

Multimodal data handling: opportunities, challenges and solutions

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Growing interest in multivariate data and analytics

Opportunities

Adaptive control

- Scale up/out
- Corrective actions
- Optimal actions

Process development

- Optimisation
- Reduce cost-of-goods
- Reduce cycle time

Rapid release

- Patient needs
- Reduce QC burden
- Real time release

Challenges

Technology
Algorithms
Knowledge
Validation

Data capture
Data processing
Data interpretation

Systems
Validation
Adoption
Review by exception

Solutions

Analytical strategies
Integration
Automation

Process analytical technologies
Multivariate data analysis

Automation
Artificial intelligence

Industry drivers

International Conference on Harmonisation (ICH) guidelines

- Bring together regulatory authorities and *pharmaceutical* industry to ensure that safe, effective, and high quality medicines are developed in the **most resource-efficient manner**.

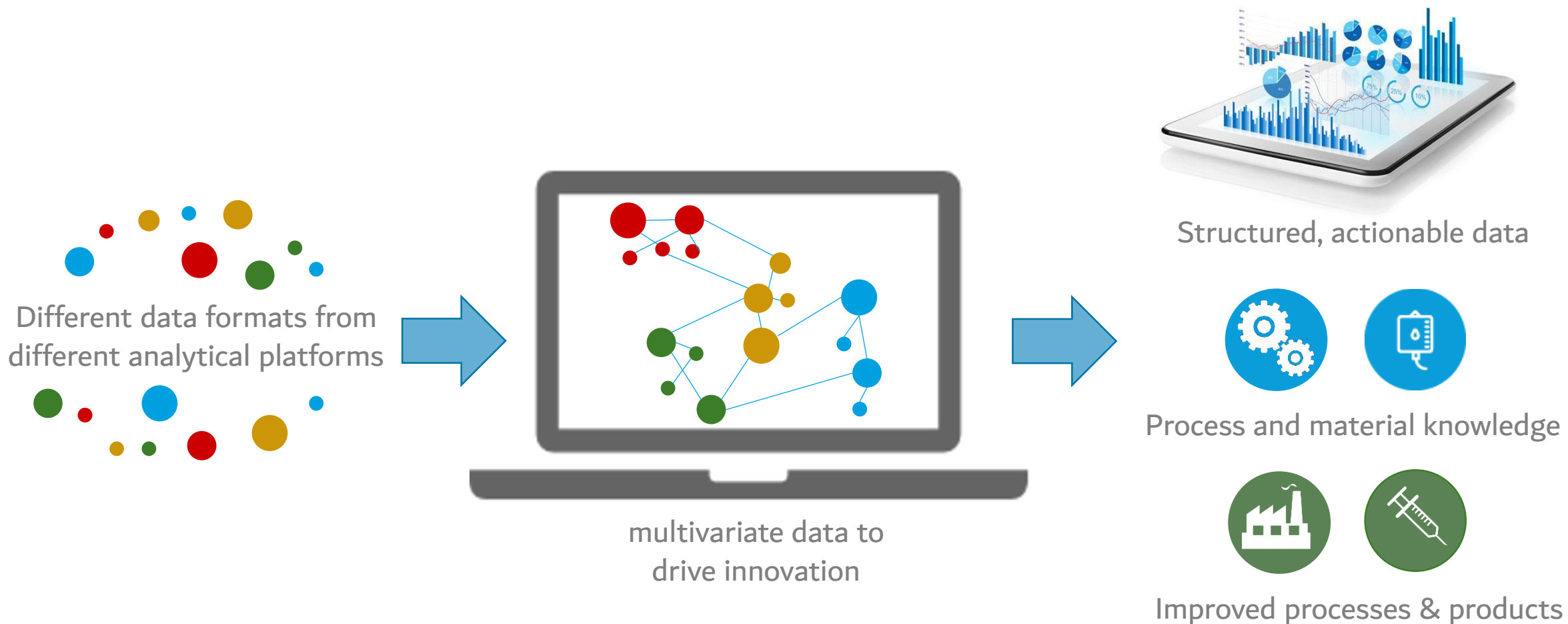
Quality-by-Design

- “A **systematic approach** to development that begins with predefined objectives and emphasizes **product and process understanding and process control**, based on sound science (ICH Q8(R2))”
- Design-of-Experiments (DoE)

