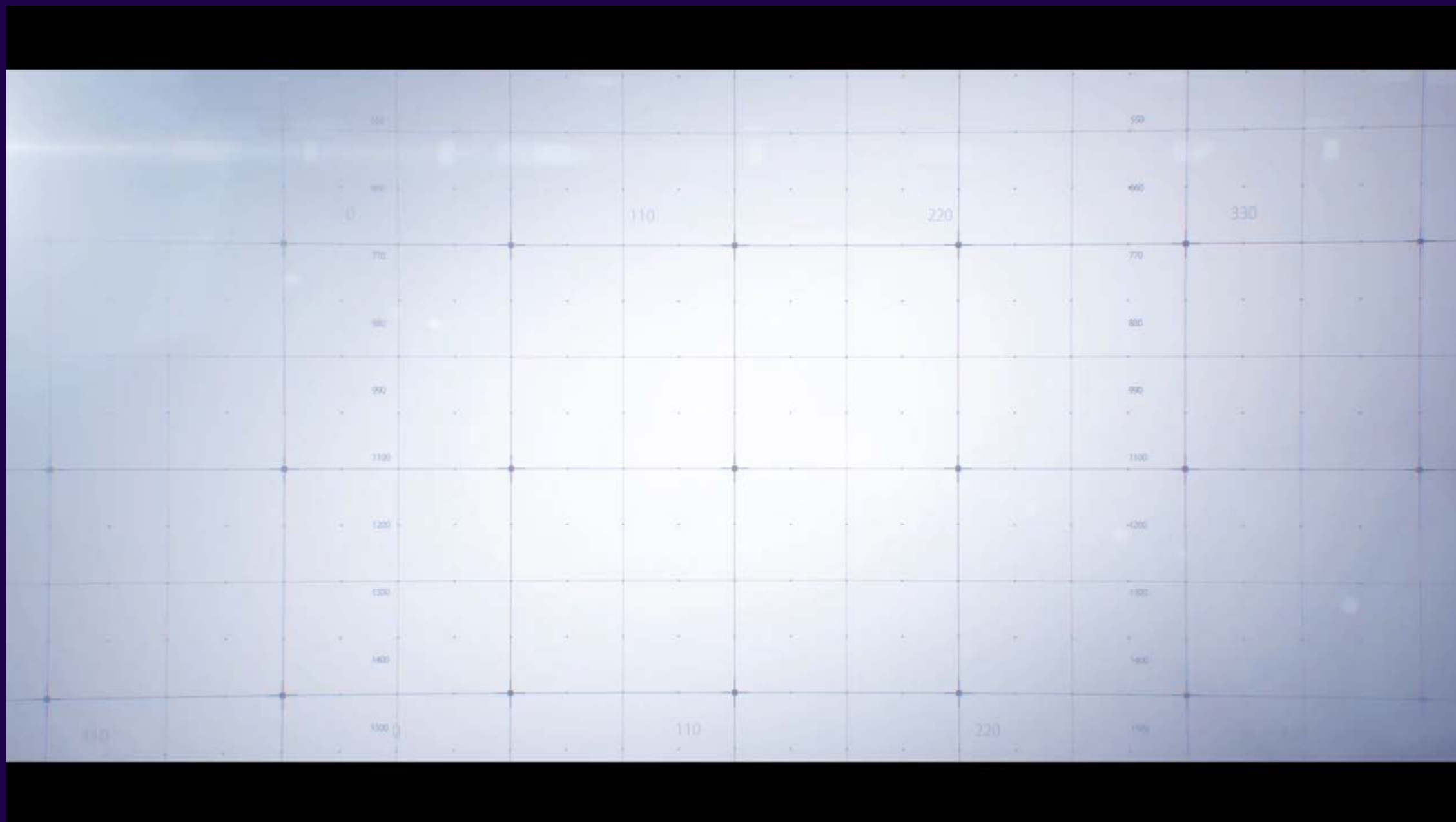
Solution

Deployed the latest AVEVA PI System technology including PI AF/EF and PI Vision as an advanced foundation for Process Monitoring, Condition Based Maintenance & Advanced Analytics



