# SVILVER

### Simplifying Progress

# Putting the "D" in CDMO with Data Analytics and Ambr®

Tiffany McLeod

Kevin McHugh



# Agenda

- Market Trends & Analysis
- CDMOs Pursuing QbD
- Technologies that Can Accelerate Process Development at CDMOs
  - Ambr<sup>®</sup> Systems Overview
- Why Ambr<sup>®</sup> and Data Analytics?





#### 

# Biopharmaceutical CDMOs: Distribution of Biologics by Operations



#### **INTER-SCALE DISTRIBUTIONS**

Roots Analysis, Biopharmaceutical Contract Manufacturing Market (3<sup>rd</sup> Edition) 2019-2030 (2019)

 Lab and Clinical operations make up a majority of the CDMO operations

•

57% of lab scale, 56% of clinical scale operations have been occupied by vaccines, antibodies, and proteins and peptides



#### Bioprocess Development Technology Trends

In-Silico Experimentation This disruptive technology influencing all industries including Pharma and Biotech and the hype is real. In-silico-based tools are part of drug targeting, screening and discovery, clinical studies and predictive analytics related to any risk involved.

High-throughput Process Development Involves the miniaturization, automation, and parallelization of process development activities – proving for a systematic approach for time- and resource-efficient workflow.

Continuous Bioprocessing The intensification of both upstream and downstream operations will requires higher levels of control during PD and presents new scale-up challenges.



#### Bioprocess Development Technology Trends

In-Silico Experimentation



High-throughput Process Development





Continuous Bioprocessing







### Agenda

- Market Trends & Analysis
- CDMOs Pursuing QbD
- Technologies that Can Accelerate Process Development at CDMOs
  - Ambr<sup>®</sup> Systems Overview
- Why Ambr<sup>®</sup> and Data Analytics?





# Why Regulatory Agencies are Pushing Quality by Design (QbD)



"QbD means designing and developing manufacturing processes during the product development stage to consistently ensure a predefined quality at the end of the manufacturing process." ICH Q10, FDA 2006



Ę

#### 

# Why Should CDMOs Have Strong QbD Packages?





#### 

### How Can CDMOs Develop Strong QbD Packages?





### Agenda

- Market Trends & Analysis
- CDMOs Pursuing QbD
- Technologies that Can Accelerate Process Development at CDMOs
  - Ambr<sup>®</sup> Systems Overview
- Why Ambr<sup>®</sup> and Data Analytics?





# Fully Scalable Range of Single-Use Bioreactors from 15 mL to 2000 L

Following Conventional Stirred Tank Design Principles







## Ambr® 15 Cell Culture



More representative



Predictive



- Clone selection
- Media and feed screening
- Early process optimization
- Batch, fed-batch and perfusion mimic



- Transient transfection studies
- Mammalian and insect cell lines
- Suspension cell lines and adherent cell lines on microcarriers (e.g 293, Vero)
- Applications ranging from recombinant protein vaccines to viral vectors and mRNA



