OCTOBER 25, 2023

## Lighthouse Project

BIOSNA PHARMA Ir J.F. van de Laar, MSc



# **Lighthouse Project**

"Implementation of a cloud based real-time Data Hub to acquire, visualize and analyze process- and analytical data from multiple sites and equipment for an end-to-end continuous biotech manufacturing process for biosimilars."

25 October 2023

# Biosana Pharma

Store See Shape Share

AVEVA Data Hub™

SVIECLEVS

Ir J.F. van de Laar, MSc



## Making **biologics affordable** and accessible for all patients

# Biosana









# Biosana Pharma







NDC 50242-040-62

Genentech

SINGLE-DOSE VIA

150 mg

**KEEP REFRIGERATED. DO NOT FREEZI** 

UNOVARTIS

- Monoclonal antibodies and biosimilars lead candidate: Omalizumab  $\rightarrow$
- Successful in phase I clinical studies and analytical bio similarity
- First continuous end-to-end manufacturing platform (Mycenax, 2018)





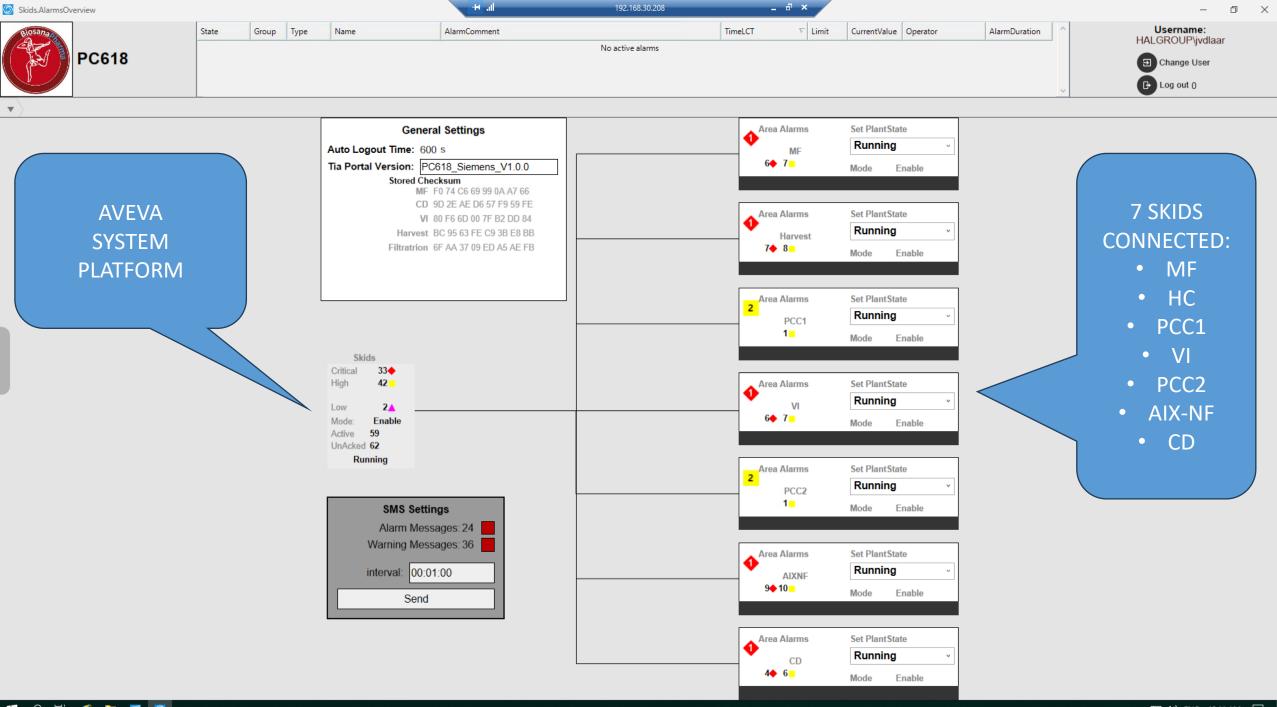
## Project & 3C process introduction



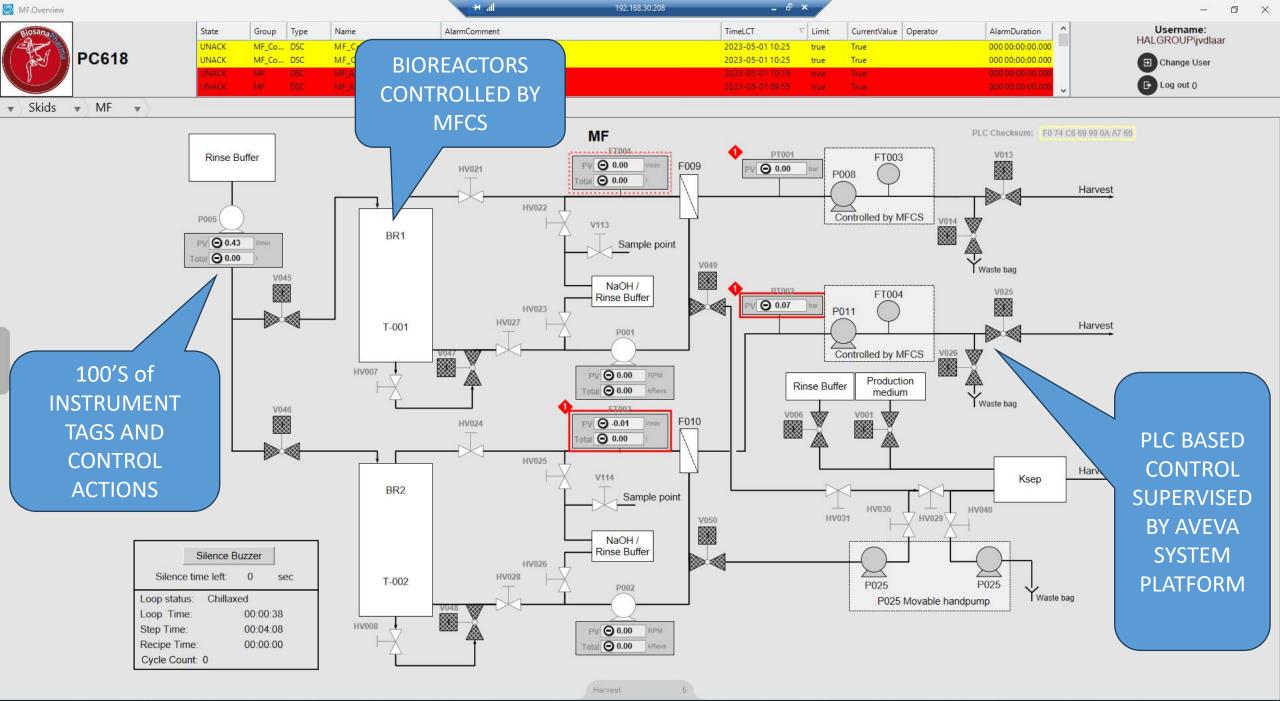
 Development of a continuous manufacturing platform for our lead mAb product: a biosimilar to Omalizumab Xolair<sup>®</sup>



