

# Automation of Pharmaceutical Production

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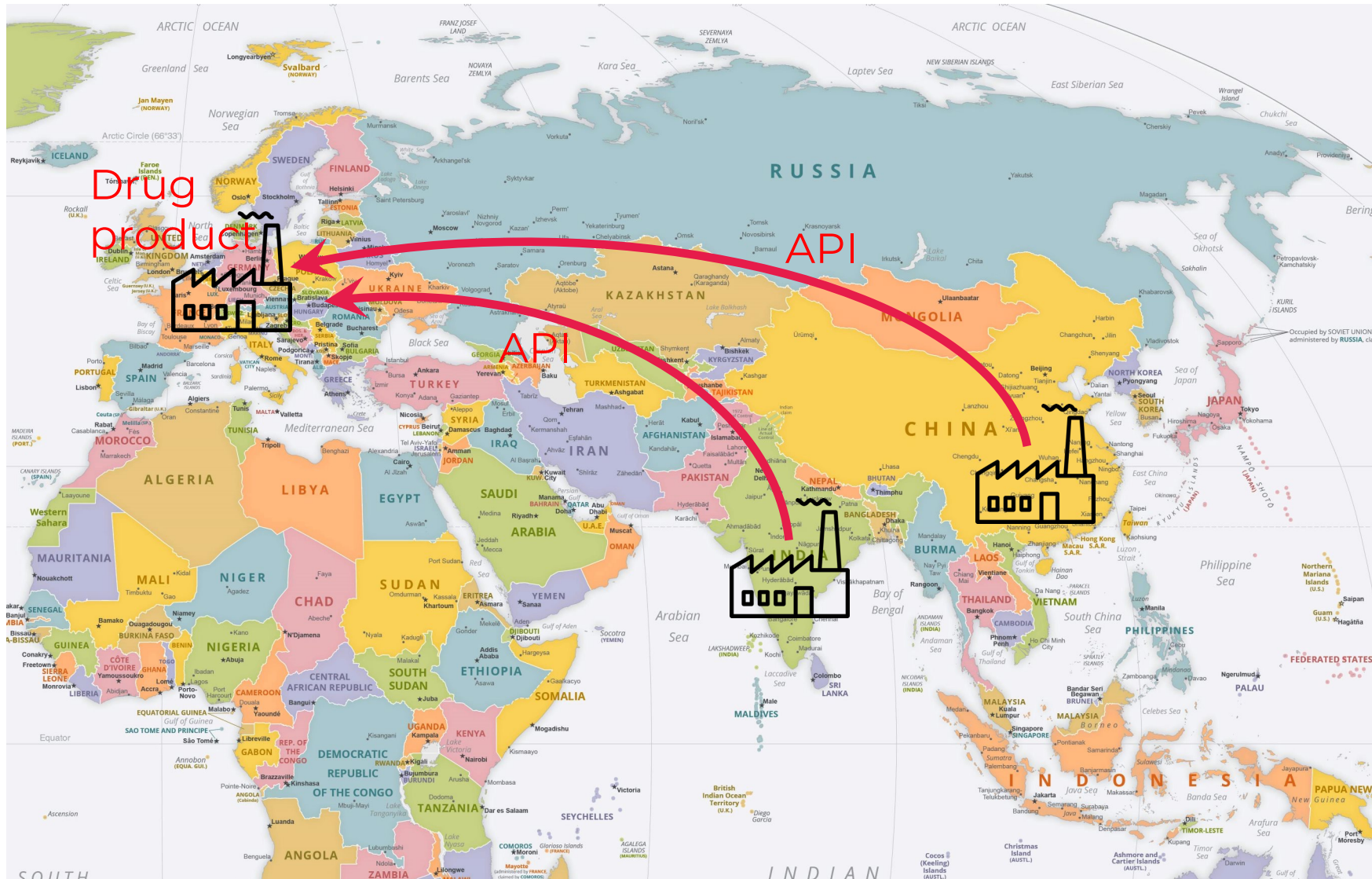
Evon up 2 date, 22.6.2022



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# Pharmaceutical Manufacturing Chain



<http://karteplan.com/eurasien/eurasien-politische-karte.jpg>



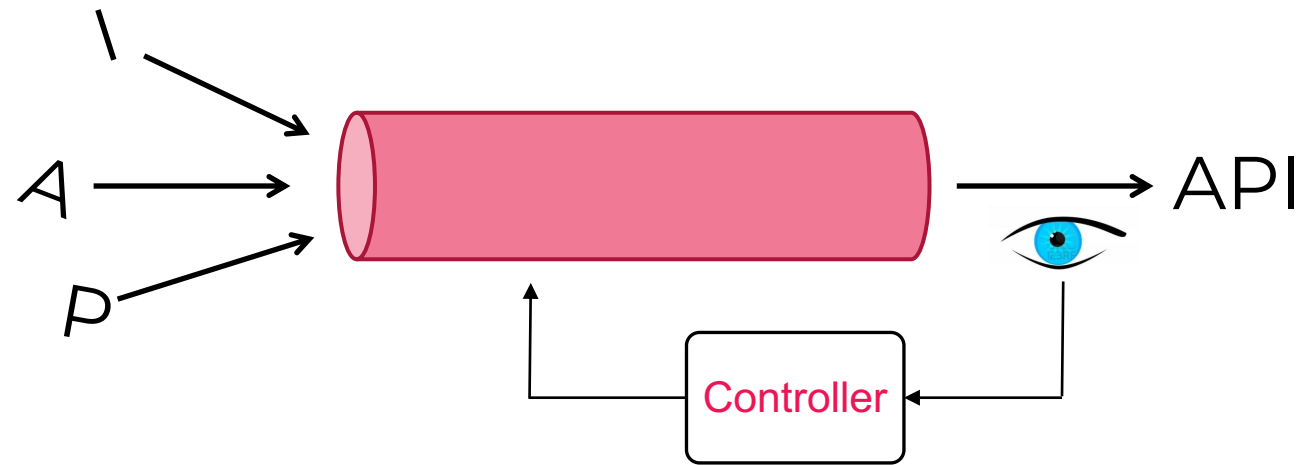
# Process Concepts

## Conventional batch processing



Low flexibility  
No real-time feedback  
Waste  
Quality variation  
Batch loss, if OOS

## Continuous processing with closed loop control



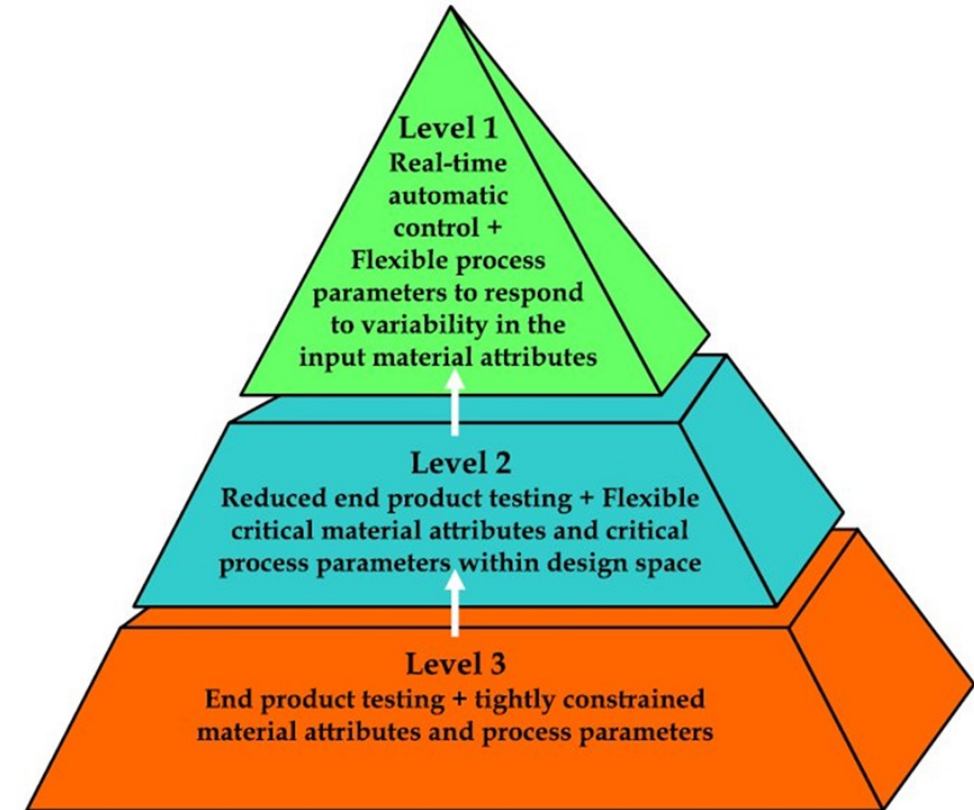
Real-time feedback & control actions  
Less waste  
Robust quality  
Easy scale-up  
High flexibility

# Strategy to Achieve an Automated Process

- Control concept supporting a fully automated continuous manufacturing process (Level 1)
- Optimized start-up and steady state operation
- Real-time control actions and quality control
- Mitigation of OOS events
- Control of mass flow rates through all unit operations
- Control of quality attributes of intermediates and product

## Quality by Control (QbC)

1. Risk-based PAT strategy
2. Development of process models
3. Development of a hierarchical control strategy
4. Implementation of closed loop control