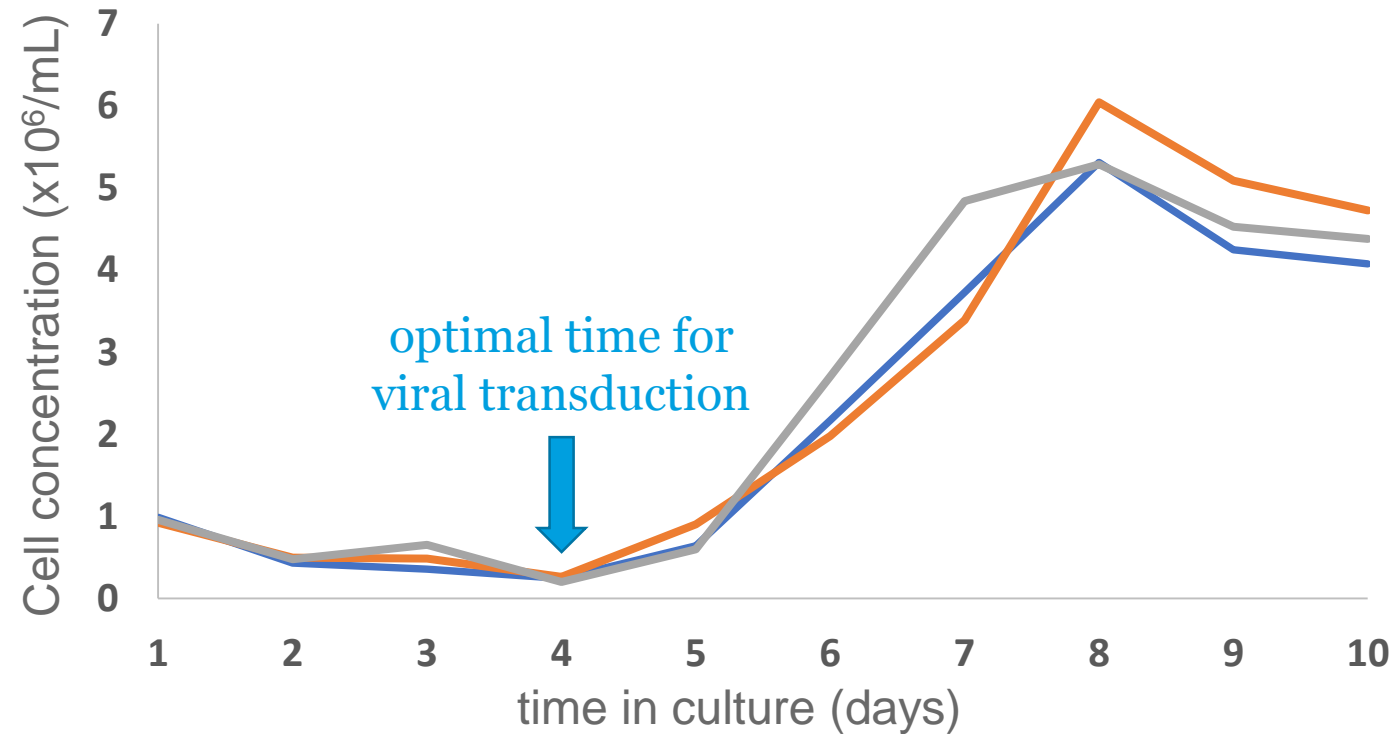
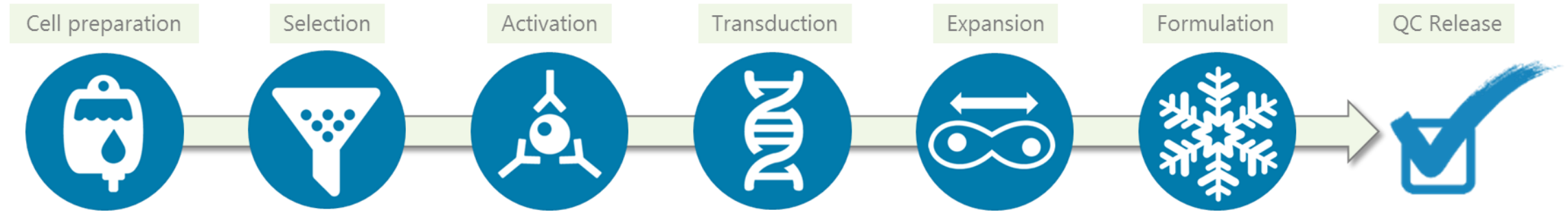
Process Analytical Technologies