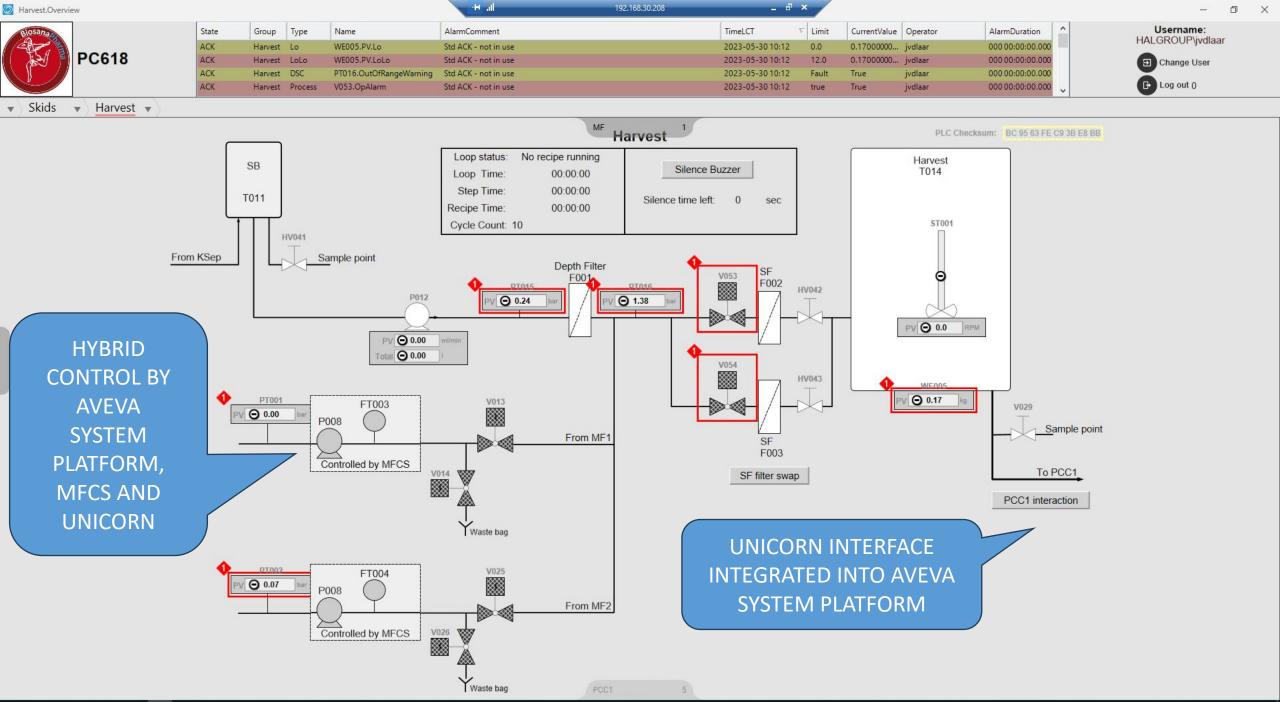




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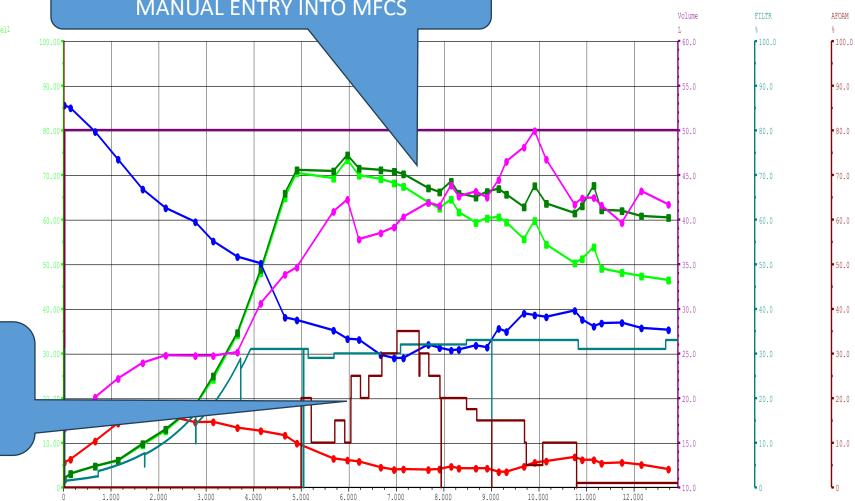


STR Metabolic Parameters VCD, TCD, Glucose, Lactate, Ammonium, pH, Volume, Perfusion, Ble STR2 HX22-070B \$0053(Running) Selection :30-11-22 16:29:08 - 13-12-22 14:33:56