Benefits

Increased production and operational efficiency, reduced costs, mobile inspections, exception-based surveillance, significantly accelerated 'Time to Value' for Advanced Analytics & Machine Learning projects

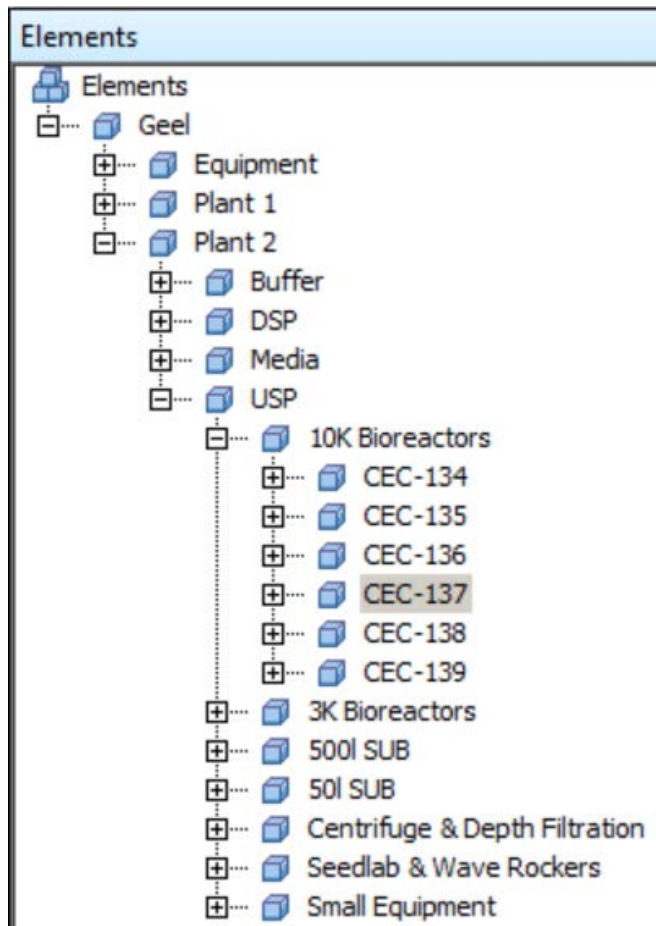


Building Blocks

- 1 Building the framework
BUILDING THE AF/EF FRAMEWORK
- 2 Run-to-Run analysis
PROVIDING THE DATA TO THE SHOPFLOOR
- 3 Raman Technology
PROCESS ANALYTICAL TECHNOLOGY
- 4 AA & ML
MOVING TO THE CLOUD
- 5 Sustainability
GO GREEN



1. Building the framework



An Asset Framework was built to map the site and its processes

The following is in a validated state:

240 templates

10864 elements

79 GxP PI Vision displays

76 tables

1607 analyses based on 617 analysis templates (170 EF analysis templates & 447 expression analysis templates)