- Mechanism to design, analyse, and control *pharmaceutical* manufacturing processes through the **measurement of Critical Process Parameters (CPP) which affect Critical Quality Attributes (CQA)**.
- **Multivariate data** acquisition and data analysis tools

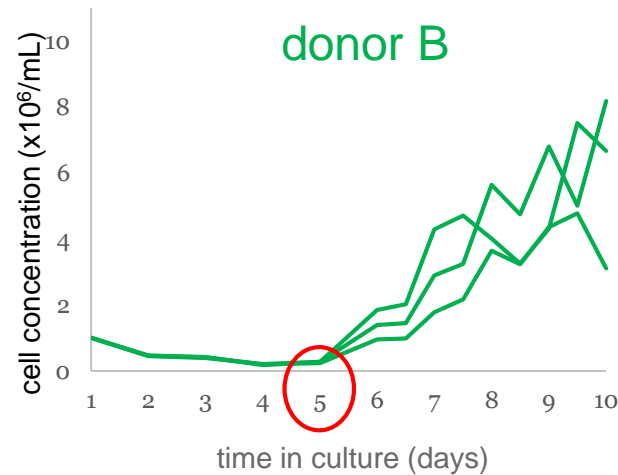
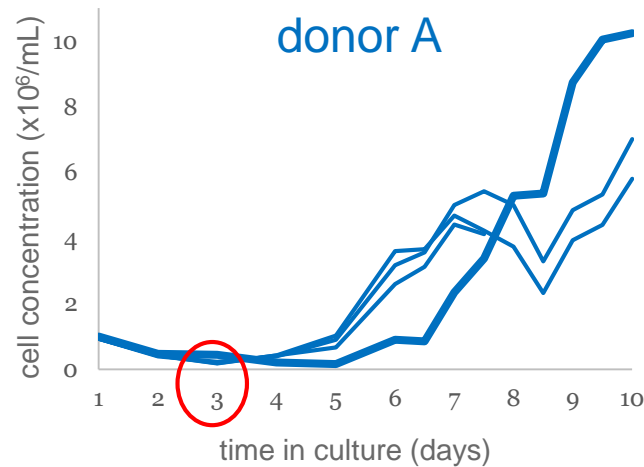
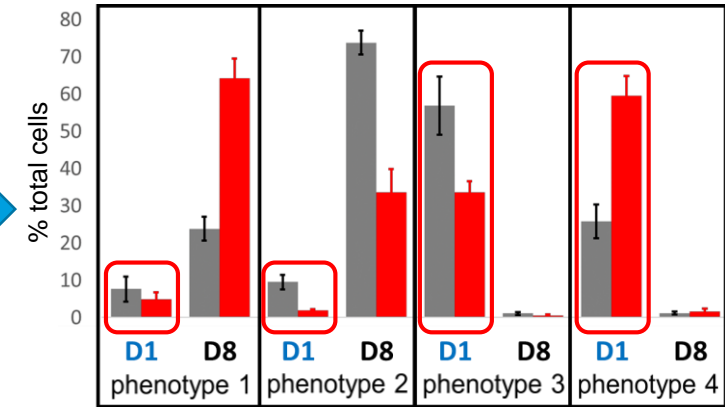
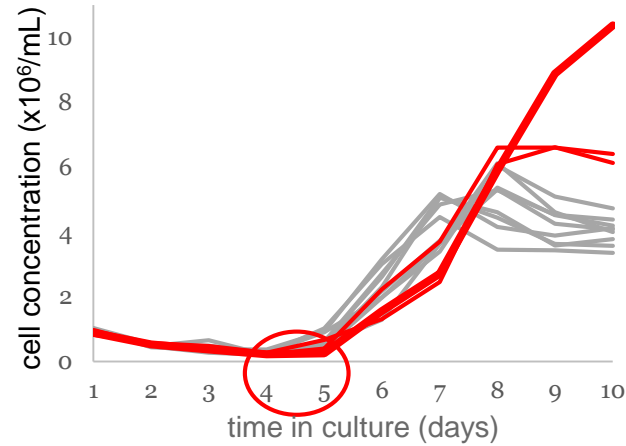
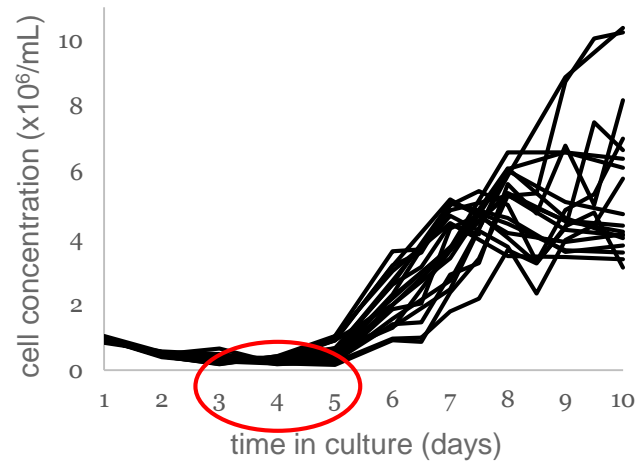
Multimodal data integration – driving process innovation