**MEASUREMENTS AND CONTROL ACTIONS** ACQUIRED BY MFCS

**CTM1.4** 

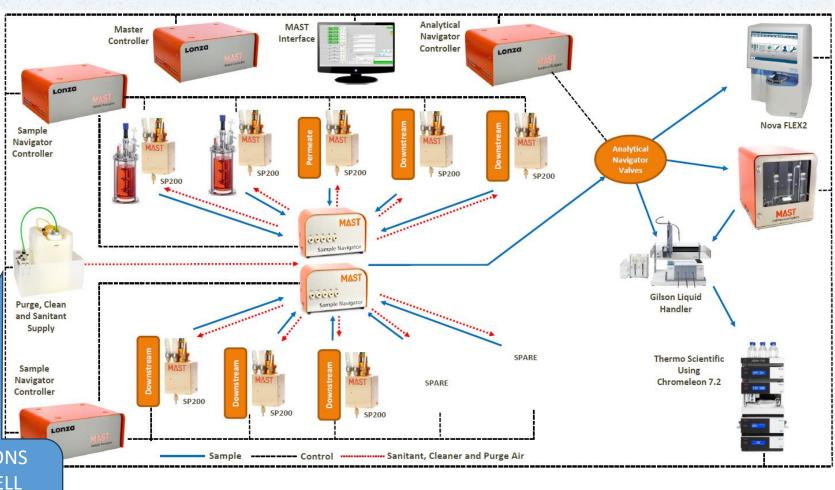


Batch Age [days] (GMT +1) W. Europe Daylight Time

## In-process sampling and at-line testing

SEC

| SP/MN | Sample point                        |
|-------|-------------------------------------|
| STR1  | Bioreactor 1                        |
| STR2  | Bioreactor 2                        |
| SP1   | Sample point for STR1               |
| SP2   | Sample point for STR2               |
| SP3   | MF Permeate                         |
| SP4   | Clarified harvest                   |
| SP6   | Acidification bag( for ProtA elute) |
| MN1   | kSep                                |
| MN2   | ProtA flow through                  |
| SP7   | Post-VI surge bag                   |
| SP8   | CEX elute                           |
| MN5   | CEX flow through                    |
| SP9   | CD Bag                              |
| DS    | AUTOMATED SAMPLE LOCATIO            |
|       | THROUGHOUT PROCESS TO CE            |
|       | CULTURE ANALYZER AND PROT A         |
|       | AND CEX CHROMATOGRAPH               |

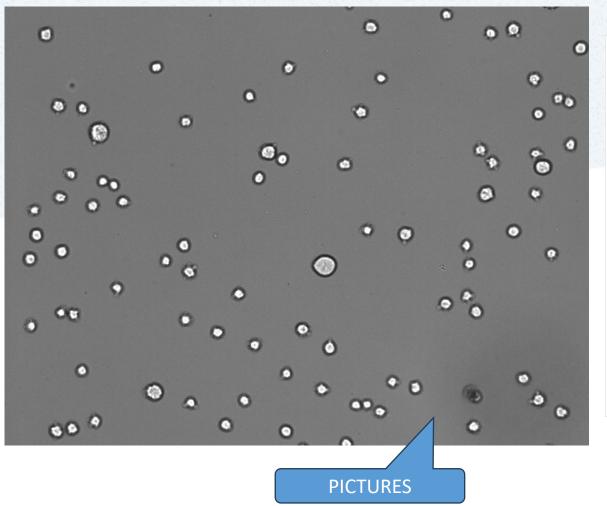


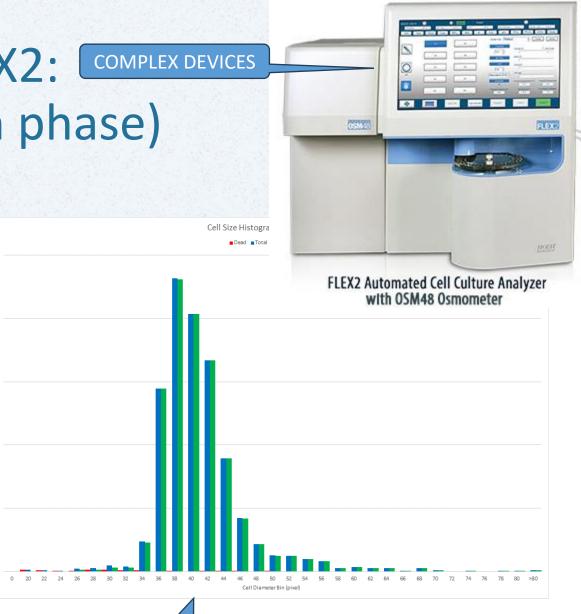


## NovaMedical BioProfile<sup>®</sup> FLEX2: COMPLEX DEVICES cell size distributions (growth phase)

15.00%

10.00%





VECTOR DATA

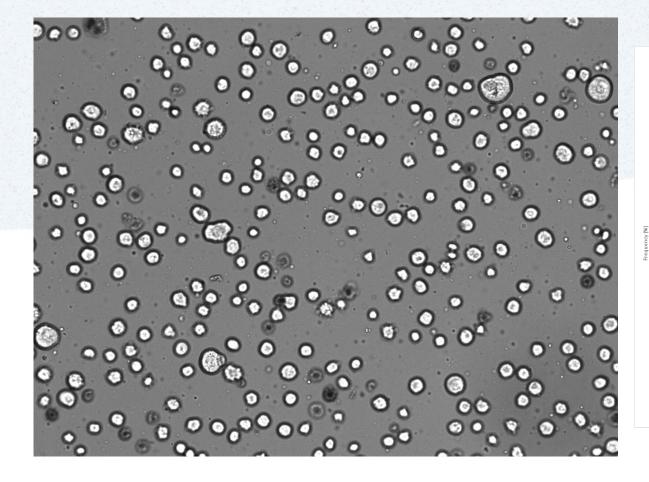


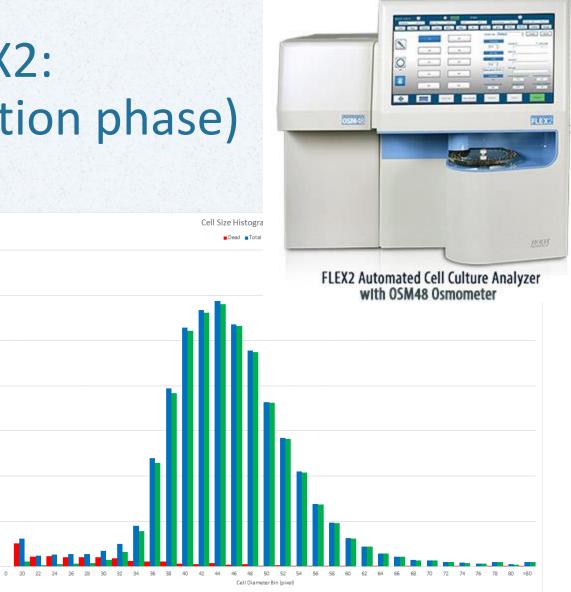
# NovaMedical BioProfile<sup>®</sup> FLEX2: cell size distributions (production phase)