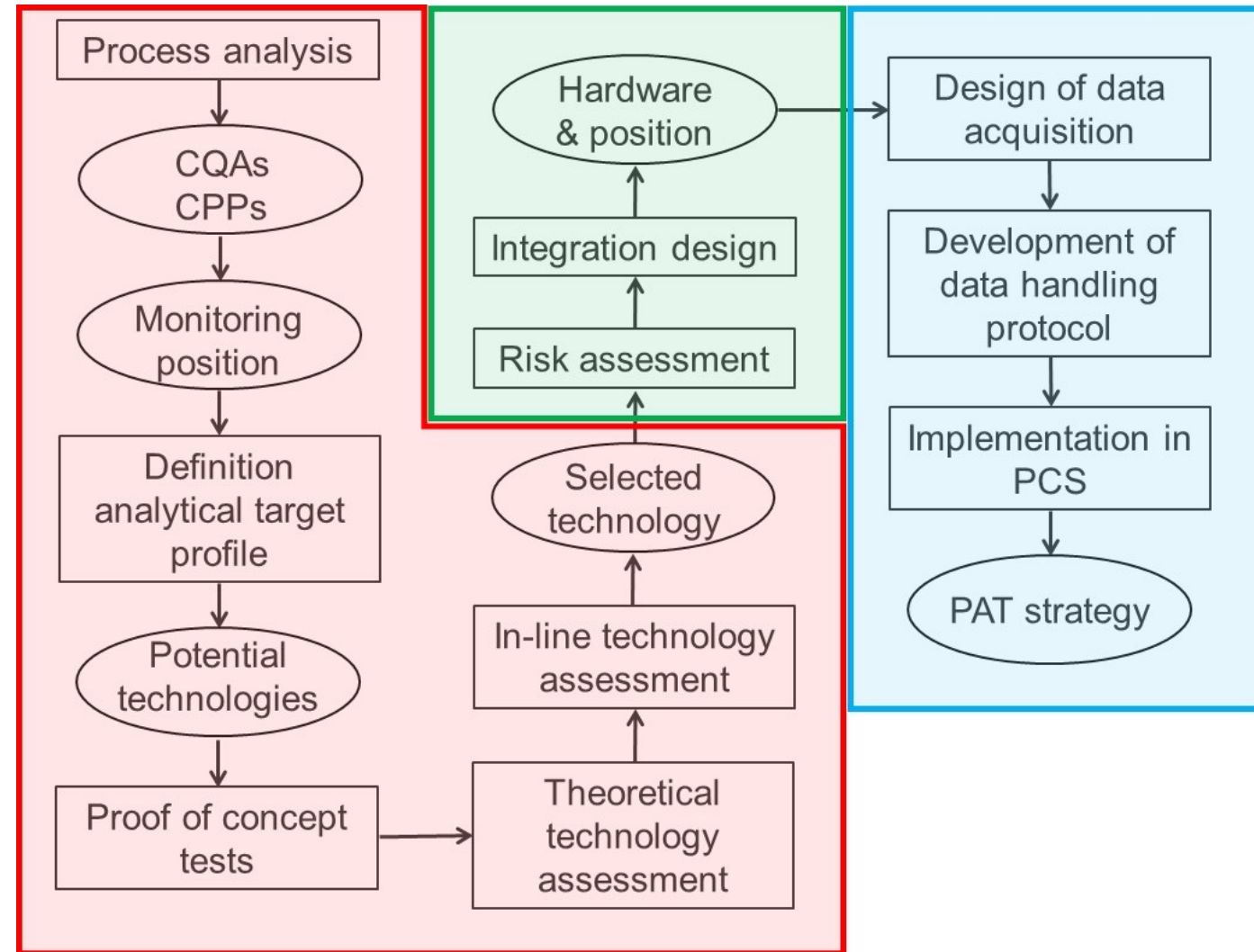


Published by FDA: Lawrence Yu et al.,  
AAPS Journal 2014, 16, 4, 771-783

# Utilization of PAT

- Generation of information on process and material state from process data in real-time is essential
- This requests
  - PAT concept over the full process chain
  - Proper in-line monitoring technology (accuracy, resolution, acquisition rate, reproducibility, etc.) for each CQA relevant for the control concept
  - Knowledge to develop the right information out of a huge amount of data
  - Interaction of PAT with process control system (PCS)

PAT implementation workflow



S. Sacher et. al. 2022, PAT implementation for advanced process control in solid dosage manufacturing – a practical guide. *Int. J. Pharm.* <https://doi.org/10.1016/j.ijpharm.2021.121408>

# Process Digitalization

## Process equipment & sensors



## Interfaces

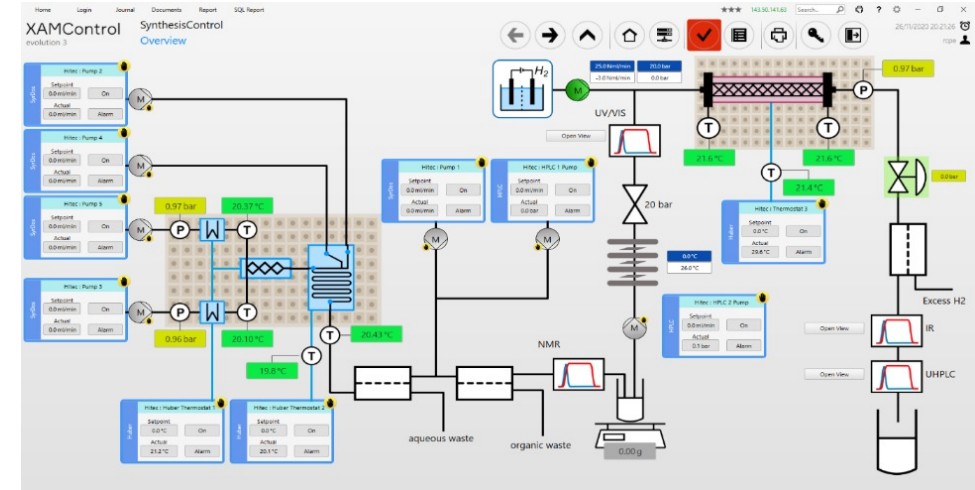


Process data



Actuating signals

## Digital twin & human machine interface



## Process models

$$r_1 = k_{0,1} e^{-\frac{E_{a,1}}{RT}} c_{3N-ClBA}^{01,1} c_{NaOH}^{02,1} \quad \frac{dc_{3-NSA}}{dt} = r_1$$

$$r_2 = k_{0,2} e^{-\frac{E_{a,2}}{RT}} c_{5N-ClBA}^{01,2} c_{NaOH}^{02,2} \quad \frac{dc_{3N-ClBA}}{dt} = -r_1$$

$$\frac{dc_{NaOH}}{dt} = -2r_1 - 2r_2 \quad \frac{dc_{5-NSA}}{dt} = r_2 \quad \frac{dc_{5N-ClBA}}{dt} = -r_2$$

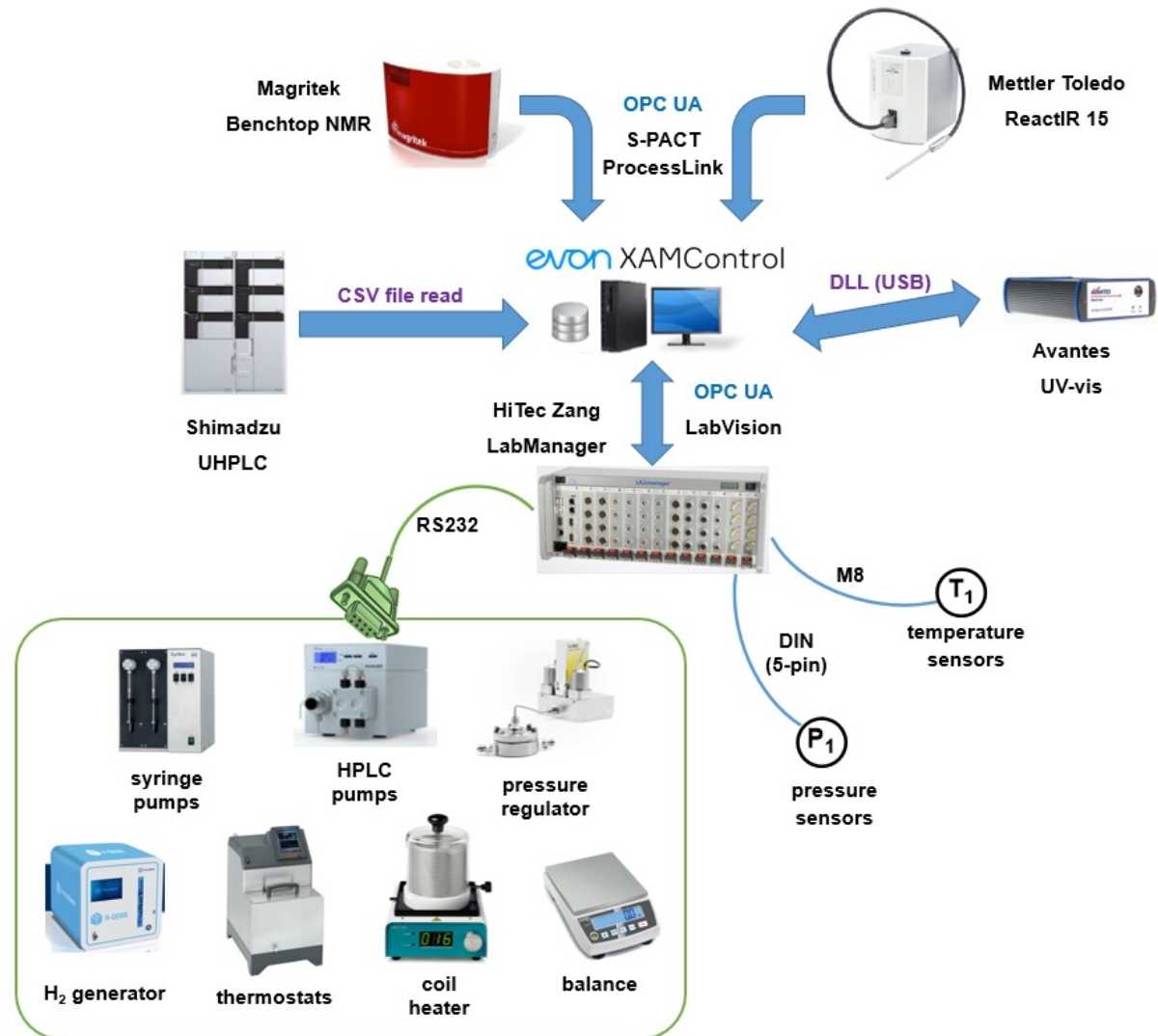
$$\frac{\partial c(t, l)}{\partial t} = -\frac{v_0 \partial c(t, l)}{\partial l} + \text{"reaction rates"}$$