45 Event Frame Templates

3 enumeration sets

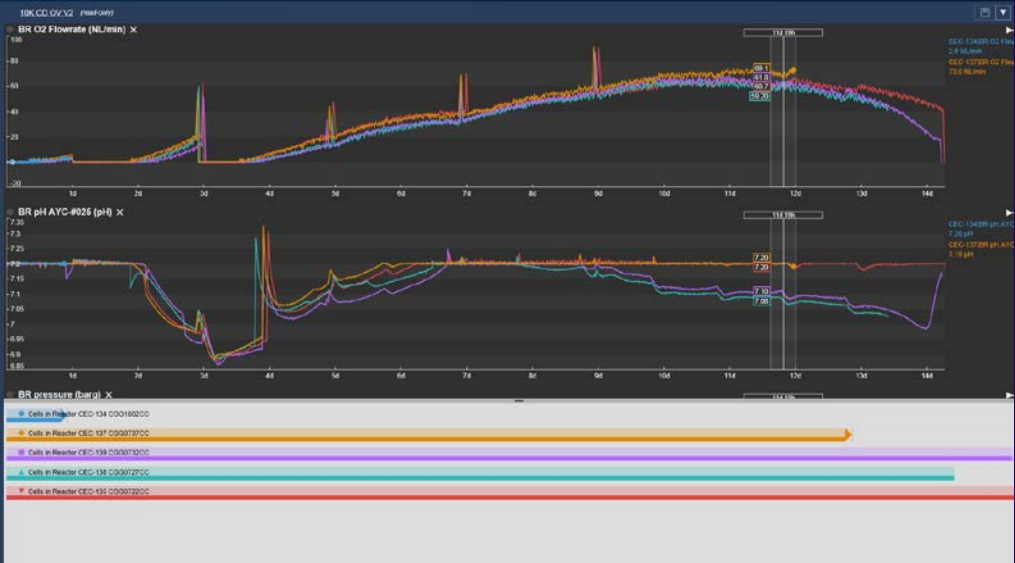
15 custom UOMs

884 formula attribute templates

1379 table lookup attribute templates

2. Run-to-Run Analysis

Replacing cumbersome manual data gathering and analysis

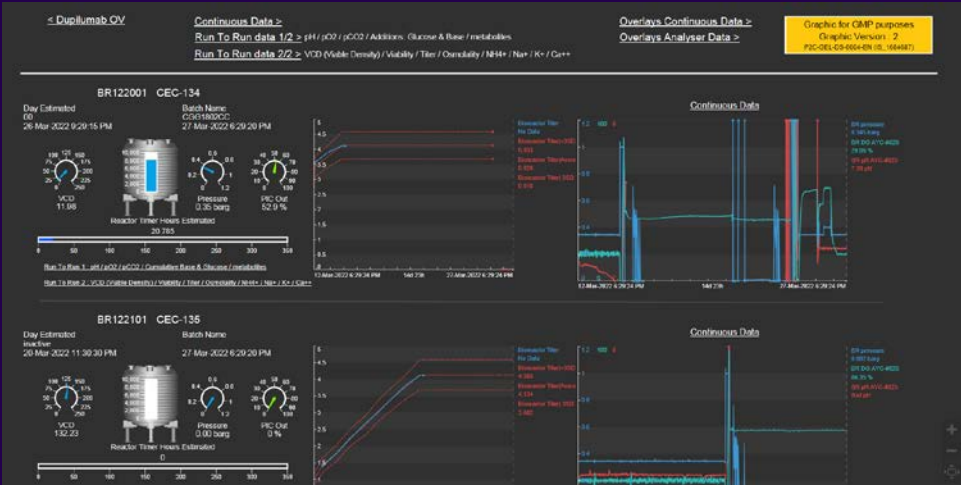