10.00%

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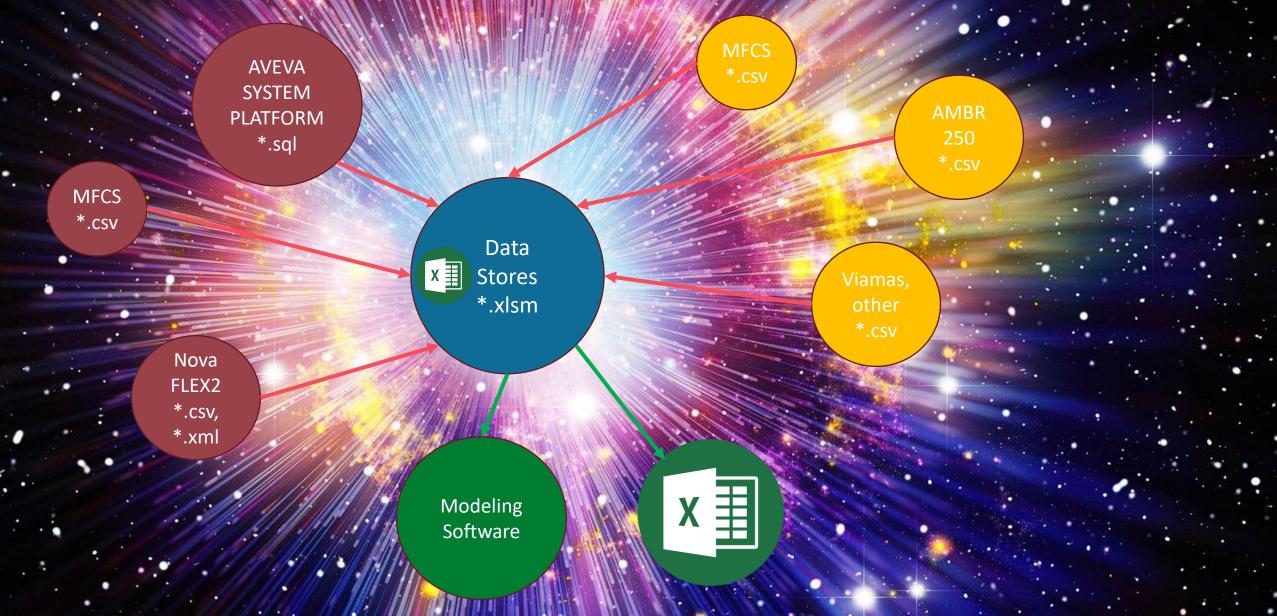
4 0.0%







# In the beginning... there was chaos



#### Pharma & Life Sciences | Singapore & The Netherlands

# BiosanaPharma requires a reliable cloud-based data platform for continuous manufacturing

#### Challenge

- Massive amount of process parameters and attributes at different scales and sites.
- Data stored across several different databases and devices, e.g., MFCS, NovaFlex, AVEVA, Excel, etc, as well as in paper files.
- Real time scale-up performance monitoring, failure mode and excursion monitoring needed.
- Connection needed to commercially available modelling packages.

#### Solution

Using AVEVA Data Hub as cloud data platform to collect data from various sources at the development laboratory and the manufacturing site is promising to ensure comparability, data integrity and contextualization.

#### Results

Simple, secure data sharing allows the customer:

- a) A single point-of-truth, well contextualized, well searchable real-time and historical data.
- **b)** Efficient real-time visualization and off-line analysis.
- c) Process parameters and quality attributes and excursions using SIMCA On-line MVDA models.

The AVEVA Data Hub solution is a powerful tool for process development as well as manufacturing and can become the hub for the future of biopharma



The future of biopharma is "lights out" continuous end-to-end processing.
 The cost of goods of antibodies will decrease a factor 10 in the next decade by innovation, driven by pressure on originators and choice of health authorities for biosimilars.

Maarten Pennings, CTO, BiosanaPharma

Learn more

| ighthouse<br>nd Sharing  | Card and a series of the set of the set |                |             | 12 No. 1 1 1 1 1 1 1 1  | AV<br>Biosa<br>SARTO   | HARMA  |
|--|---|----------------|-------------|---|--|--|
| Biosana-Satorius<br>Biosana-Sartorius<br>Tenants 2<br>Sharing Status & All T   | enants Active                           |                |             | 0 2022<br>1.1<br>0 2022   | Lighthouse Project for Data Analyti<br>uthor: Hans Otto Weinhold<br>rsion / Date<br>(Ready for Approval) / Friday, Septen<br>AVEVA Group plc and its subsidiaries. All rights re<br>he AVEVA loges and AVEVA product names are th<br>ted Kingdom and other countries. Other brands a | nber 30, 2022  |
| Biosana-Satorius<br>8bc8cc64-625e-4c93-939d-40820<br>Biosana-Sartorius<br>♥ All Tenants Active<br>Created 20.02.2023 | 090e5bb5                                |                |             | AVEVA Grove<br>High Cross, J.<br>Cambridge Cl<br>Tel +44 (0)122<br>Fax +44 (0)122<br>Fax +44 (0)122 | Madingley Road<br>83 OHB, UK<br>23 SEERE   | e sous names are the trademarks of their respective companies. |
| Tenants  | My Members                              | 5              | My Groups   |   | My Clien   | ts   |
|  |   | Filter tenants |             |   |  |  |
| 🞽 Administrative Tenant  |   |                |             |   |  |  |
| □ Name ↑   | Status                                  | Users (11)     | Clients (1) | Streams (6816)  |  |  |
| BiosanaPharma  | Active                                  | 4              | 0           | 6816  | ₩  |  |
| Sartorius Stedim Biotech GmbH  | Active                                  | 7              | 1           | 0   |  | <b>D</b> :   |



# Data Sources – Singapore Laboratory

| Source System   | Location  | Protocol  | In scope for Lighthouse project |
|---|-----------|---|---------------------------------|
| Ambr 250 – OPC UA   | Singapore | PI Adapter for OPC UA   | Yes                             |
| Spectroscopy Module – OPC UA/File                                   | Singapore | Python Script to process files  | No                              |
| MFCS 3.1 – OPC DA/UA  | Singapore | PI Adapter for OPC UA   | Yes                             |
| KML100 – Serial (tbd)   | Singapore |   | No                              |
| Levitronics, tbd  | Singapore |   | No                              |
| ABER Viamass – Modbus Serial – Modbus TCP bridge                    | Singapore | PI Adapter for Modubus TCP  | Yes                             |
| BioSMB – OPC DA/UA (Beckhoff PLC)                                   | Singapore | PI Adapter for OPC UA<br>(Dianomic Foglamp)                             | No                              |
| Novaflex 2 – CSV Files  | Singapore | PI Adapter for Structured Files<br>Image processing through custom tool | Yes                             |
| ThermoFisher HPLC – tbd<br>HPLC Data Analytics<br>Chromatogram data | Singapore |   | No                              |
| Offline data (Lab) – CSV/Manual data                                | Singapore | PI Adapter for Structured Files/Simple Web interface                    | No                              |
| Unicorn, SQL Database   | Singapore | PI Adapter for RDBMS  | No                              |