## Optimal control

$$\min \sum_{i=1}^{np} e^{T_{k+i}} Q e_{k+i} + \sum_{i=0}^{nc} u_{k+i}^T R u_{k+i}$$

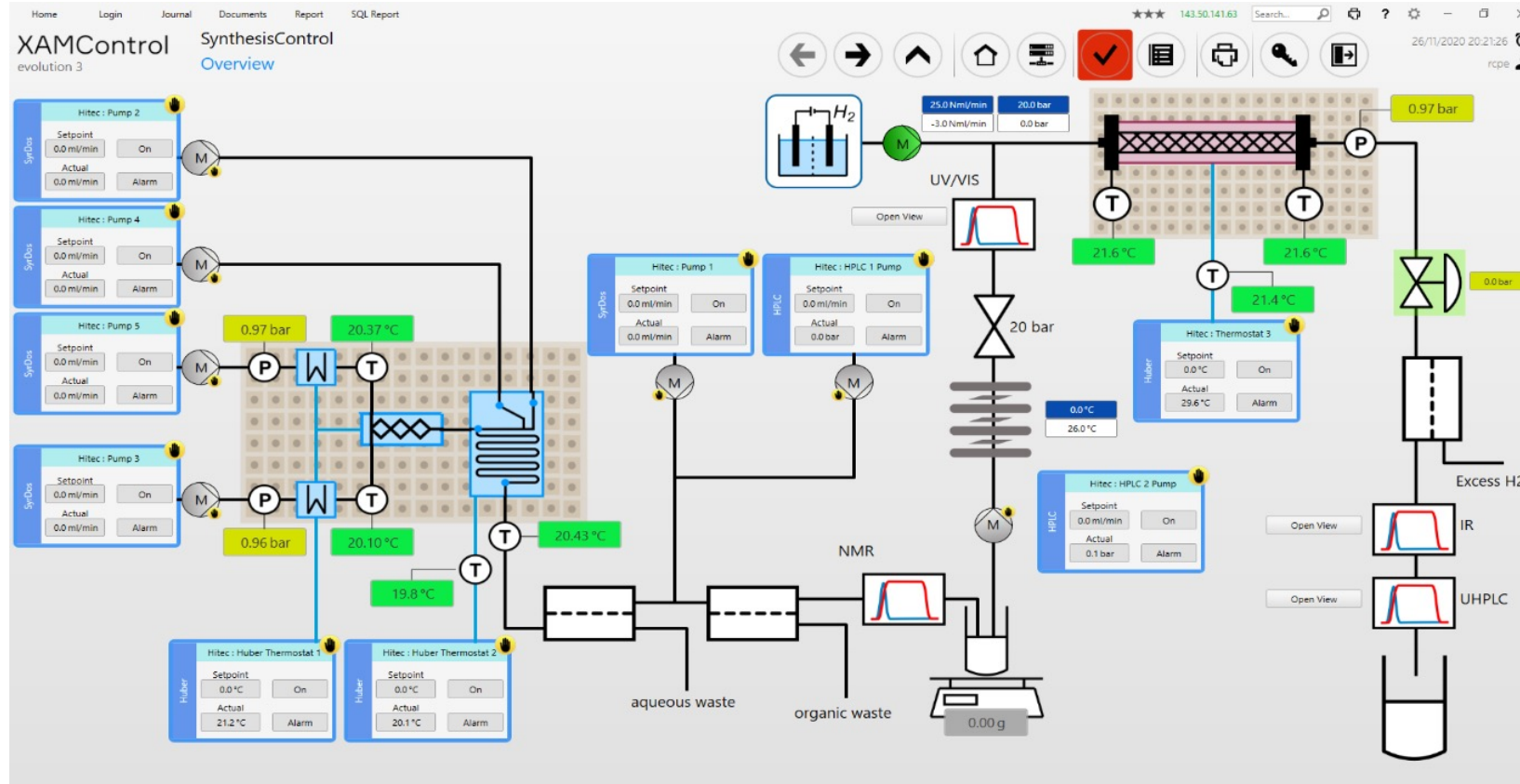
subject to:  
input constraints  $u_{\min} \leq u_k \leq u_{\max}$   
output constraints  $y_{\min} \leq y_k \leq y_{\max}$   
process model

# Data Acquisition Architecture



- Interfaces with multivariate sensors via OPC UA (NMR and IR), net DLL (UV/Vis) and csv file transfer (UHPLC)
- Process equipment connected via various interfaces and HiTec LabManager
- Data alignment and process control in XAMControl
- Implementation of control concept in XAMControl after optimization in simulation

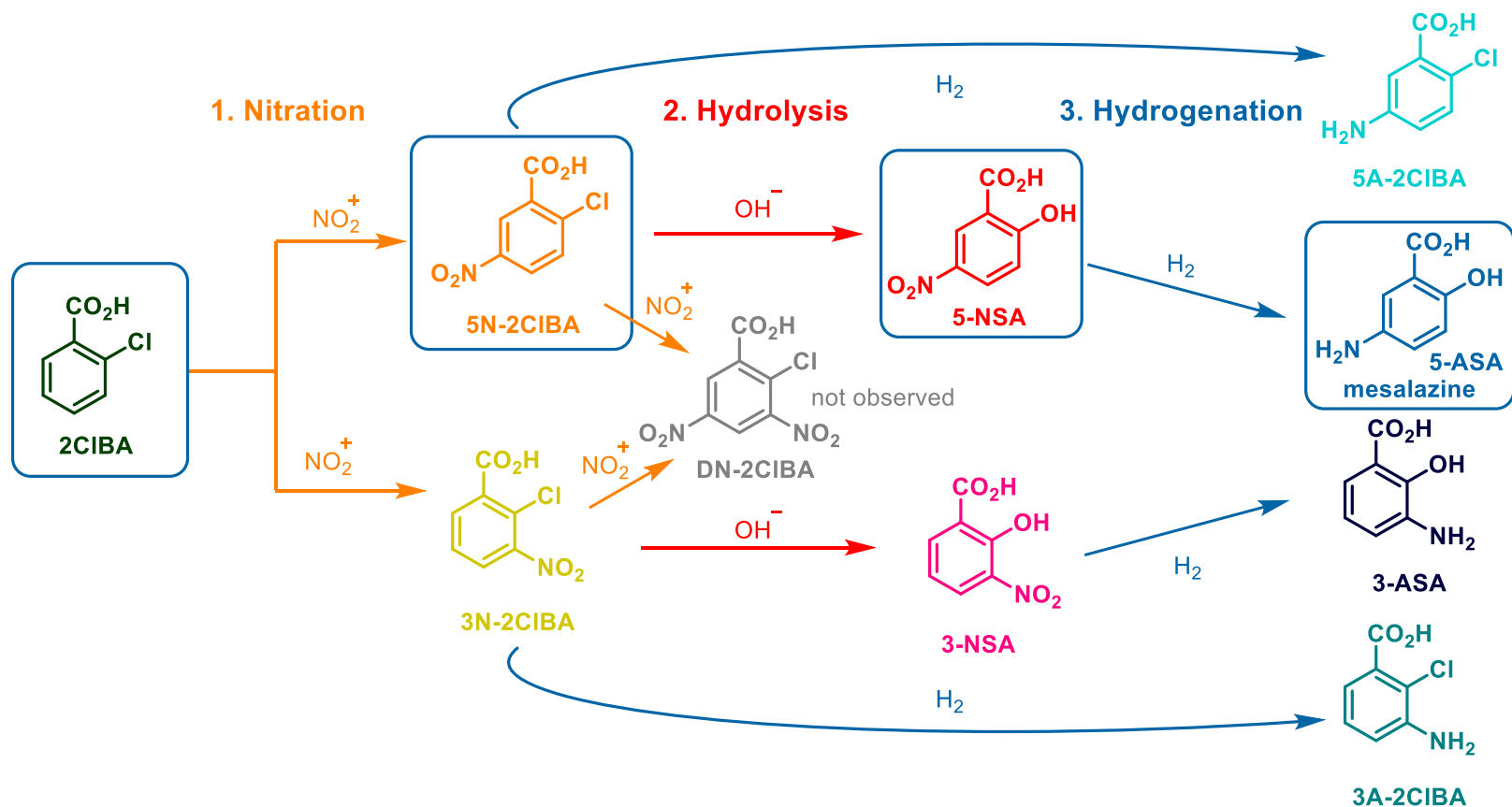
# Process Automation



- XAMControl as process control system (PCS)
- Execution of control concept via SCADA and PLCs
- Execution of process models and chemometric models in the PCS
- Execution of PAT methods
- Human machine interface (HMI)
- Process visualization
- Material tracking
- Recipe management
- Storage of relevant process data
- Remote control function