1 Data overlays to check consistency

2 Check if parameters are within acceptable limits



3 Overview screens

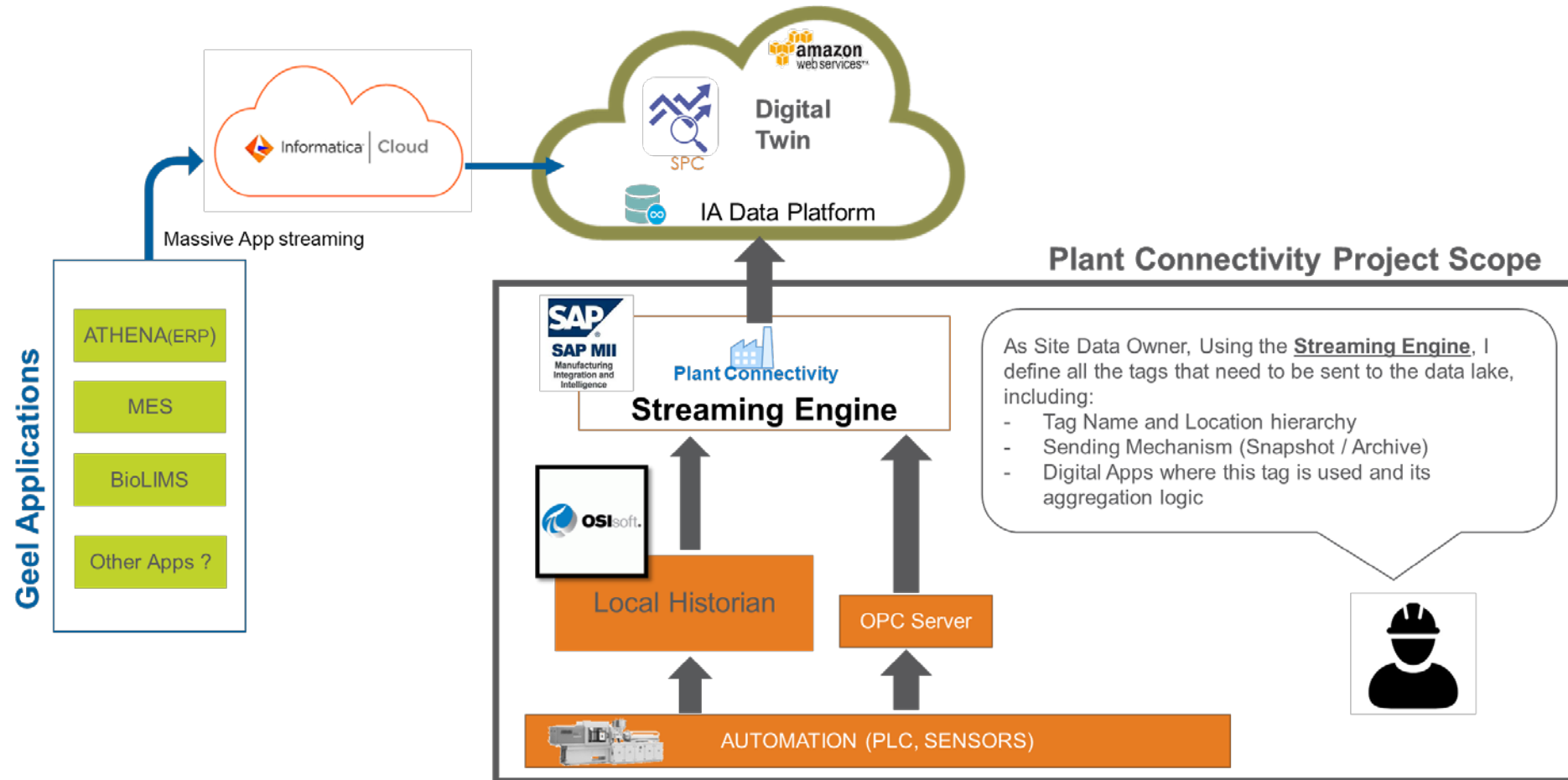


3. Raman Technology

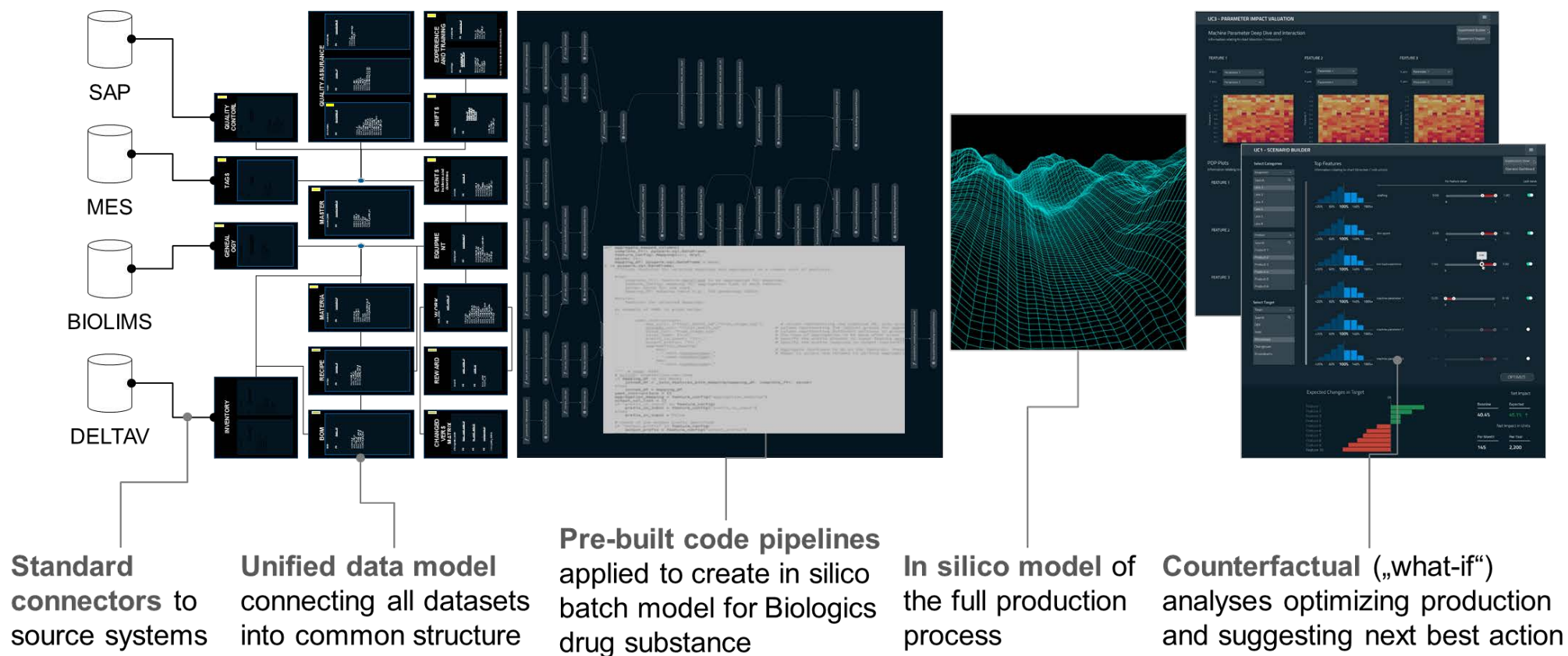
- Use of **Raman technology** (spectroscopic technique typically used to determine vibrational modes of molecules)
- Enable the elimination of offline sampling and analysis @bioreactors.
- Significantly reducing our day-to-day offline sampling & associated cost and product loss
- Direct Link with SynTQ software and PI AF.