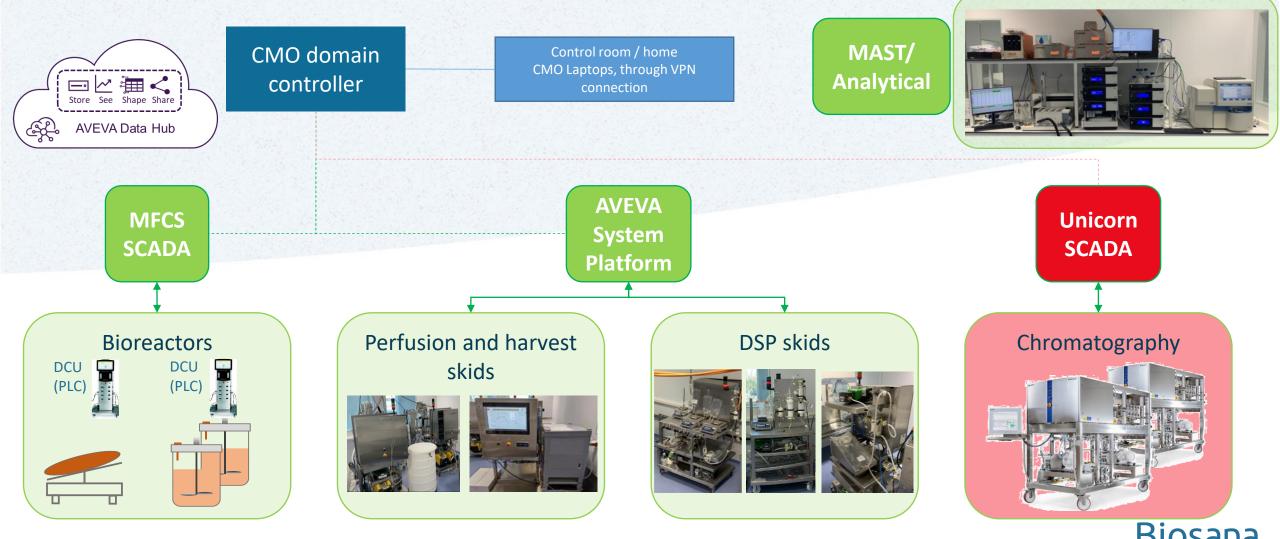


# Data Sources, Netherlands Manufacturing Site

| Source System   | Location | Protocol  | In scope for Lighthouse project |
|---|----------|---|---------------------------------|
| AVEVA System Platform Historian<br>2020R2 (Backup)                      | Leiden   | Backup SPH Server – PI Connector<br>for Wonderware – PI Server – PI to<br>ADH | Yes                             |
| Unicorn (Backup), SQL Database  | Leiden   | PI Adapter for RDBMS  | No                              |
| MFCS 3.1 (Backup) – CSV Files   | Leiden   | PI Adapter for Structured Data Files  | Yes                             |
| Novaflex 2 – CSV Files  | Leiden   | PI Adapter for Structured Data Files  | Yes                             |
| ThermoFisher HPLC – tbd<br>- HPLC Data Analytics<br>- Chromatogram data | Leiden   |   | No                              |
| MAST Sampling System, tbd   | Leiden   |   | No                              |
| Offline data (Lab) – CSV/Manual data                                    | Leiden   | PI Adapter for Structured Data<br>Files/Simple Web interface                  | No                              |



# Data Flow – Halix Manufacturing Site



<sup>19</sup> \* Data was imported into AVEVA Data Hub from back-ups due to GMP restrictions

# AVEVA Data Hub – Bringing in data from everywhere

| AMBR_SP_2.ambr 250.Bioreactor 12.CER - unnormalized, integrated  | AMBR_SP_2.ambr 250.Bioreactor 12.CER - unnormalized, integr  |
|--|--|
| AMBR_SP_2.ambr 250.Bioreactor 12.CER - unnormalized              | AMBR_SP_2.ambr 250.Bioreactor 12.CER - unnormalized          |
| AMBR_SP_2.ambr 250.Bioreactor 12.CER - integrated                | AMBR_SP_2.ambr 250.Bioreactor 12.CER - integrated            |
| AMBR_SP_2.ambr 250.Bioreactor 12.CER                             | AMBR_SP_2.ambr 250.Bioreactor 12.CER                         |
| AMBR_SP_2.ambr 250.Bioreactor 12.Cell viability                  | AMBR_SP_2.ambr 250.Bioreactor 12.Cell viability              |
| AMBR_SP_2.ambr 250.Bioreactor 12.Cell density                    | AMBR_SP_2.ambr 250.Bioreactor 12.Cell density                |
| AMBR_SP_2.ambr 250.Bioreactor 12.Cap off                         | AMBR_SP_2.ambr 250.Bioreactor 12.Cap off                     |
| AMBR_SP_2.ambr 250.Bioreactor 12.Calcium                         | AMBR_SP_2.ambr 250.Bioreactor 12.Calcium                     |
| AMBR_SP_2.ambr 250.Bioreactor 12.Bleed volume removed from biore | AMBR_SP_2.ambr 250.Bioreactor 12.Bleed volume removed fro    |
| AMBR_SP_2.ambr 250.Bioreactor 12.Bleed total volume_SP           | AMBR_SP_2.ambr 250.Bioreactor 12.Bleed total volume_SP       |
| AMBR_SP_2.ambr 250.Bioreactor 12.Bleed total volume              | AMBR_SP_2.ambr 250.Bioreactor 12.Bleed total volume          |
| AMBR_SP_2.ambr 250.Bioreactor 12.Bleed to level total volume_SP  | AMBR_SP_2.ambr 250.Bioreactor 12.Bleed to level total volume |
| AMBR_SP_2.ambr 250.Bioreactor 12.Bleed to level total volume     | AMBR_SP_2.ambr 250.Bioreactor 12.Bleed to level total volume |
| AMBR_SP_2.ambr 250.Bioreactor 12.Bicarbonate                     | AMBR_SP_2.ambr 250.Bioreactor 12.Bicarbonate                 |
| AMBR_SP_2.ambr 250.Bioreactor 12.Batch name                      | AMBR_SP_2.ambr 250.Bioreactor 12.Batch name                  |
| AMBR_SP_2.ambr 250.Bioreactor 12.Base volume pumped              | AMBR_SP_2.ambr 250.Bioreactor 12.Base volume pumped          |
| AMBR_SP_2.ambr 250.Bioreactor 12.Base pulse flow on time_SP      | AMBR_SP_2.ambr 250.Bioreactor 12.Base pulse flow on time_SP  |
| AMBR_SP_2.ambr 250.Bioreactor 12.Base pulse flow off time_SP     | AMBR_SP_2.ambr 250.Bioreactor 12.Base pulse flow off time_SP |