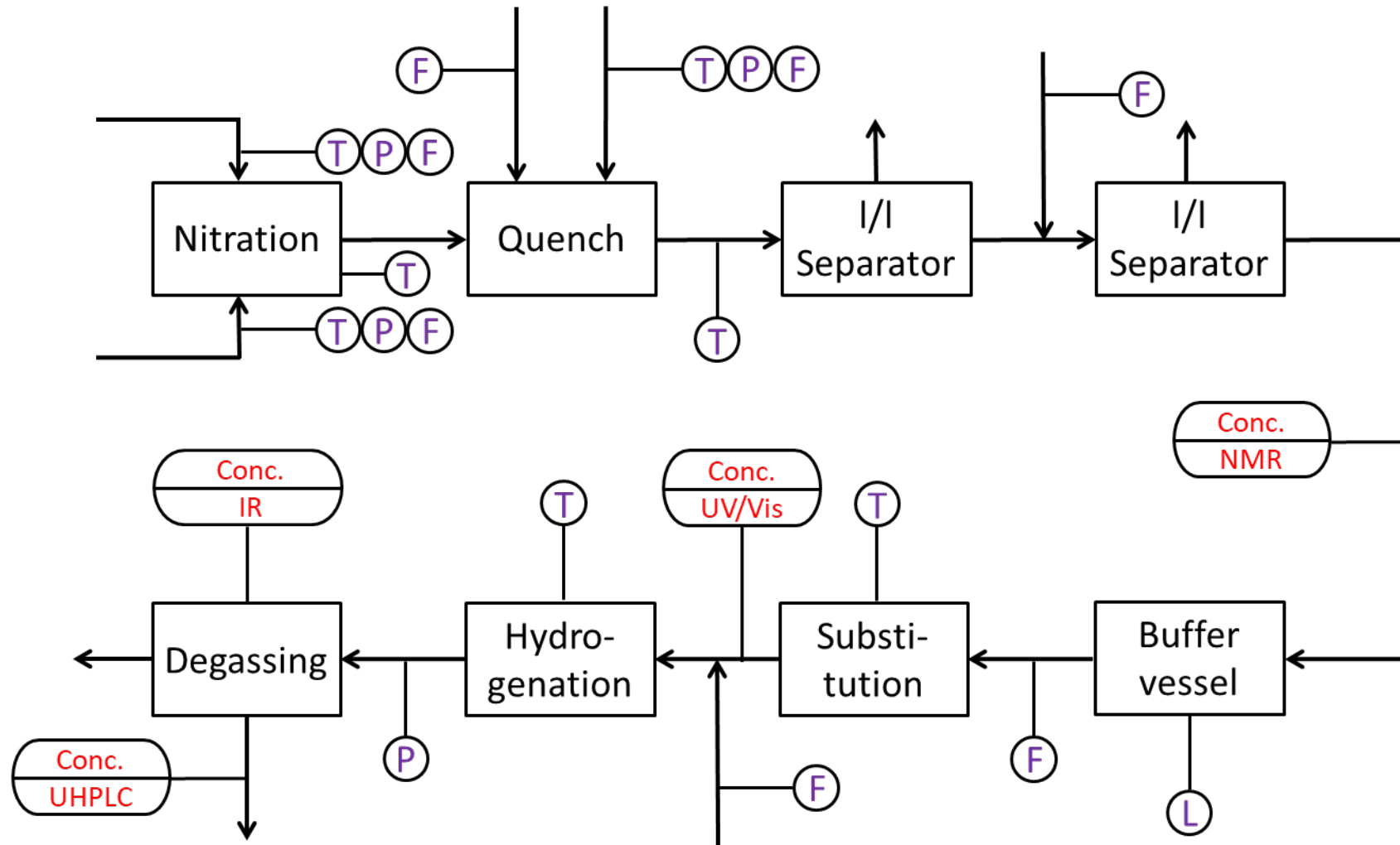
# API Synthesis



- Synthesis of mesalazine (5-aminosalicylic acid, 5-ASA) as target API
- Substrate: 2-chlorobenzoic acid (2CIBA)
- 3 reaction steps
  - Nitration with nitric acid
  - Hydrolysis/aromatic substitution
  - Hydrogenation
- Intermediates: 5N-2CIBA, 5-NSA
- Side products: 3N-2CIBA, 3-NSA, 3-ASA, 3A-2CIBA, 5A-2CIBA

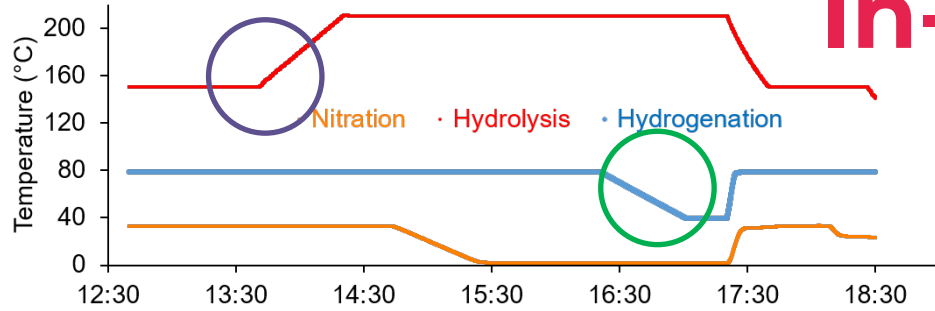
P. Sagmeister et al. (2021), *Advanced Real-Time Process Analytics for Multistep Synthesis in Continuous Flow*, *Angewandte Chemie Int. Ed.* <https://doi.org/10.1002/anie.202016007>

# PAT Concept for API Synthesis

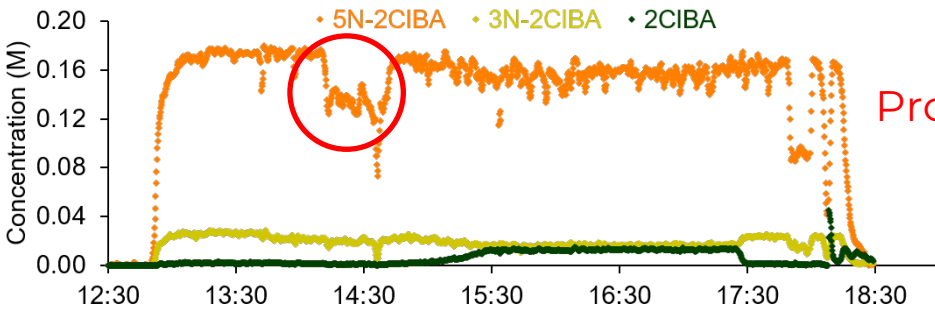


- In-line monitoring of concentration (yield, impurities) after each reaction step
- Prediction via hard modeling (NMR), PLS (IR) and neural network (UV/Vis)
- UHPLC at process end for exact concentration measurement
- Acquisition rates of 12s (NMR), 2s (UV/Vis), 15s (IR), 7.5min (UHPLC)
- In-line measurement of temperature, pressure via univariate sensors and flow rate from equipment data