4. Moving to the Cloud



5. Advanced Analytics & Machine Learning



5. Advanced Analytics & Machine Learning

```
GoldenBatchpynb
Python 3

import pandas as pd
import datetime
import ipynbwidgets as widgets
from IPython.display import clear_output
import matplotlib.pyplot as plt
import ausurangler as ur

#####
# LOADING BASIC DATA INTO DATAFRAMES
# dfeff : LOAD EVENTFRAMES FROM CSV - to be updated when EF's Available in Datalake

# load .csv file
dfeff = pd.read_csv('Files/EFDataLake.csv', sep=';')

# remove all eventframes not of type 'Cells in Reactor'
dfeff = dfeff[dfeff.EventFrameTemplateName == 'Cells in Reactor']

# set end time to now for EF's that are open (EEnd = NaN)
nowstr = datetime.datetime.now().strftime("%Y-%m-%d %H:%M:%S")
nowstr = ".000000"
dfeff['EEnd'] = dfeff['EEnd'].fillna(nowstr)

# Remove EventFrames without BatchID
dfeff.dropna(subset=['BatchID'], inplace=True)

# Remove EventFrames with incorrect batch ID's - not containing '00'
dfeff = dfeff[dfeff['BatchID'].str.contains('00')]

# drop EF's that are not of 10k Bioreactor i.e. not containing substring 'CEC-134' > 'CEC-139'
lst_reactors = ['CEC-134', 'CEC-135', 'CEC-136', 'CEC-137', 'CEC-138', 'CEC-139', 'CEC-132', 'CEC-133']
dfeff = dfeff[dfeff['ElementName'].isin(lst_reactors)]

# Sort EF's newest to oldest
dfeff = dfeff.sort_values(by=['EStart'], ascending=False)

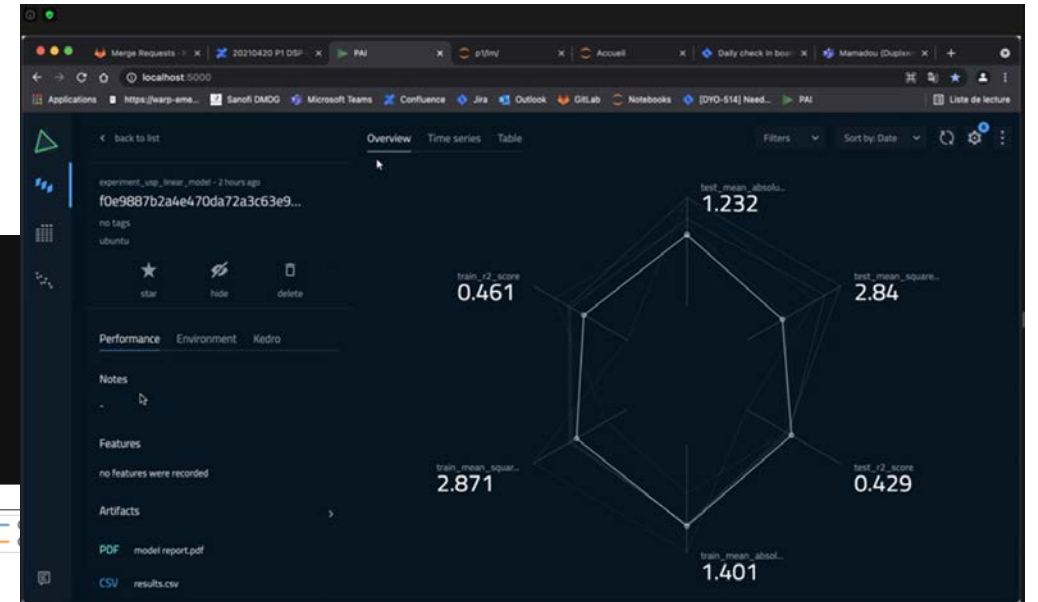
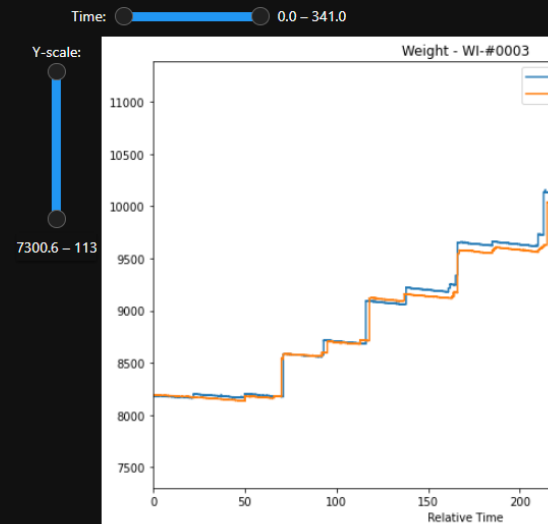
# create additional column that concatenates all information
dfeff['display'] = (dfeff['BatchID'] + ' - ' + dfeff['ElementName'] + ' - ' + dfeff['EventFrameTemplateName'] + ' - ' +
                  dfeff['EStart'] + ' - ' + dfeff['EEnd']).astype('string')
```

Golden BatchID

Reference batch ID

Instrument

Query executed - proceed to plot the data



6. Go Green



Our 5 environmental commitments



Fight climate change: chase after carbon neutrality by 2030 and net zero emissions by 2050