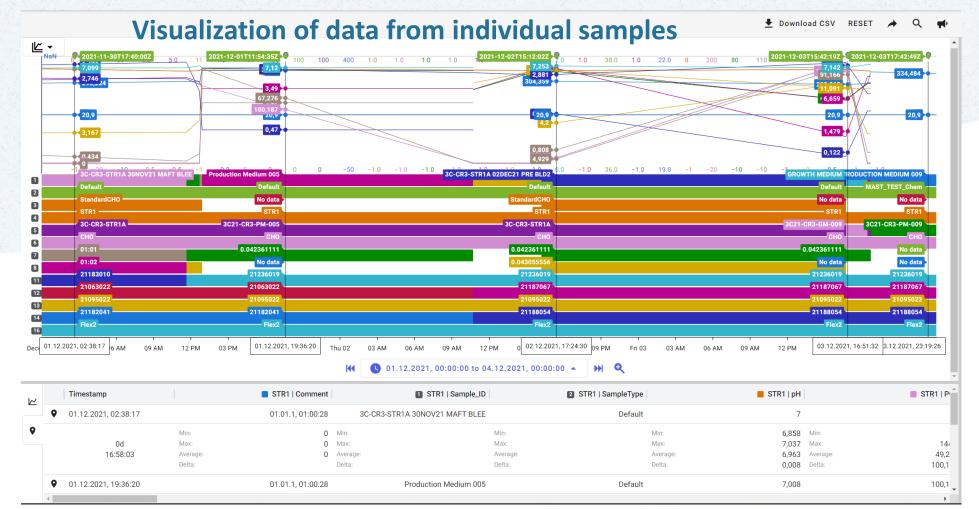
## Asset Contextualization and data visualization

Visualizationa ctoli As seats a rfr AVIE XAVIB R 2519 Bioreactor





## Data from NOVAFLEX Analyzer



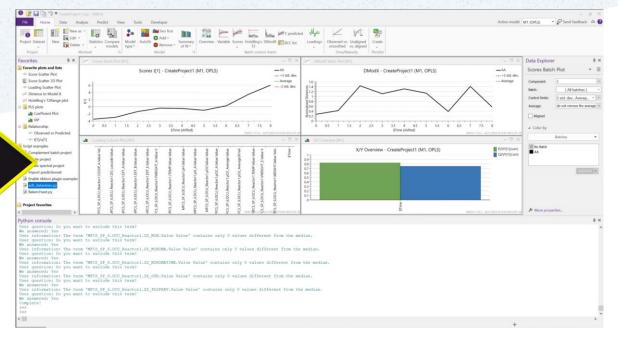


# Use Data Views to expose data to any external modeling applications, e.g. SIMCA

### Create a Data View which contextualizes data From different sources

| ame* Description<br>MBR Reactors AMBR Reactors Single                                 | apor Da | ta View Shape | e 🛛 💿 Standard 🔘         | Narrow                         |                        |                            |                         | 🏟 Manage Querie        |
|---|---------|---------------|--------------------------|--------------------------------|------------------------|----------------------------|-------------------------|------------------------|
| ilter Fields + Add 🗸  | × ↑     | +             | 🖌 Auto Refresh           |                                |                        |                            |                         | View in API Consol     |
| idex Field  |         | ^             | A Showing a pr           | eview of the first 1818 rows   |                        |                            |                         |                        |
| Timestamp   |         |               | Timestamp                | CO: (headspace) volume Value 🗿 | CO: valve open Value 0 | Crossflow cycle time Value | Dead cell density Value | D0 before offset Value |
| Index   |         |               | 28.04.2023, 00:00:00     | 38.626242274229654             | 2.997615312015048      | 17.139999389648438         | 0                       | 48.64425320142328      |
|   |         | - 1           | 28.04.2023, 00:05:00     | 38.626242274229654             | 2.9830320778488786     | 17.139999389648438         | 0                       | 48.64586795890394      |
| Grouping Fields   |         | ~             | 28.04.2023, 00:10:00     | 38.626242274229654             | 3.4843983809947794     | 17.139999389648438         | 0                       | 51.131301882549        |
|   |         |               | 28.04.2023, 00:15:00     | 38.626242274229654             | 3.4414037969076148     | 17.139999389648438         | 0                       | 52.1365651452739       |
| Name Name   | :       |               | 28.04.2023, 00:20:00     | 38.626242274229654             | 3.440767732839658      | 17.139999389648438         | 0                       | 51.4119887731431       |
|   |         |               | 28.04.2023, 00:25:00     | 38.626242274229654             | 3.8514206170077445     | 17.139999389648438         | 0                       | 52.9918764699286       |
| No More Included Fields Eligible for Grouping   |         |               | 28.04.2023, 00:30:00     | 38.626242274229654             | 4.000355998226811      | 17.139999389648438         | 0                       | 52.7599690704078       |
|   |         |               | 28.04.2023, 00:35:00     | 38.626242274229654             | 4.143332006263811      | 17.139999389648438         | 0                       | 55.419145456318        |
|   |         | - 1           | 28.04.2023, 00:40:00     | 38.626242274229654             | 4.128649108389461      | 17.139999389648438         | 0                       | 53.6882561504673       |
| Query1 Biosana  | Assets  | ^             | 28.04.2023, 00:45:00     | 38.626242274229654             | 3.9976505121248547     | 17.139999389648438         | 0                       | 52.9998349827921       |
| Identifying Field   |         |               | 28.04.2023, 00:50:00     | 38.626242274229654             | 3.942850433359539      | 17.139999389648438         | 0                       | 52.197881797069854     |
| Identifying med   |         |               | 28.04.2023, 00:55:00     | 38.626242274229654             | 3.9913080517844044     | 17.139999389648438         | 0                       | 52.89523214598697      |
|   |         |               | 28.04.2023, 01:00:00     | 38.626242274229654             | 3.9239286933605753     | 17.139999389648438         | 0                       | 53.537387505304366     |
| IdentifyingValue Acid flow rate Value Uom     Property Id - Acid flow rate   Value    | =       |               | 28.04.2023, 01:05:00     | 38.626242274229654             | 3.9819591590899948     | 17.139999389648438         | 0                       | 55.005775108517305     |
|   |         |               | 28.04.2023, 01:10:00     | 38.626242274229654             | 3.847166711696888      | 17.139999389648438         | 0                       | 53.61778179343581      |
| IdentifyingValue Acid volume pumped Val Property Id · Acid volume pumped   Value      | =       |               | 28.04.2023 01:15:00<br>4 | 38.626242274229654             | 3 848012186819008      | 17 139999389648438         | 0                       | 53 5283746336434       |
| IdentifyingValue Air (headspace) flow Valu Property Id - Air (headspace) flow   Value | =       |               |                          |                                |                        | Iterr                      | s per page: 50 v 1      | - 50 of 1818 < >       |