# In-line Monitoring

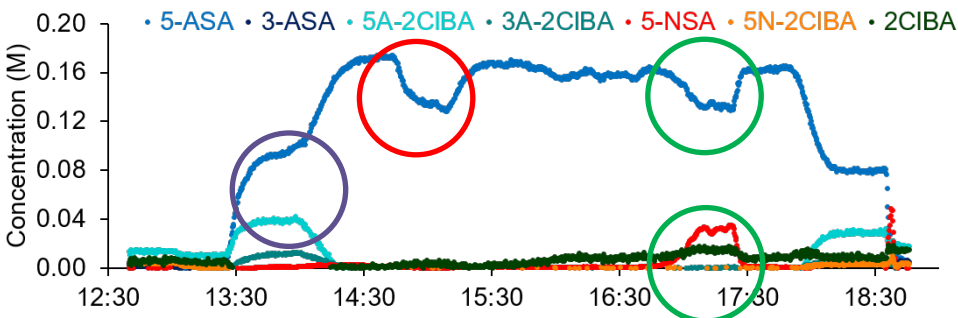


**Temperature profile**

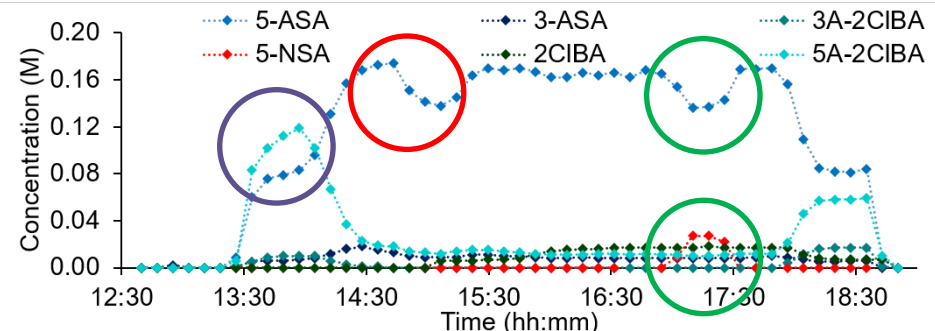


Problem in I/I-separation

**NMR**



**IR**

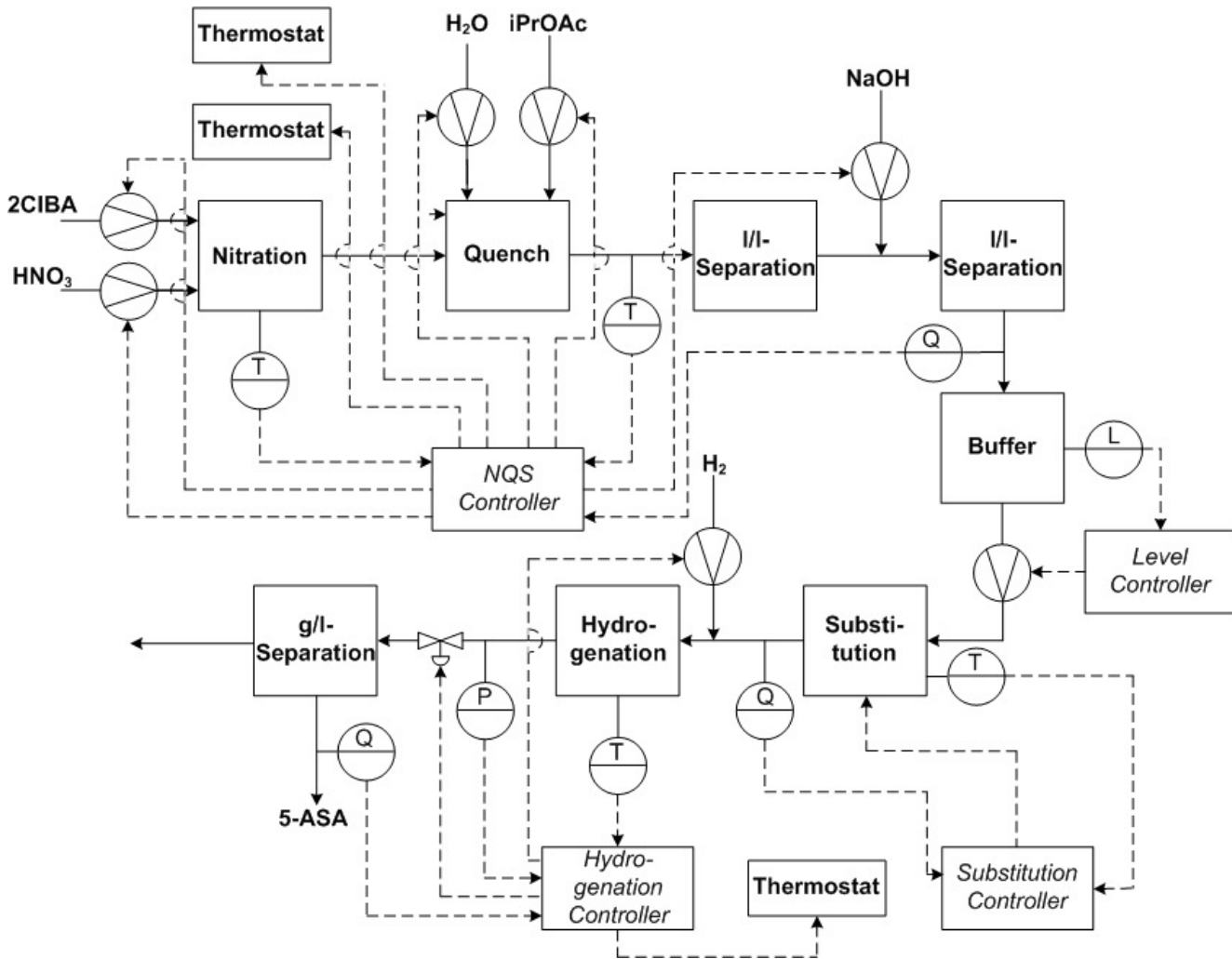


**UHPLC**

- In-line monitoring of concentration (yield, impurities) after each reaction step
- Temperature changes lead to changes in conversion and selectivity
- Low initial substitution (hydrolysis) temperature leads to low 5-ASA output and high 5A-2CIBA
- Problem in separation leads to decrease in intermediate and product
- Temperature decrease in hydrogenation leads to drop in product (5-ASA) and more unconverted 5-NSA
- Process events can be clearly monitored and detected

*P. Sagmeister et al. (2021), Advanced Real-Time Process Analytics for Multistep Synthesis in Continuous Flow, Angewandte Chemie Int. Ed. <https://doi.org/10.1002/anie.202016007>*

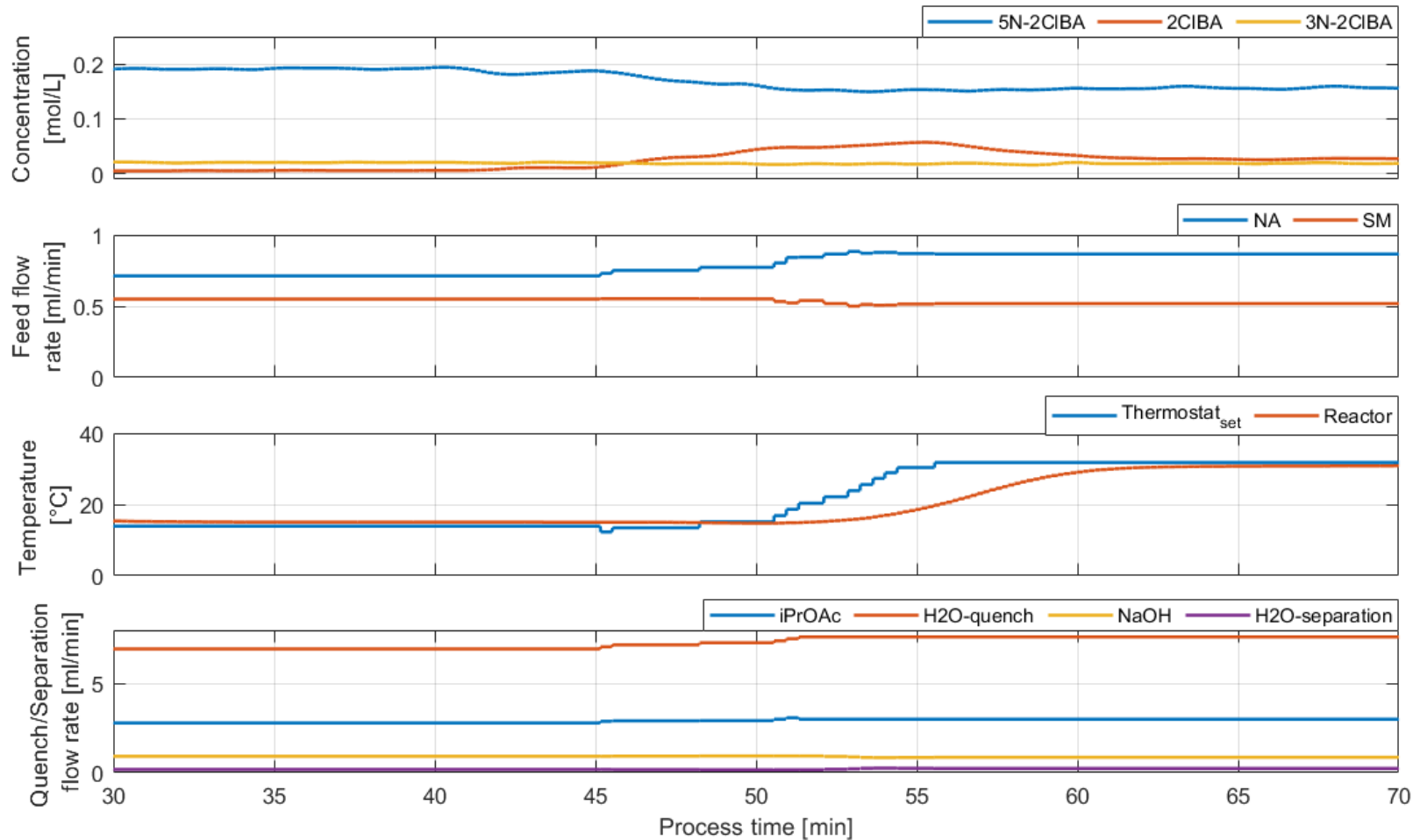
# Model-based Control Concept



- Real-time information on process (PPs) and material state (QAs) to trigger control actions
- Model-predictive control (MPC) concept, PID for buffer
- Independent control loops allow for flexibility (objectives and constraints)
- Main control objective
  - Maximize throughput and yield
  - Minimize impurities (raw and side products)
- Constraints for all manipulated variables and rate changes according to process, equipment behavior, etc.

Sacher, S. et al., 2022. Automated and continuous synthesis of drug substances. *Chem. Eng. Res. Des.* 177, 493-501. doi: 10.1016/j.cherd.2021.10.034.

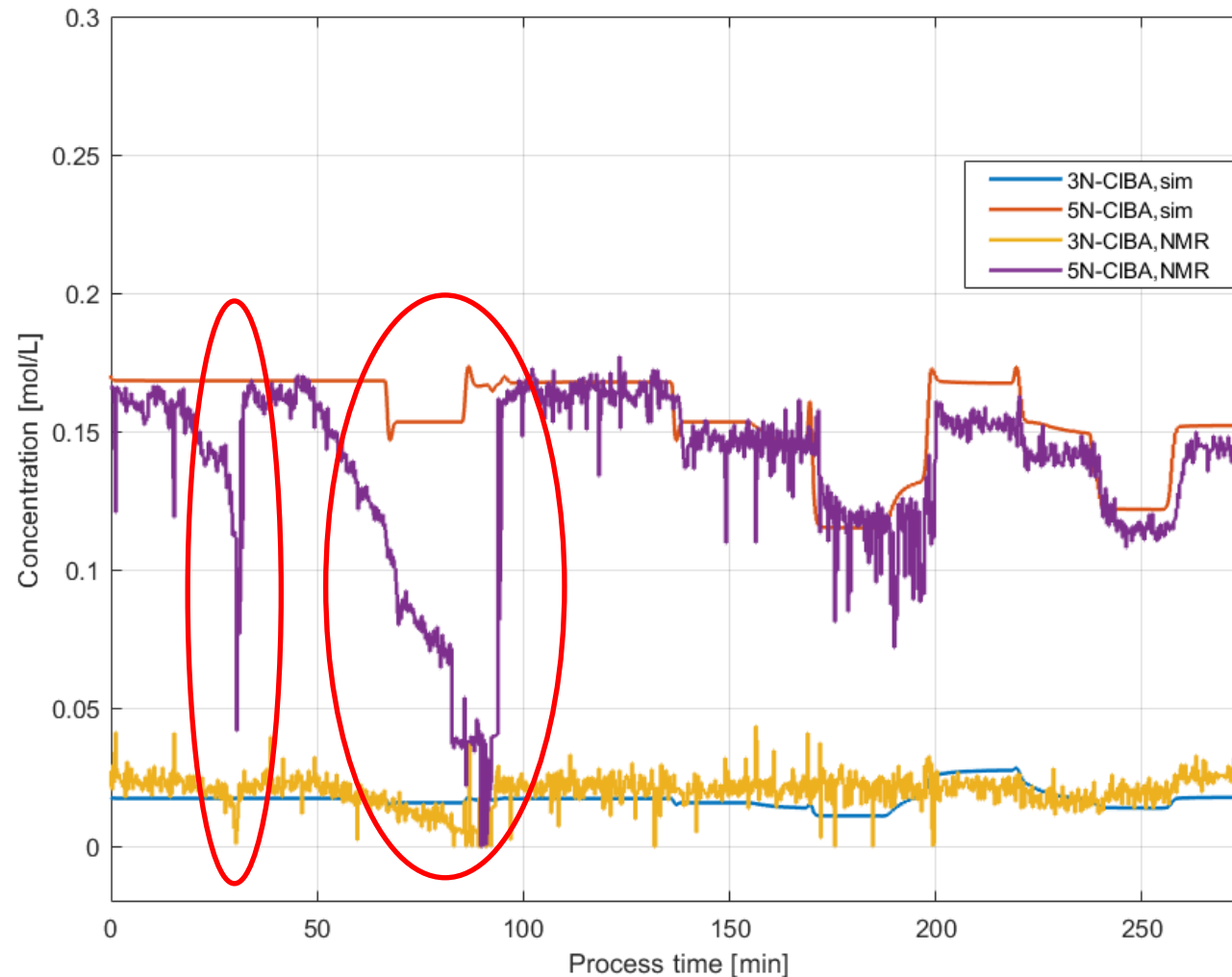
# Automation of API Synthesis



S. Sacher et. al. 2021, Automated and continuous synthesis of drug substances. Chem. Eng. Res. Des. 177, 493-501.  
doi: 10.1016/j.cherd.2021.10.034.