Example – monitoring immunotherapy manufacture in bioreactors



Process variability – T cell expansion with healthy donors



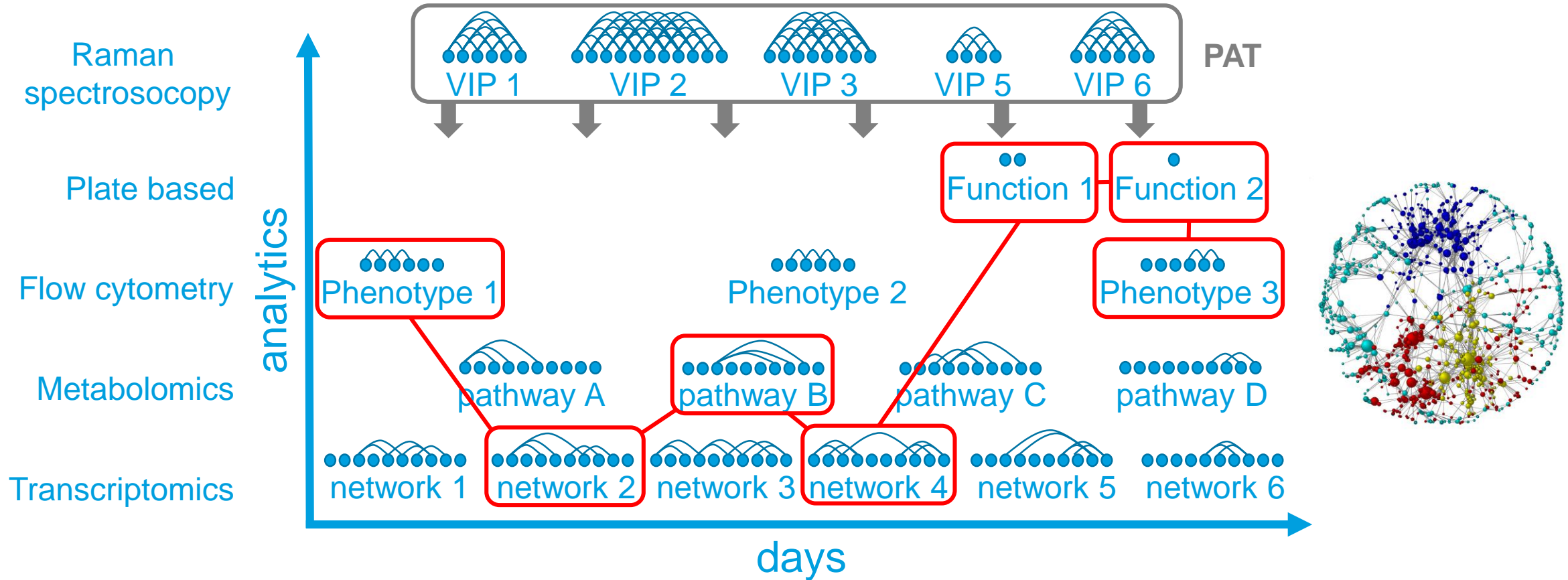
Causes of variability:

- Composition of starting material?
- Process?