### Consume data through REST API of ADH using Python module in SIMCA





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OCTOBER 23, 2023

# Insilico tools for optimization of a continuous bioprocess

Determining optimal feeding strategies

Chris McCready

Sartorius Corporate Research | Advanced Data Analytics



## Bioreactor Scaling – The Challenge

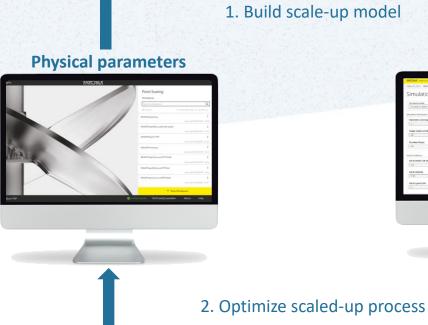




# **Physical Parameters Versus Metabolic Behaviour**

## **Bioreactor Specific**

- Transfer recipe between scales
- Verify recipe for scale
- Reproducibilit y and stability of scale and ranges
- Scaling error assessment



#### 1. Build scale-up model

#### Metabolic behavior



### Hardware Independent

- Adjusting process parameters and feeds to optimize process
- Consider during simulation how clones behave in bigger/ smaller scales
- Selecting best cell-lines for intensification and robust scaling



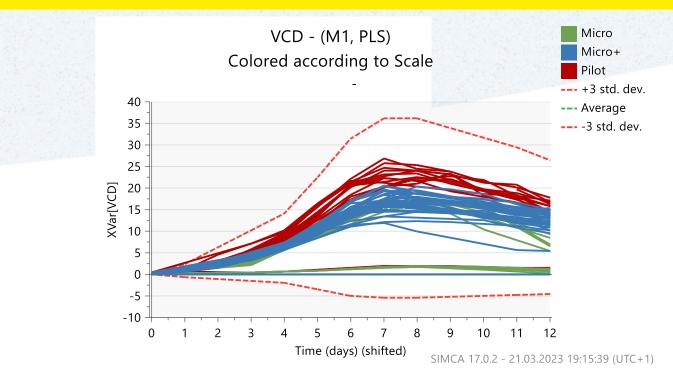
# The Data Set

## Data scale: compromises three different scales

- Micro: Ambr15
- Micro+: Ambr250
- Pilot: 2-2000L

## Data scale: compromises 10 variables

- From cell counter
- From metabolite analyzer





#### Step 1: Investigate raw data for obvious errors or strange behavior

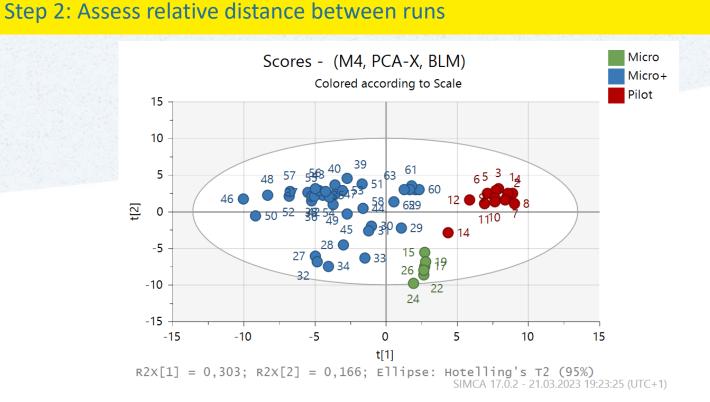
# The Difference Identification Plot

## **Condense data with PCA**

- Each process represents one batch
- Each dot represents all data for that batch
- The closer the dots together the more similar they are

## **Key observation**

- Separation according to scale
- Micro+ more scattered compared to pilot
- None of the Micro+ runs is overlapping with pilot group





# The Problem Understanding Plot

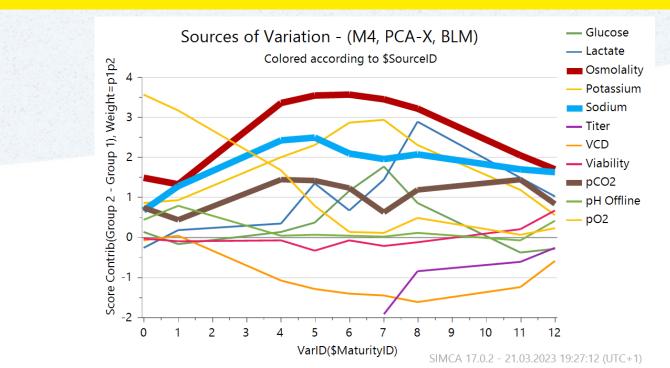
## Use of contribution plot

- Each line represents a parameter
- The further away from the X-Axis the stronger is that parameter contributing to the before observed difference