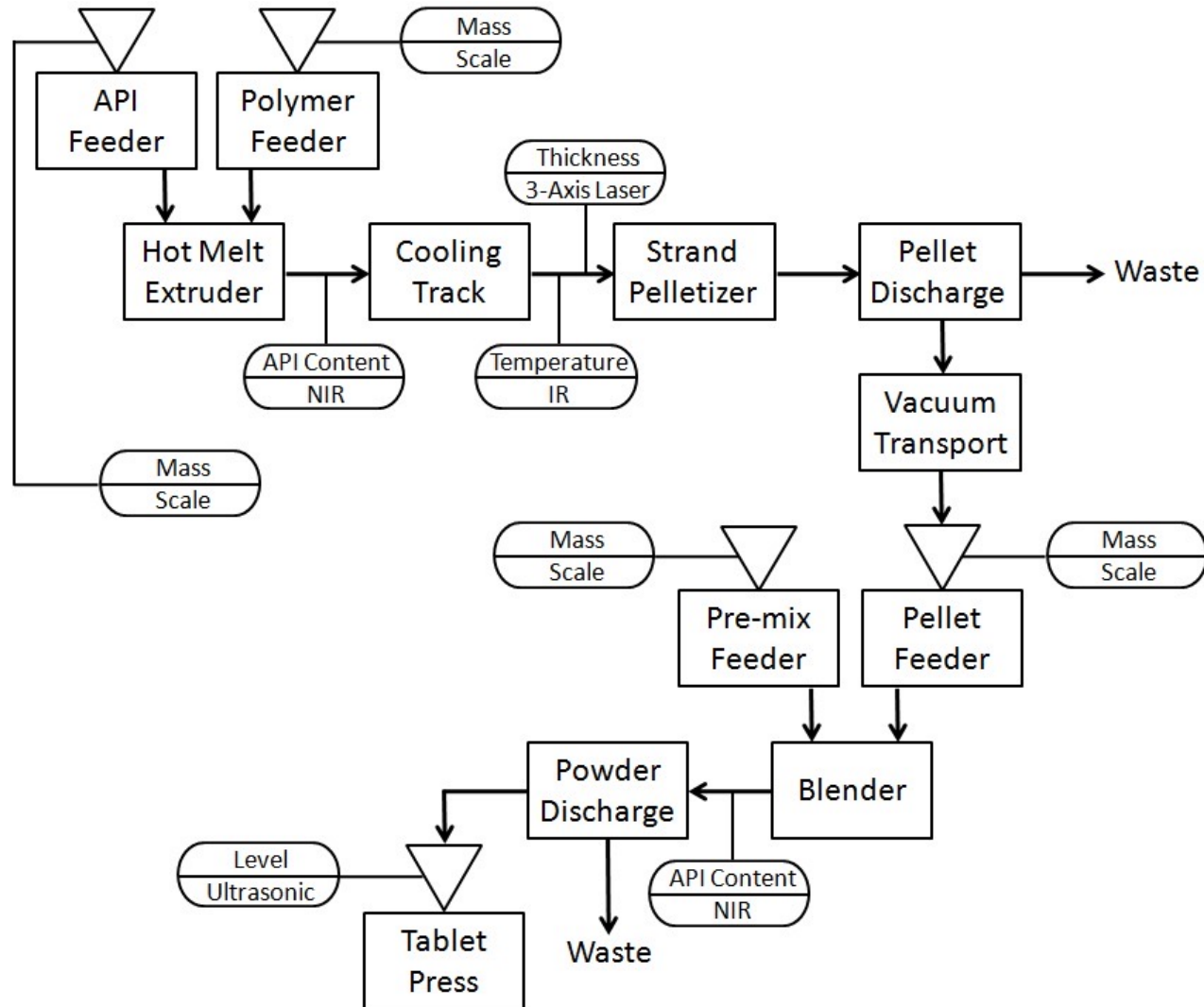
- Steady state operation of nitration
- At 40 min the feed stock of nitrating agent (NA) was exchanged to 50% nominal concentration
- Concentration of product (5N-2CIBA) starts to decrease and starting material (2CIBA) increases
- Controller reacts immediately and manipulates feed rates and reaction temperature
- New steady state is reached with optimized yield at 55 min

# Automated Fault Detection



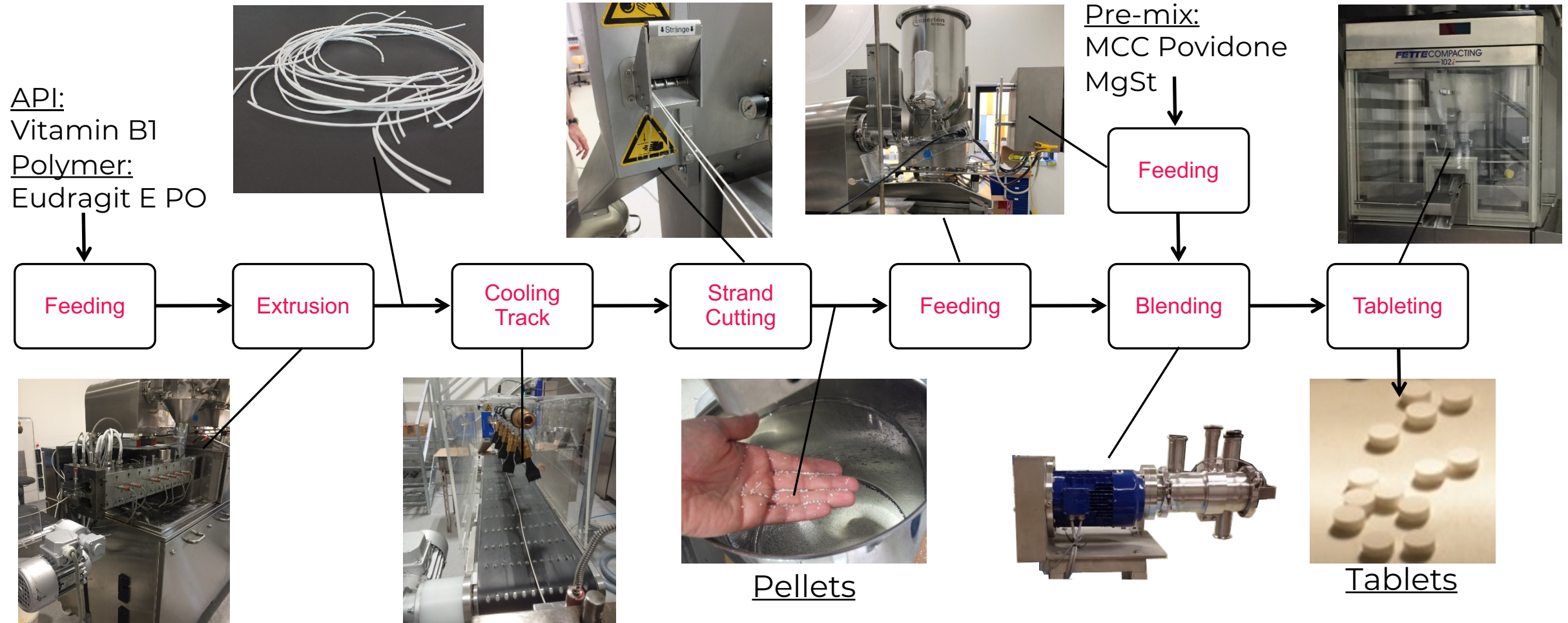
- Fault detection based on comparison between observer and measurement
- Concentration after nitration-quench-separation
- Deviation (marked in red) indicates process fault
- Concentration of product and side-product decreased due to issues with separation unit
- Product and side-product were diverted to waste
- Due to real time fault detection the problem could be recognized and solved

# Tableting via Extrusion and Direct Compaction



- Continuous manufacturing of tablets
- Combination of hot melt extrusion (HME) and direct compaction (DC) line
- Embedding of vitamin B1 as model API in Eudragit E PO as polymer carrier
- Compaction of pellets and excipients in DC line

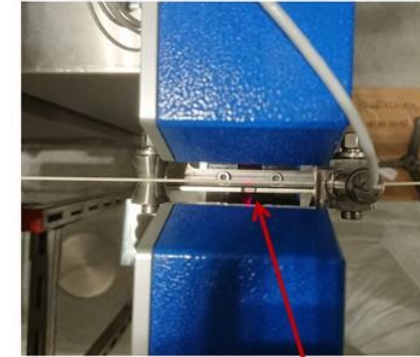
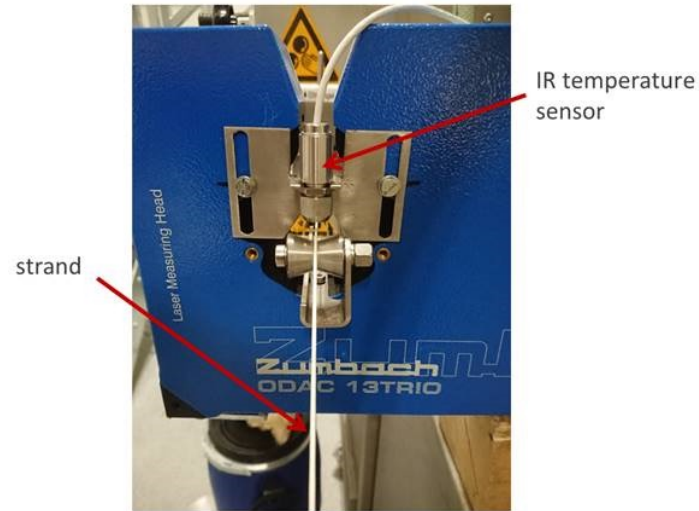
# Continuous Tableting Process