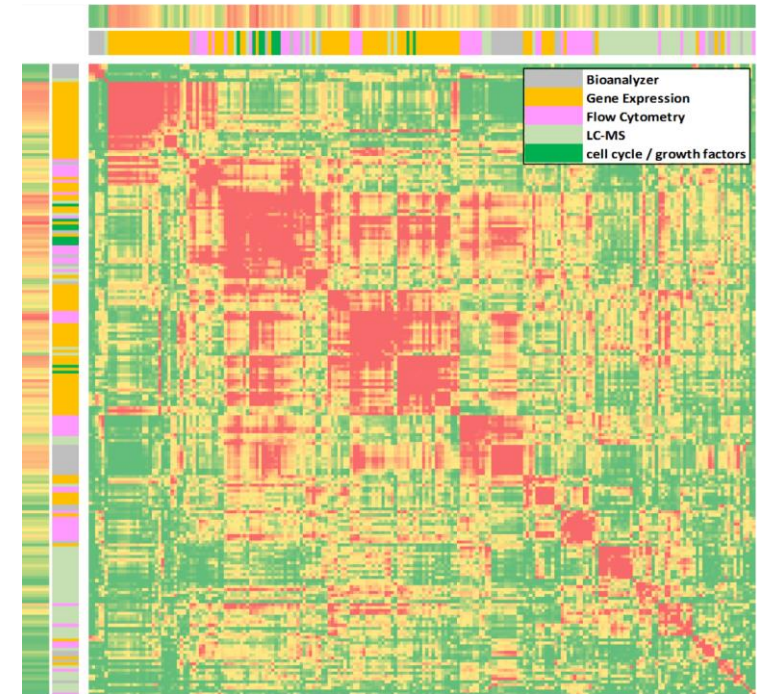
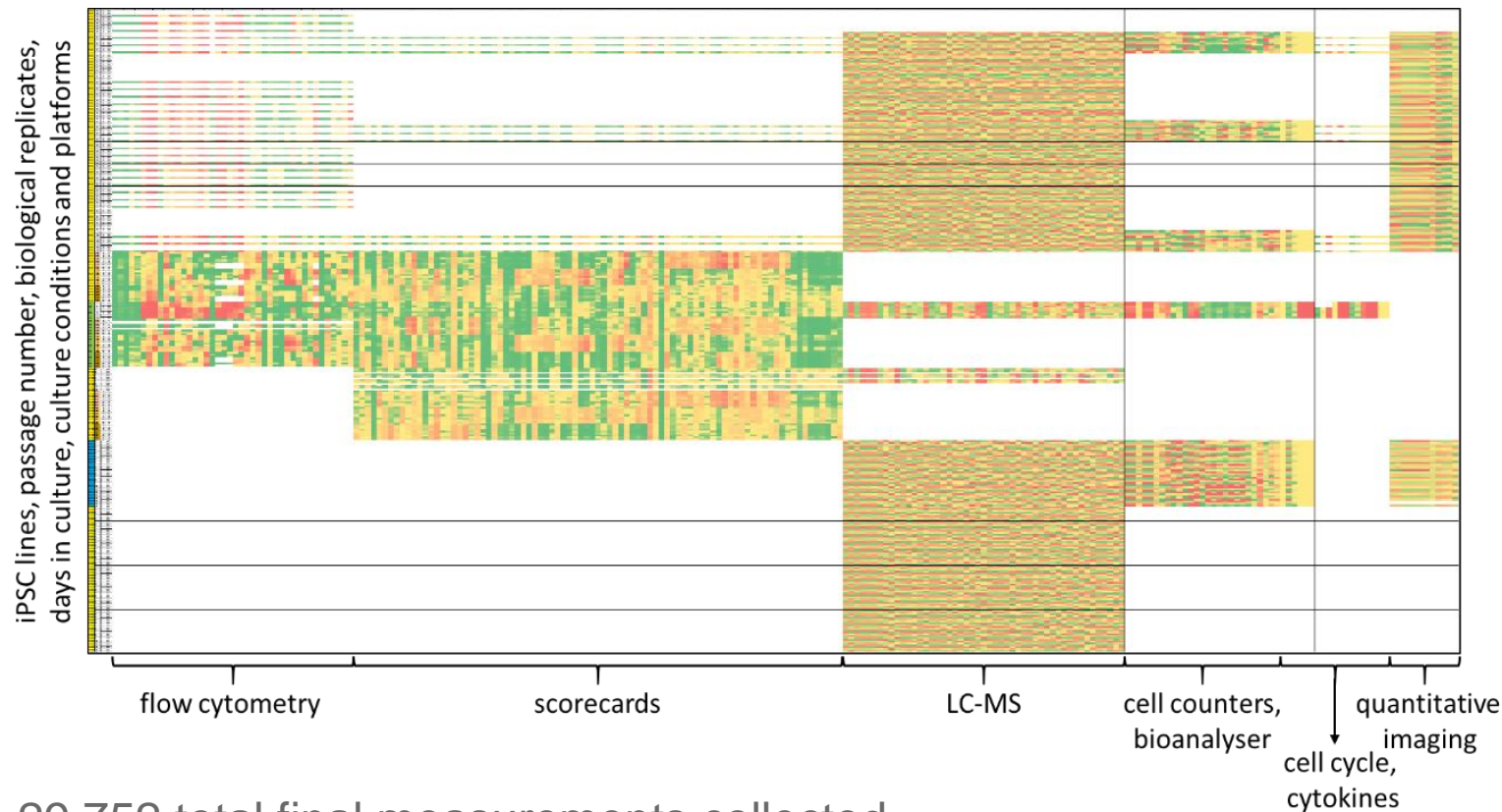
Need for in process control