By engaging Sanofi towards the 1,5°C global warming trajectory



Limit our environmental footprint and aim for circular solutions

By optimizing the use/reuse of resources and reducing impact of emissions



Improve environmental profile of products

By delivering eco-innovative products and fostering a sustainable use of medicines



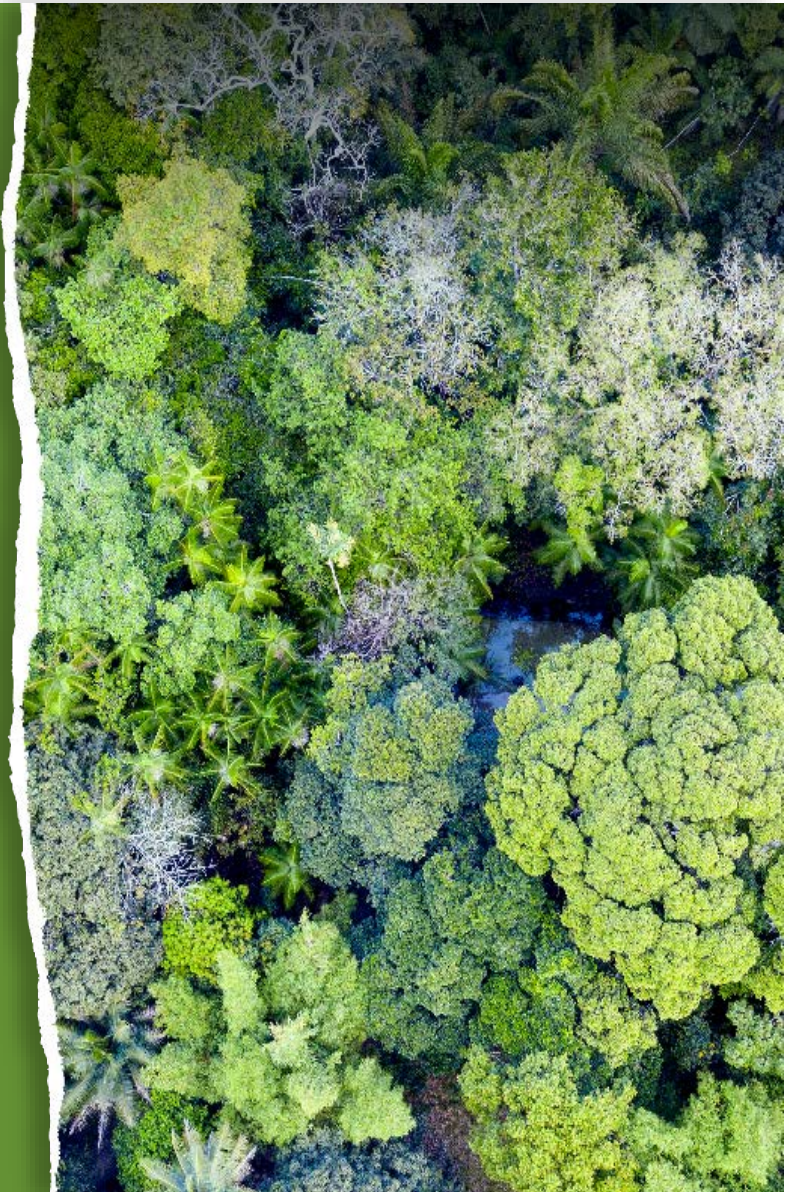
Mobilize our people for environmental sustainability

By promoting an environmentally-conscious culture in the workplace



Engage our suppliers in our environmental ambitions

By sourcing responsibly and leading by example



Our 5 environmental commitments



PI will be at the hart of our environmental commitments

Delivering roughly 3000 environmental parameters from our plants & facilities cleaned and contextualized before passing through our streaming engine into the datalake.

There it will be further analyzed, and diagnostics will be performed on the data. Keeping our plants in optimal condition and exposing areas for improvement.



**Information is the oil of the 21st century, and
analytics is the combustion engine**

Peter Sondergaard



Hannes Bram


Digital Champion

Sanofi

Bram.hannes@sanofi.com

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