# Ambr<sup>®</sup> 15 Generation 2 Workstation Features and Functionality





#### Enabling Simple Consistent Clone/Strain Selection

| Ambr® Clone Se<br>Powered by Umetrics® | election          |                          |                    |           | S٨    | ะบาร                           |               |                              |                      | IMO <b>В</b>       |
|--|-------------------|--------------------------|--------------------|-----------|-------|--------------------------------|---------------|------------------------------|----------------------|--------------------|
| Project 1                              |                   |                          |                    |           |       |                                |               |                              | Select               | filter profile 🔻 📳 |
| n PROJECTS Data Management             | nt                |                          | Process Data       |           |       | Quality Data                   | 3             | Clone Selection              |                      | Bepart             |
| CRITERIA FILTER                        | 1                 | 🔻 rebro betroqu          | CLONE RANKIN       | IG (22) G | oup 🔻 | CLONE/VARIABLE PLOT            |               |                              |                      | I                  |
| Viability [%] (Last)                   | laximise <b>V</b> | <u>1 (Hgh)</u>           | Reference<br>CS1-1 |           | *     |                                | 2             |                              |                      |                    |
| 50                                     | 88.89             |                          | Qualified (21)     |           |       |                                |               |                              | · ·                  |                    |
| 0                                      |                   |                          | C81-11             | 0.183     |       | : :                            | 1             |                              |                      | -                  |
| Product (g/L) (Last)                   | Labimise V        | <u>1 (4 gh)</u> <b>T</b> | • CS1-12           | 0.232     | 12    |                                |               | 1                            | :                    |                    |
|  |                   |                          | CS1-7              | 0.223     |       |                                |               |                              | 8                    |                    |
| 0                                      |                   |                          | CS1-3              | 0.262     | 124   | Kabiba W.M. anti Destination 1 | Natural       | B<br>INTO IEE/and 1 Enternal | Channel (all 1 d and | Lastite of Cart    |
| Distance 1.                            | taximise <b>v</b> | 1 (H (ph) V<br>35.3233   | 0 051-6            | 0.260     |       | wasiek (scheren) - Honner Bird | litradi menun | Act learned learning         | arroad Bell front    | carrain dir (rasi) |
|  | _                 |                          | C83.9              | 0.295     | - H.  |                                |               |                              |                      |                    |
| VCD [ES/mL] (Integral)                 | arget 🔻           | 1 (H gh) 🔻               | 6 (81.2            | 0.314     | - 84  | RAW DATA - VCD [E5/ML]         |               |                              |                      | VCD (E5/mL)        |
| 381,4787                               | 95.7720           | 1550.065                 | C51-10             | 0.315     | - 11  |                                |               |                              |                      |                    |
| 0                                      | _                 | O                        | C 52-8             | 0.325     |       | 200                            |               |                              |                      |                    |
| Glucose (u/L) (Leat)                   | vazimize 🐨        | 1(1(4))                  | C82-12             | 0.959     |       | 150                            |               | 1.                           | -                    | ~                  |
| 0                                      | 1.35              | 127                      | CS1-5              | 0.366     |       | 100                            |               |                              |                      |                    |
|  |                   |                          | • C52-9            | 0.367     |       |                                |               |                              |                      | -                  |
| Lactate (g/L) (Last)                   | taximise 🔻        | <u>104gh) 🔻</u>          | C82-7              | 0.380     |       | 50                             |               |                              |                      |                    |
| 0.05                                   | .81199            | 3.874                    | GS2-6              | 0.396     |       | 0                              |               |                              |                      | 10                 |
|  | -                 | 0                        | CS2-1              | 0.455     |       | 0 2                            | •             | 0                            | , 10                 | 12                 |
| Construction of Armon                  |                   |                          |                    |           |       |                                |               |                              |                      | DAOK               |
|  |                   |                          | -                  |           |       |                                |               |                              |                      | BACK               |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |
|  |                   |                          |                    |           |       | _                              |               |                              |                      |                    |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |
|  |                   |                          |                    |           |       |                                |               |                              |                      |                    |

Currently the selection of the top clones or strains is performed upon visual inspection of specific quality parameters or one number readout (e.g. max titre or IVCC)

The selection process is user dependent and the full power of using all available data with a balanced tool to give a robust priority selection is **not fully utilized** 

Achieve a **better** and **more robust** clone selection in a **standardized** way using a balanced priority of CQA's



# Ambr<sup>®</sup> 250 High Throughput: the Fast Track to Intensified Cell Culture Process Development

This next-generation bioreactor system can enable and enhance your perfusion process development in these key areas:

- Reduce complexity and setup time with single-use perfusion bioreactors
- Increase experiment capacity and data consistency with a fully automated parallel system
- Gain predictive, scalable results with the industry standard Ambr® 250 bioreactor
- Increase cost effectiveness due to media and labor cost savings
- Improve development timelines and performance with larger studies and perfusion DoE







#### Ambr<sup>®</sup> 250 High Throughput Workstations



**SVILOTEVS** 

## Ambr<sup>®</sup> 250 High Throughput Vessels





# Ambr<sup>®</sup> 250 High Throughput Perfusion Option- Key Features

- Fits into the existing footprint of a standard ambr®250 high throughput system
- Fully capable of operating in either fed-batch or perfusion modes
- ATF & TFF consumable includes a single-use perfusion filter and single-use pump chambers
- Includes a high efficiency sparger for enhanced oxygen transfer and capable of supporting high cell densities
- Single-use bleed and permeate bags
- Medium exchange of 0.5 4 VVD
- Integrated automation





#### Ambr<sup>®</sup> 250 Modular System

#### Single-Use Vessel



Integrated off-gas analyzers available for  $CO_2$ , and  $O_2$  Measurement, as well as OUR, CER, and RQ calculation –

#### Workstation

Variable speed 'x pump' allows for flexible use and quick reactor harvesting.