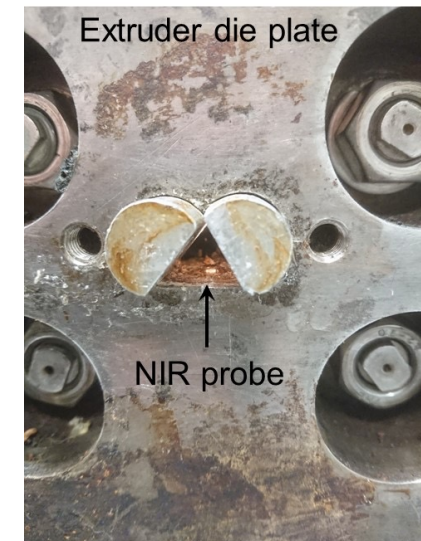
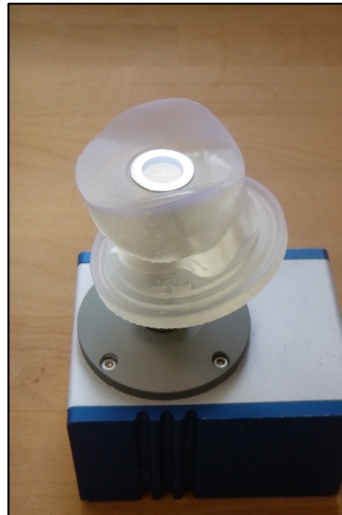
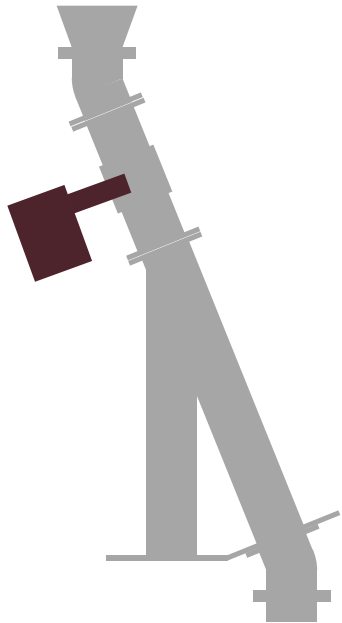


# PAT Strategy and Tools

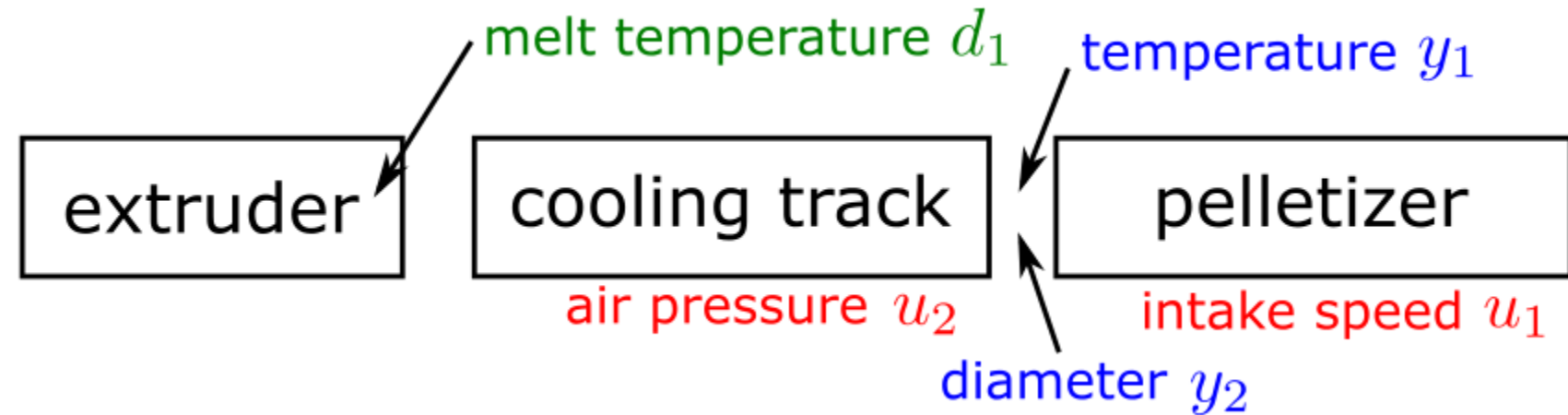
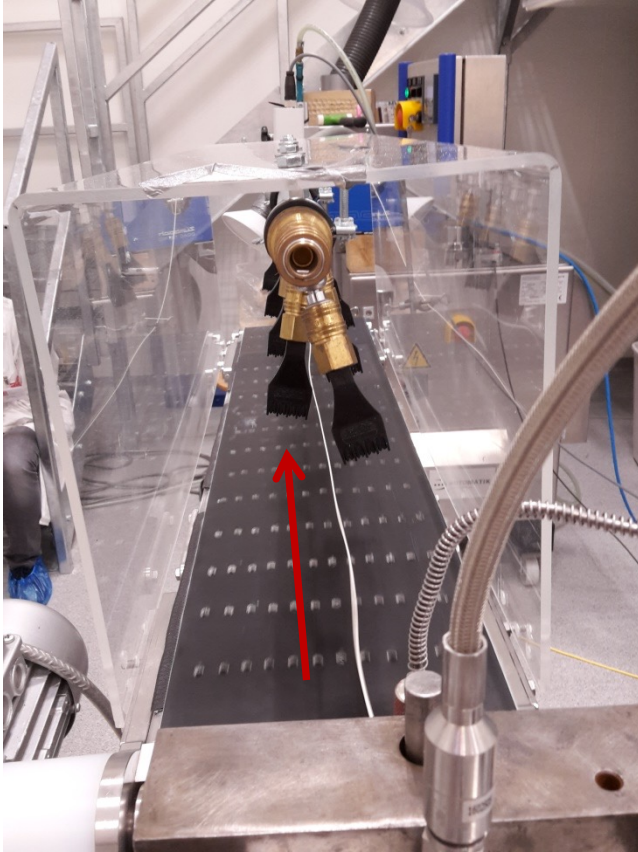
CQA	PAT method
Melt concentration	NIRS
Strand thickness	3-axis laser
Strand temperature	IR
Blend concentration	NIRS
Hopper level	Ultrasound



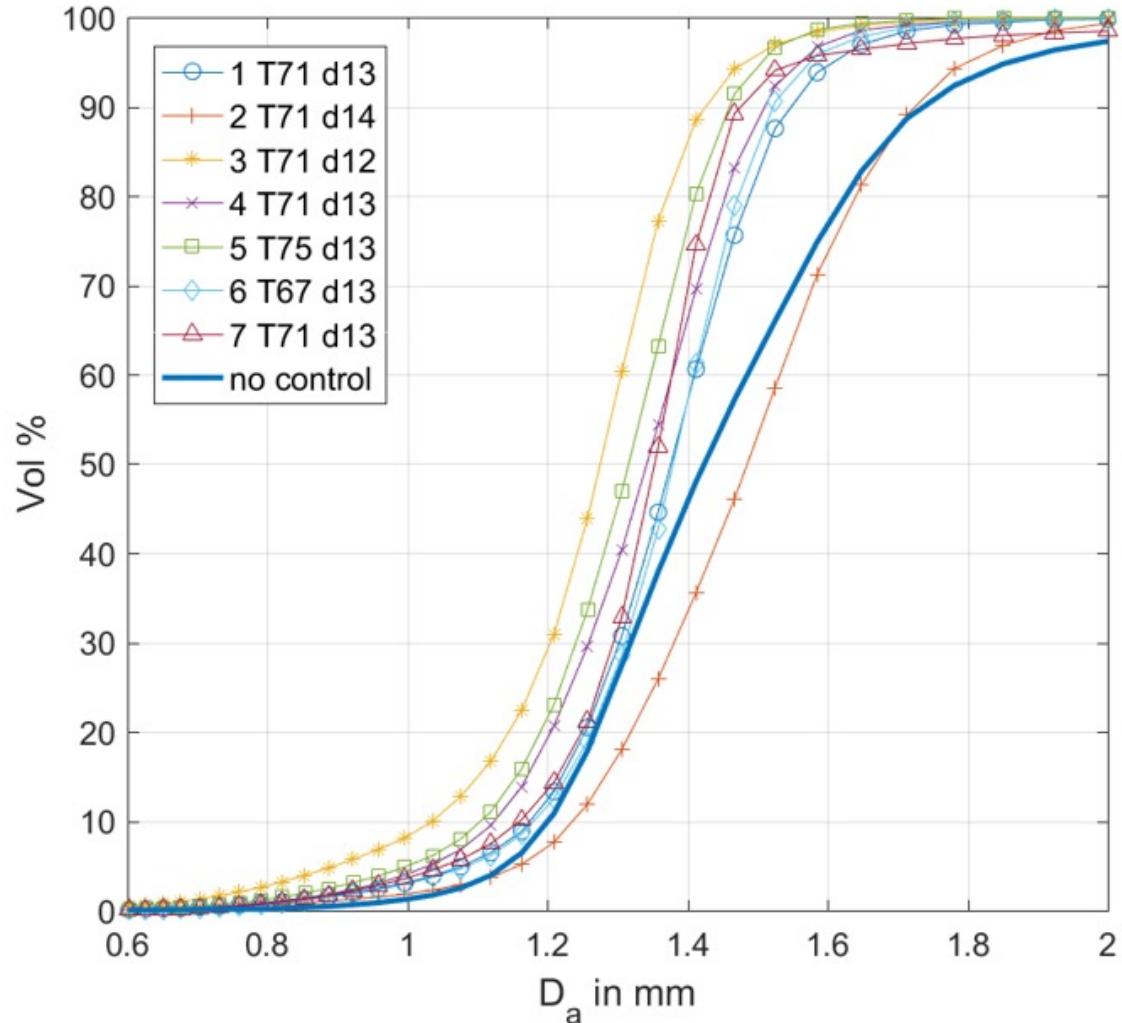
Strand thickness measurement (laser)