## **Key observation**

- Sodium and pCO2 are higher in the Micro+ scale.
- Both are used for pH control and can point towards problems with pH controller in small scale

### Step 3: Identify the difference





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# Hybrid Cell Culture Model

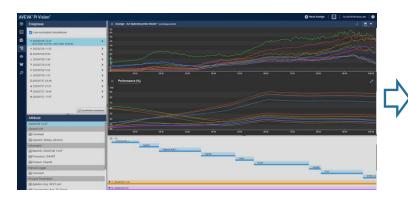
## Combining mechanistic and data driven modeling

#### Purpose

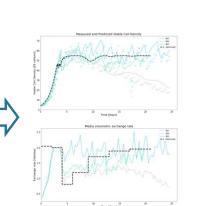
- Calibrate a model to predict process operation
- Determine feeding strategy to optimize product
   Opportunity
- Wet-lab experiments are time consuming
- Digital simulations to enhance lab results

#### **Process drivers**

- Feeding (perfusion) rate drives cell behaviour
- Removal of accumulated toxins and inhibitors



Simulation model

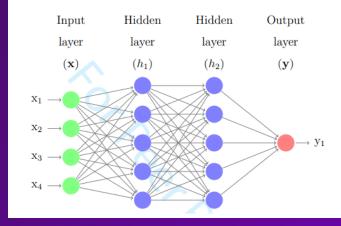


#### Mechanistic model of cell growth

Kinetic model containing known phenomena

| • $\frac{d x_{vcd}}{dt} = \left(\mu_{eff} - u_{death} - \frac{F_{bleed}}{V}\right) x_{vcd}$           | Umax         0.447214           kd         0.0349892           kt         0.00529552 |
|---|--|
| • $\frac{d x_{dead}}{dt} = u_{death} x_{vcd} - \left(k_{lyse} + \frac{F_{bleed}}{V}\right) x_{dead}$  | kl 0.842443<br>inh 33.4254   |
| • $\frac{d x_{lyse}}{dt} = \mathbf{k}_{lyse} x_{dead} - \frac{(F_{harvest} + F_{bleed})}{V} x_{lyse}$ | $ ightarrow { m Tracking}$ of lysed cells  |
| • $\frac{d\varphi_{bio}}{dt} = k_{inh} x_{vcd} - \frac{(F_{harvest} + F_{bleed})}{v} \varphi_{bio}$   | → Tracking of inhibitory<br>biomaterials   |
| • $\mu_{eff} = \mu_{max}  \theta_{sub}  \theta_{inh}  f(T, pH,)$                                      | ightarrow Growth modifications   |
| • $\mu_{death} = k_{death} + k_{toxic} x_{lyse}$  | ightarrow Accumulation of toxins   |
| • $\theta_{inh} = rac{1}{\left(rac{arPhi_{bio}}{2  k_{inh}} ight)^3 + 1}$                           |  |
| • $\frac{d \Phi}{dt} = k_{\Phi} x_{vcd} - \frac{(F_{harvest} + F_{bleed})}{V} \Phi$                   | ightarrow Product material balance   |
| • $\mathbf{k}_{\Phi} = f_{ML}(F, T, pH, glc, lac,, \varphi_{bio}, x_{lyse},)$                         | ightarrow ML model of productivity   |
| - Six coefficients: $\mu_{max}$ , $k_{death}$ , $k_{lys}$   | $_{e}$ , $k_{toxic}$ , $k_{inh}$ , $k_{\Phi}$  |

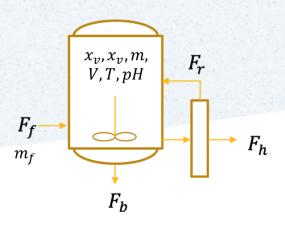
### ML model of productivity (yield)







Removal of



**Perfusion bio-process** 

# **Model Identification**

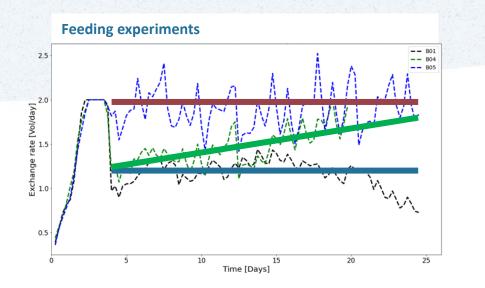
Calibrating a model to predict cell growth and product production from process operation

## **Process drivers**

Feeding strategy

31

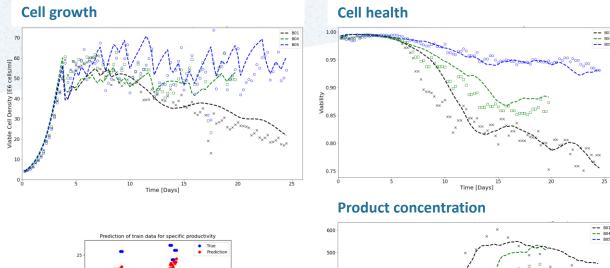
Process conditions (temperature)

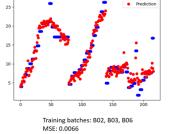


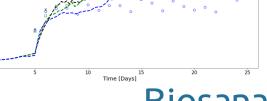
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## **Process performance**

Growth, health and productivity







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# **Process Optimization**

Determine feeding strategy to maximize product yield

## **Optimization details**

 An optimizer was used to determine feeding at select times throughout the batch

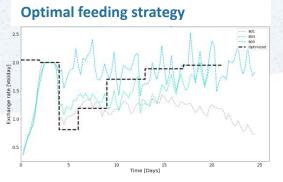
## Objective

Maximize product collected

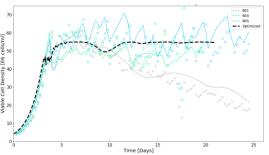
# Take-away findings (process understanding)

- Accumulated toxins are related to cell diameter
- Cell diameter (stress) correlated with productivity
- Optimal result when balancing "cell stress" with cell health

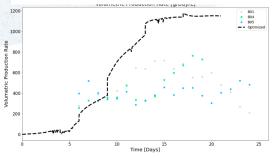
## Results



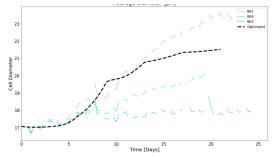
#### Cell growth



#### Product production rate



#### Cell health | stress





# Thank you. Acknowledgements:

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#### **AVEVA:**

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