What is important to measure?

Analytics available for understanding the biology in relation to the process



Data challenges for the implementation of PAT – at/off-line measurements

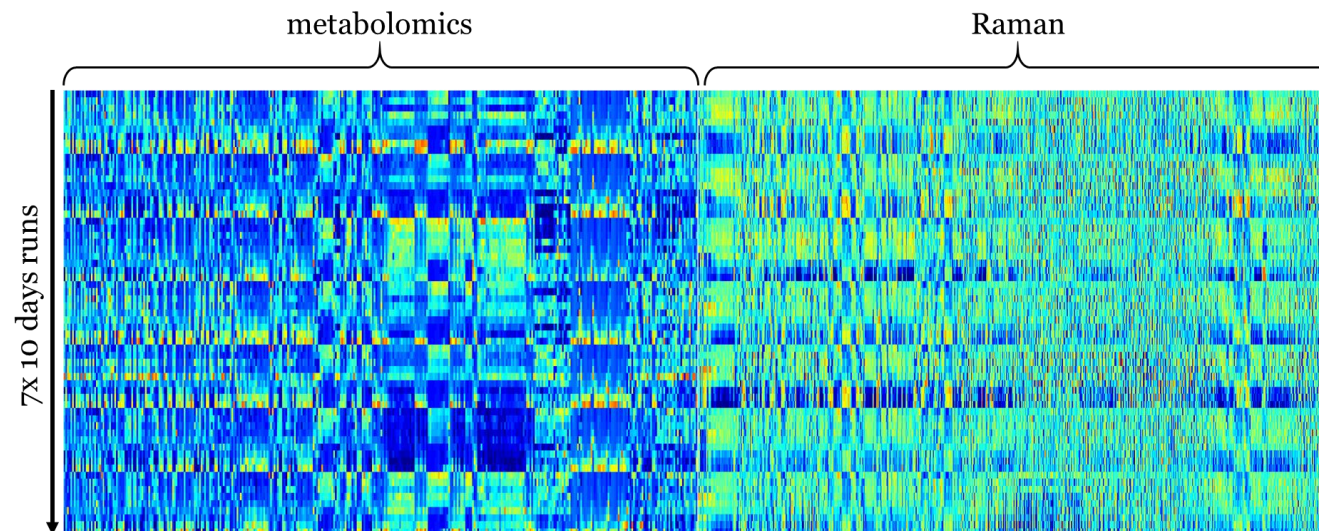
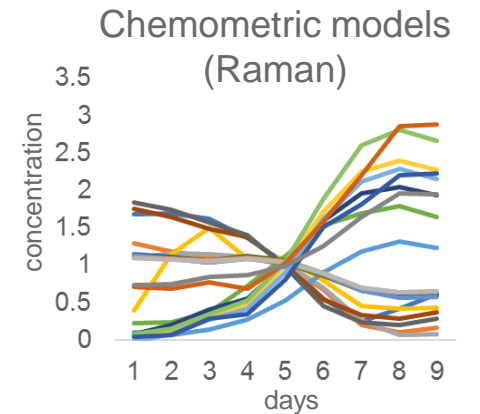
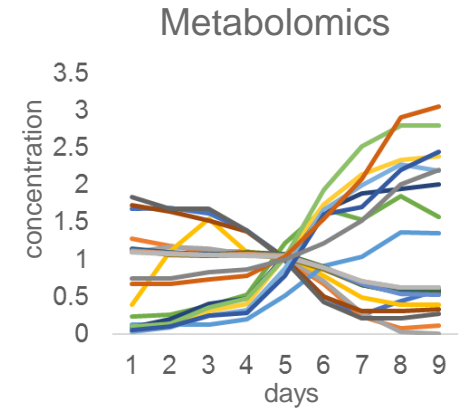