Simple and efficient pH and gassing, and agitation connections





#### Easily Develop Advanced Control Strategies

- Flexible Control Strategies:
  - Setpoints can be based on a value, equation, profile, or even OPC input.
  - Not just for pumps but also process parameters
- Easy to use Triggers
  - Variety of options available to easily automate the transition between phases of a process
- Flexible Control Loops:
  - Any process parameter or calculated value can have a setpoint and an output can be assigned to control it
  - Implement advanced control strategies like DO-Stat in just a few clicks
- Calculated Variables
  - Equations can be developed to calculated values based on various sensors and inputs
  - Can be used as triggers, controlled variables & PID terms

|                              |                                |  |  |   |  |                                   |   |                | Earl step parameters   |         |           |  |
|------------------------------|--------------------------------|--|--|---|--|-----------------------------------|---|----------------|--|---------|-----------|--|
|                              |                                |  |  |   |  |                                   |   |                | Start pump running and set the profile for the pump                    |         |           |  |
| Edit E                       | cpressio                       | 'n   |  |   |  |                                   |   |                |  |         |           |  |
| OU                           | R /('Calo                      | cKla_(   | Cstar' - 'CalcKla_   | C_Bro   | oth')  |                                   |   |                |  |         |           |  |
| 0                            | Expres                         | sion   | is valid   |   |  | d functions. Trackate succession  |   |                | If the result of the expression is unknown (NaN)<br>return 0 instead   | s unkn  | own (NaN) |  |
| Standard operators Variables |                                |  |  |   | riables  |                                   | Select variables to show : Common    Search terms |                |  |         |           |  |
|                              | с                              | CE   | ()   | A   | cid cal  | c. bolus volume Acid flow rate A  | cid volume pumped Acid volume since reset Air co  | rrection facto | tor Air flow Air volume Antifoam calc. bolus volume Antifoam flow rate | earch t | terms     |  |
|                              | 7                              | 8  | 9 +  | A   | Antifoam volume pumped Antifoam volume since reset Audit Base calc. bolus volume Base flow rate Base volume pumped Base volume since reset Cap off CER CER - integrated w rate |                                   |   |                |  |         |           |  |
|                              |                                |  |  | C   | ER (sin  | nple) Clamp plate temperature     | DO DO.SP Errors Feed#1 calc. bolus volume Feed    | i#1 flow rate  | e Feed#1 volume pumped Feed#1 volume since reset                       | - integ | jrated    |  |
|                              | 4                              | 2  | 0 -  | Fe  | eed#2  | calc. bolus volume Feed#2 flow ra | The Feed#2 volume pumped Feed#2 volume since r    | eset Feed#     | #3 calc. bolus volume Feed#3 flow rate Feed#3 volume pumped            |         |           |  |
|                              | Edi                            | t cu   | stom variab  | variable 'CalcKla_kla' ed Feed#4 volume since reset   Gas flow (Air/mio,SP  Liquid handling |  |                                   |   |                |  |         |           |  |
|                              | E                              | dit  | has calculations suppressed (Off-gas LOAK) Off-gas LOAK) Off-gas LOAK) Off-gas LOAK (Off-gas LOAK) Off-gas LOAK) Off-gas LOAK) Off-gas LOAK (Off-gas LOAK) Off-gas LOAK) Off-gas LOAK) Off-gas LOAK (Off-gas LOAK) Off-gas LOAK) O |   |  |                                   |   |                |  |         |           |  |
|                              | Ecut paraliteters for variable |  |  |   |  |                                   |   |                |  |         |           |  |
|                              |                                |  | Property   | y Edit loop 'kLa' controlling CalcKla_kla.SP  |  |                                   |   |                |  |         |           |  |
|                              |                                | Description     Parameters for a set of cascaded PID loops. Create, reorder and delete the individual PID loops in the cascade     New Cascade |  |   |  |                                   |   |                |  | scade I | Level     |  |
|                              |                                |  | Descriptio   |   |  | Property                          | Value   |                |  |         |           |  |
| how                          |                                |  |  |   |  |                                   |   |                |  |         |           |  |
| 110 10                       |                                |  | Axis title   |   |  | Description                       | kla   |                |  |         |           |  |
| Timin                        |                                |  | Units  |   |  | Level 1 - Stir speed              | Lin Dowr  | Delete         |  |         |           |  |
| Expe                         |                                |  | Display to   |   |  | Output                            | Stir speed  | Delete         |  |         |           |  |
| If co                        |                                |  | Maximum  |   |  | Effect of output                  | Increases controlled variable                     |                |  |         |           |  |
| Maxi<br>Claus                |                                |  | Has set po   |   |  | Dead band                         |   |                |  |         |           |  |
| Num                          |                                |  | is calculat  |   |  | Minimum (rpm)                     | 800   |                |  |         |           |  |
| Cond                         |                                |  | Expression   |   |  | Maximum (rpm)                     | 4500  |                |  |         |           |  |
| Expr                         |                                |  | Driority   |   |  | Proportional Term - kD            | 10  |                |  |         |           |  |
| Com                          |                                |  | When to  |   |  | Dorivativo Timo - +D (c)          | 0   |                |  |         |           |  |
| Com                          |                                |  | when to o  |   |  | Derivative rime - tD (s)          | 100   |                |  |         |           |  |
| Dela                         |                                |  | Suppress   |   |  | Integral Time - tl (s)            | 100   |                |  |         |           |  |
| Show I<br>Show I             |                                |  |  |   |  | Show bioreactors Load d           | lefaults   Save defaults Clear o                  | verrides       | Ok   | Canc    | el        |  |