# Model-predictive Control of Pelletization

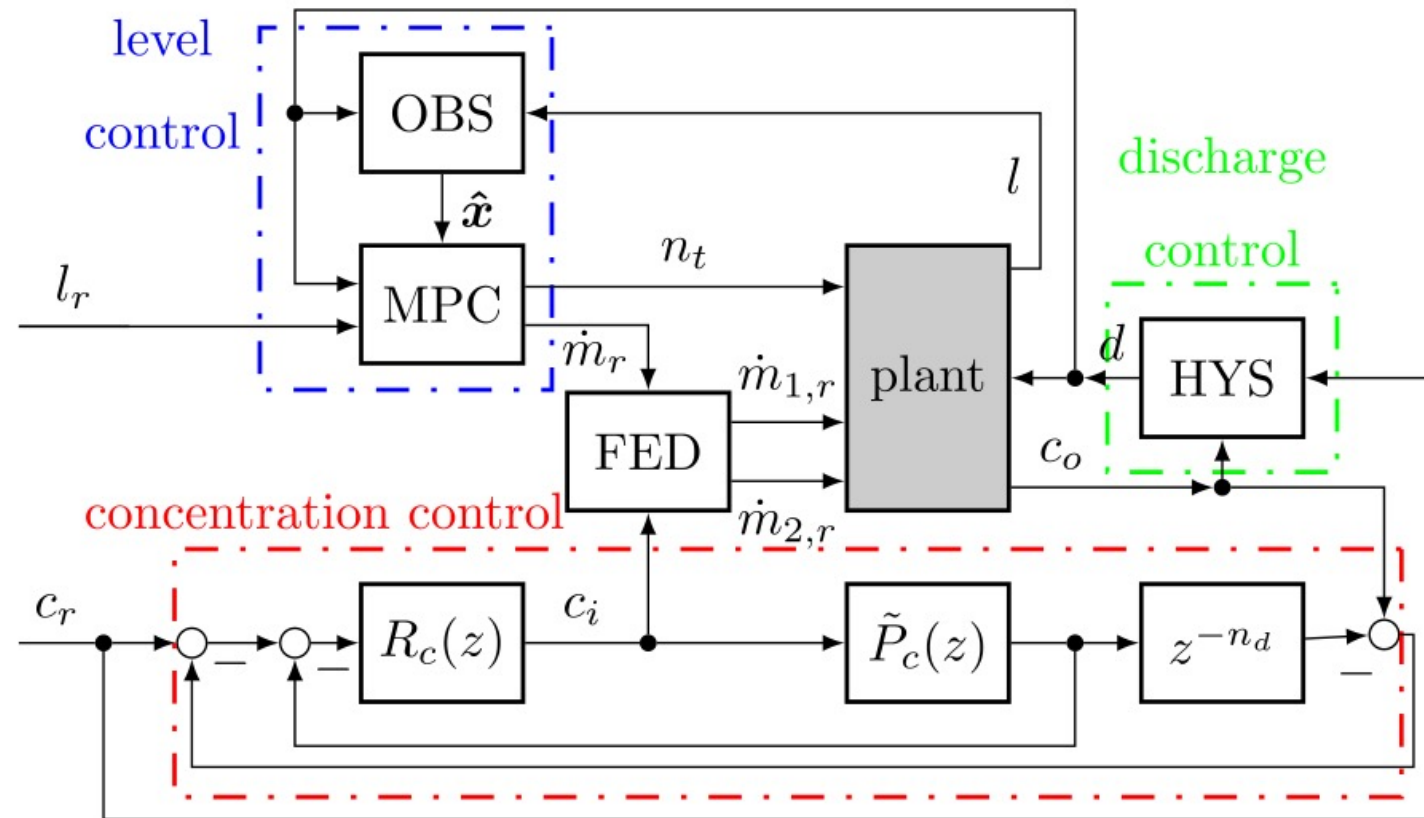


# Model-predictive Control of Pelletization



- Strand diameter and temperature are the controlled variables
- Pelletizer intake speed and cooling air pressure are the manipulated variables
- Objective is a narrow particle size distribution (PSD) of the pellets
- Pelletization parameters are adjusted via MPC
- Influence of control is visible
- Obtained particle size distribution is narrower compared to process with no control

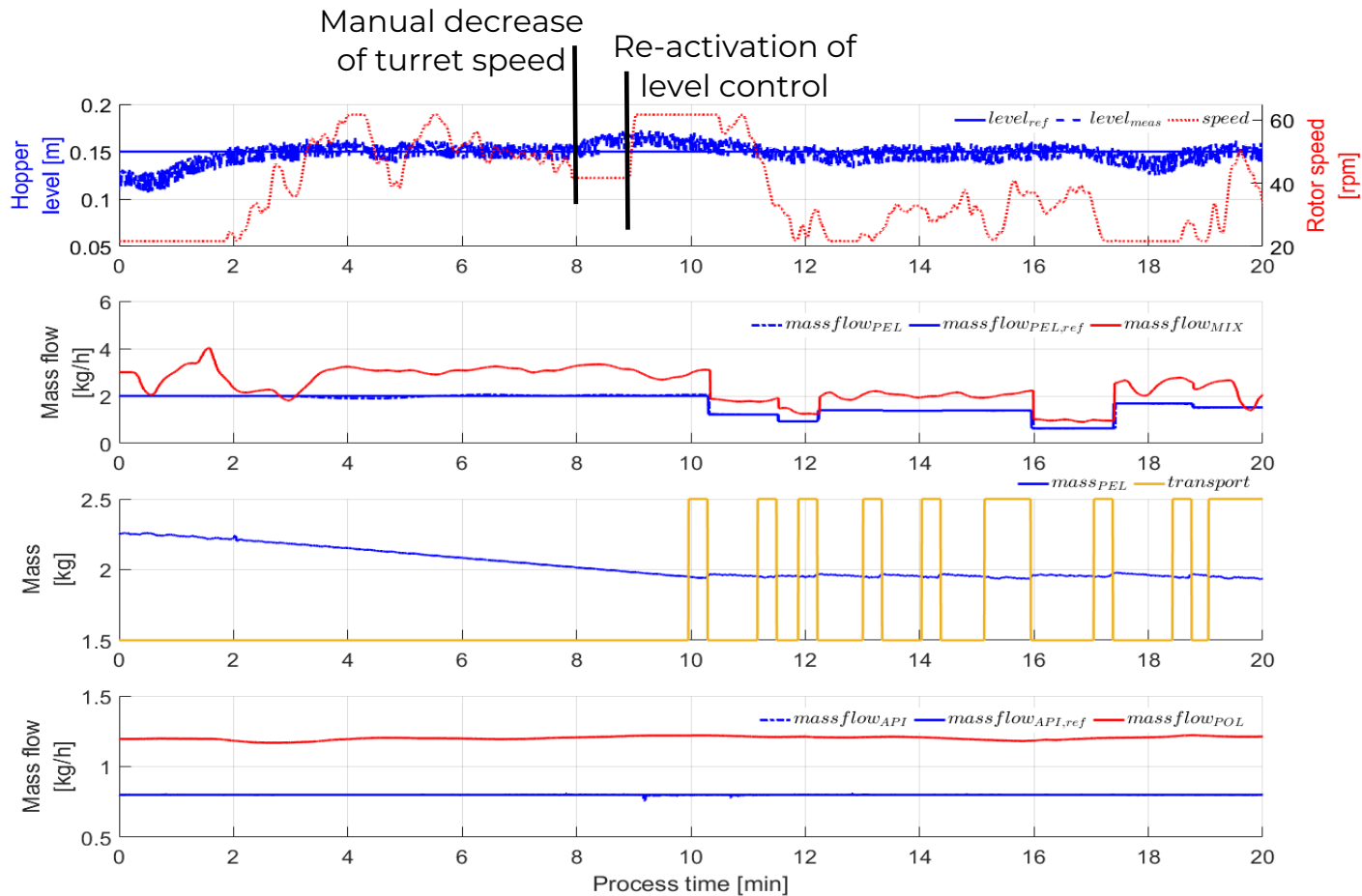
# Model-predictive Control of Tableting Line



- Control concept for DC line
- Model-based control of
  - concentration (Smith predictor concept + PID controller  $R_c$  to adjust the ratio of the two solid feed rates)
  - OOS discharge (NIR measurement + threshold with hysteresis to trigger discharge)
  - tablet press hopper fill level (MPC to adjust total solid flow rate and turret speed of the tablet press)

M. Kirchengast et. al. 2019, Ensuring tablet quality via model-based control of a continuous direct compaction process. *Int. J. Pharm.* 567, 118457. doi.org/10.1016/j.ijpharm.2019.118457

# Model-predictive Control of Tableting Line



- Rates of API and polymer feeders are kept at nominal values
- Mass hold-up in pellet feeder is started at higher level to test vacuum transport
- Rotor speed is adjusted manually after 8 min to increase hopper level
- Hopper fill level control is re-activated after 1 min and brings level back to nominal level of 150 mm

Sacher et. al, 2019. Towards a Novel Continuous HME-Tableting Line: Process Development and Control Concept. *Eur. J. Pharm. Sci* 142, 105097. doi: 10.1016/j.ejps.2019.105097

# Conclusion & Next Steps

- A PAT strategy for an entire manufacturing line is essential to
  - monitor quality in-line and support TRTR
  - detect deviations from set-points and initiate control actions
  - support real-time process control
- Advanced real-time data based control concepts allow
  - a robust process even in the case of exceptional events, varying conditions and for start-up
  - consideration of different control objectives and specific constraints, e.g. maximize throughput or optimize equipment efficiency
  - automated operation and fault detection, highest level of control
- Running project “PharmComplete”
  - Combination of the complete manufacturing line (API synthesis, API processing and tablet manufacturing) at one single site
  - Development and implementation of full automation concept

# Acknowledgements

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# Let's continue the conversation.

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