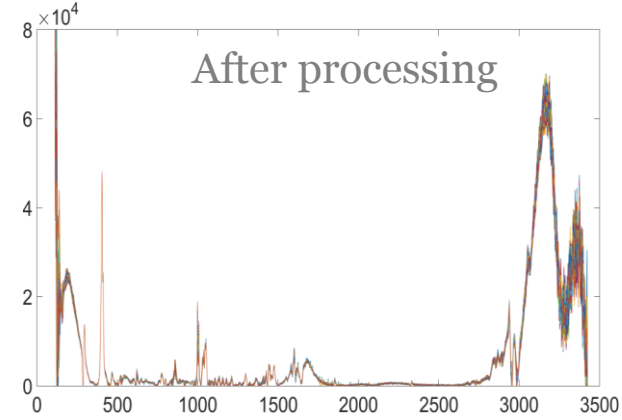
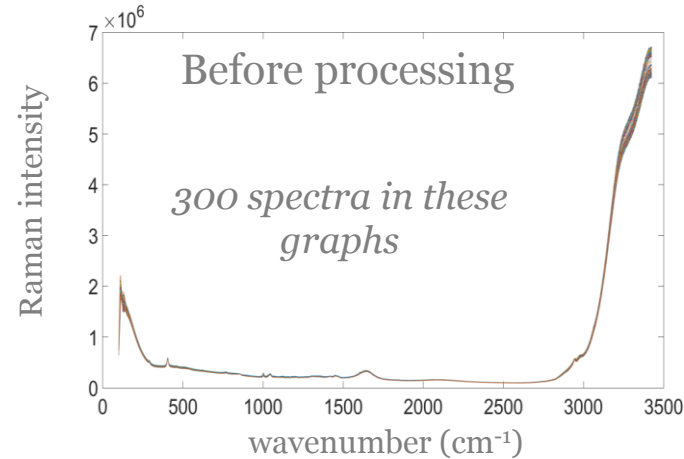
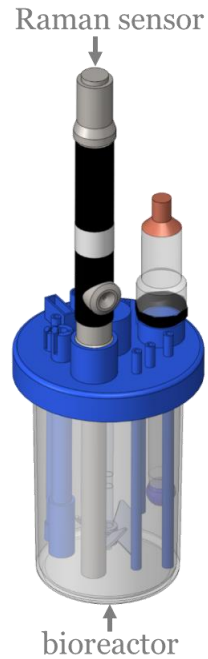


29,752 total final measurements collected

19,118 measurements retained for MVDA

- Fragmented datasets
- Missing data
- Multimodal (different types)