Edit step parameter



#### High Throughput Upstream Process Characterization Platform Development– Cost and Time Saving Comparison With Traditional Approach



Ambr<sup>®</sup> 250 – 24 Vessel Configuration

Ę

**SVIPCTEV3** 

# Scalable, Automated At-Line and Real Time Process Monitoring and Control

Ę



**SVISCISVS** 

#### Spectroscopy Platform across Scales enabling straight-forward Model-Transfer





### Agenda

- Market Trends & Analysis
- CDMOs Pursuing QbD
- Technologies that Can Accelerate Process Development at CDMOs
  - Ambr<sup>®</sup> Systems Overview
- Why Ambr<sup>®</sup> and Data Analytics?





Ambr<sup>®</sup> and Data Analytics: The Perfect Match





#### From Data to Decisions

# Sartorius Data Analytics tools examine large amounts of data to uncover hidden patterns.





### Design, Execute and Analyze Experiments Quickly and Easily

- MODDE<sup>®</sup> Design of Experiments
   Familiar interface for defining factors and responses.
  - Functionality to automatically import setpoints and extract responses from ambr15 experiments
    Not only end point but min, max, timepoints, etc.
  - Software automatically accounts for system type (12, 24, 48 & culture station limitations)
- Experiments and Results Viewer
  - Quickly and easily explore pervious experiments and campaigns
  - Quickly generate tables and charts
  - Investigate experiment audit trails
  - Combine and visualize data from multiple experiments
- Easy to Use SIMCA<sup>®</sup> Data Export
   Quickly and easily export online and at-line sequential batch data for an experiment or entire campaign
  - Interpolate data as needed



SVIPCITS

# DOE vs MVDA for Ambr® Experiments

#### MODDE<sup>®</sup> DOE

- Media Component Screening
- Cell Line and Clone Screening
- **Bioreactor Condition Optimization**
- Feed Strategy Optimization
- **Bioreactor Characterization**
- Scale-up/down Model Development

SIMCA<sup>®</sup> MVDA

VS Bioreactor Condition Optimization Feed Strategy Optimization Spectroscopy Calibration Modeling Scale-up/down Model Verification



# Ambr<sup>®</sup> DOE Examples

#### Media Component Screening





Challenge:

- Not all commercially available media supports every cell line, therefore in some cases additional supplements must be added to improve cell performance
- The classical approach to media component screening is time consuming and laborintensive

Data Driven Solution:

- Use DOE principals to systematically screen media components for productivity effects
- Recognize interactions and define them early in the process, setting optimum levels accordingly

How to Optimize Cell Culture Media to Speed Biopharma Development, Sartorius (2018)

#### **Bioreactor Optimization and Characterization**





Challenge:

• A significant challenge for developing viral vector gene therapies is that is well characterized and can be scaled-up

Data Driven Solution

- Use DOE principals to identify which process parameters impact product quality and yield
- Justify and adjust manufacturing operating ranges control strategy and acceptance criteria