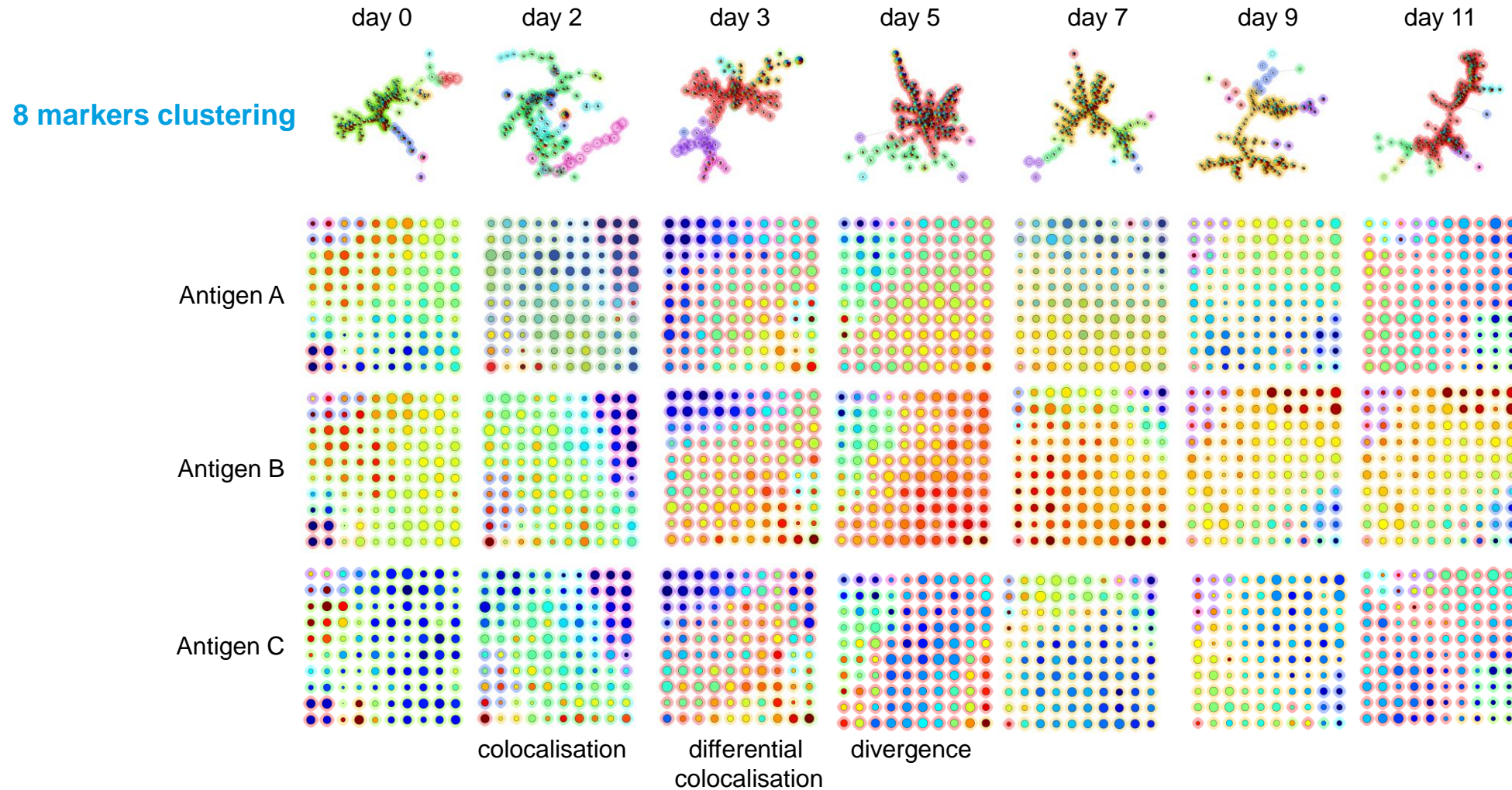
Data challenges for the implementation of PAT – at/on-line measurements



10-15 million data points

- Pre-processing
- Modelling
- Validation
- Real-time implementation

Opportunities for augmented information, unsupervised machine learning



Future looking – *In-silico* digital twin to support process improvement

In-silico modelling, process simulation, artificial intelligence



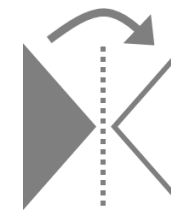
Targeted and reduced
experimentation



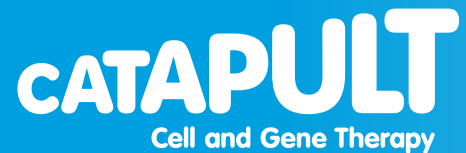
Robust, optimised
processes



Improved process
understanding



Soft sensors and
augmented reality



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**Thank you for your
attention...**

**Questions
welcomed**