Optimization of HEK293t Suspension Cultivation with DOE-approach in the Ambr 15 Micro Bioreactor, Bollman, Riethmuller, Johansson, Tappe, R&D Regenerative Medicine, Sartorius (2019)



# Ambr<sup>®</sup> MVDA Examples

#### Spectroscopy Calibration Modeling





#### Challenge

- PAT tools can (i.e. spectral devices, advanced sensors and analyzers) generate large amounts of complex data presenting a challenge when it comes to interpreting accuracy Data Driven Solution:
- MVDA is a fast and flexible spectral calibration tool that can handle multiple types of spectral data (NIR, IR, Raman, Fluorescence, Mass-Spec)
- It provides accurate prediction models for analyte concentrations can be used to optimize monitoring and control of the culture

Comparison of Spectroscopy Technologies for Improved Monitoring of Cell Culture Processes in Miniature Bioreactors, Rowland-Jones, van den Berg, Racher, Martin, Jaques, Biotechnology Process Volume 33, Issue 2, GSK (2017)

#### Feed-Strategy Optimization



#### Challenge

- A significant challenge in cell-culture cultivation is predicting the nutritional requirements of the culture so that an appropriate feeding strategy can be implemented Data Driven Solution
- Use MVDA to identify and rank any potential inhibitors or promotors of cell-culture productivity in order to optimize feed strategy

Metabolic Control in Mammalian Fed-Batch Cell Cultures for Reduced Lactic Acid Accumulation and Improved Process Robustness, Kanokovsky, Clemens, Müller, Bechmann, Berger, Schlatter, Herwig, Boehringer Ingelheim, Vienna Institute of Technology, Bioengineering Basel (2016)





### Combining the Best of Both Worlds for Ambr® Scale-down Modeling





MVDA Multivariate Data Analysis Combine multi-objective optimization criteria (DOE) with quantitative ranking (MVDA)

Squeeze all the value from the data you have



#### DOE and MVDA for Ambr<sup>®</sup> Scale-down Modeling



DOE Establishment of Scale-down Bioprocess Models for Ambr Using Clustered Multivariate Analysis, Timo Schmidberger, Thomas Krieg, Sartorius (2020)



### DOE and MVDA for Ambr<sup>®</sup> Scale-down Modeling

- The goal in scale-down modeling is to decrease the distance between the scaled-down runs and the target scale
- To do this we can use MODDE<sup>®</sup> DOE to evaluate the length 

   and give suggestions as to how to change
   operating parameters to reduce scale difference



DOE Establishment of Scale-down Bioprocess Models for Ambr Using Clustered Multivariate Analysis, Timo Schmidberger, Thomas Krieg, Sartorius (2020)



#### DOE and MVDA for Ambr<sup>®</sup> Scale-down Modeling



DOE Establishment of Scale-down Bioprocess Models for Ambr Using Clustered Multivariate Analysis, Timo Schmidberger, Thomas Krieg, Sartorius (2020)



#### 

# DOE and MVDA for Ambr<sup>®</sup> Scale-down Modeling Method Conformation



DOE Establishment of Scale-down Bioprocess Models for Ambr Using Clustered Multivariate Analysis, Timo Schmidberger, Thomas Krieg, Sartorius (2020)



## DOE and QbD are Key for CDMO Success

"The most successful CDMOs, therefore, have identified strategies for completing process development projects efficiently and effectively while incorporating DOE and QbD approaches that provide increased process understanding and lead to optimal processes."

Greg Flyte, GSK, CMO Alliance and Program Management



Putting the "D" in CDMO with Advanced Process Development, American Pharmaceutical Review, Greg Flyte, GSK (2016)





# Visit the CDMO Landing page

www.landing.umetrics.com/en/cdmo





#### Visit Sartorius at IFPAC 2021



Join Presentation on Hybrid Modeling for Deeper Bioprocess Insight by Catalina Moreno on March 3

IFPAC 2021 Digital Event



Join Presentation on Bringing Bioprocess Digital Twins to Life by Tiffany McLeod and Chris McCready on March 1

IFPAC 2021 Digital Event



#### How CDMOs can Digitalize their Cell and Gene Therapy Processes

Join our next webinar in the CDMO Webinar Series

March 24<sup>th</sup> 4-5 PM CET | 10-11 AM EST

More Info Can Be Found on the CDMO landing page

www.landing.umetrics.com/en/cdmo





# Thank you!

Tiffany McLeod Kevin McHugh SVIDUL