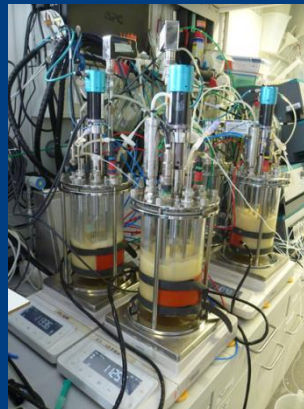


# Aspects and Implications of Physiological Process Control

Wieland Reichelt





- Motivation
- State of the Art - Technical control
- Physiological Control
  - Which variable to control?
  - Online BM estimation
- Applications
- Summary

# Motivation

## Process Development

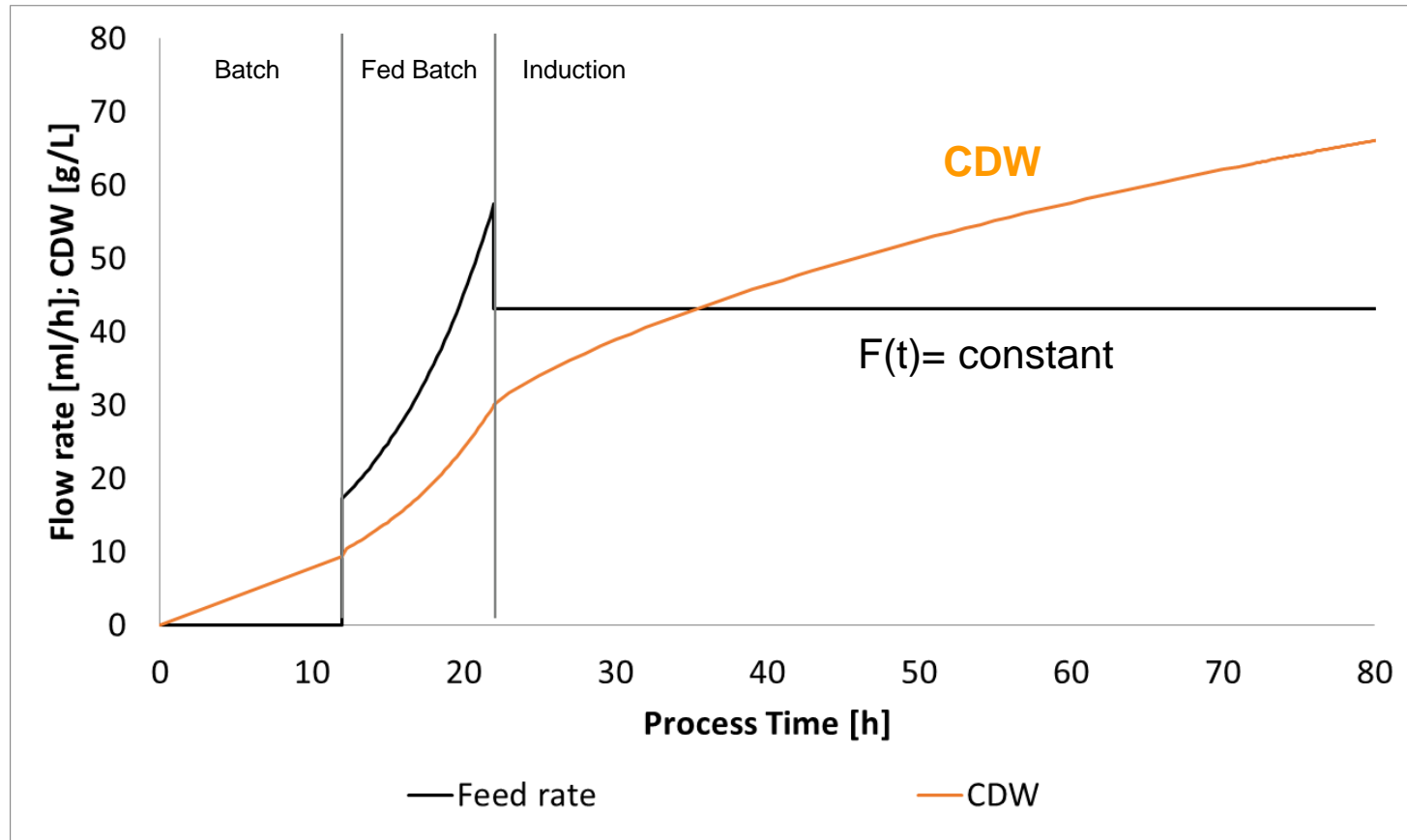


- Max. Productivity
- Constant product quality
- Robustness/Stable scale up
- Transferability of gained knowledge
  - Time to market

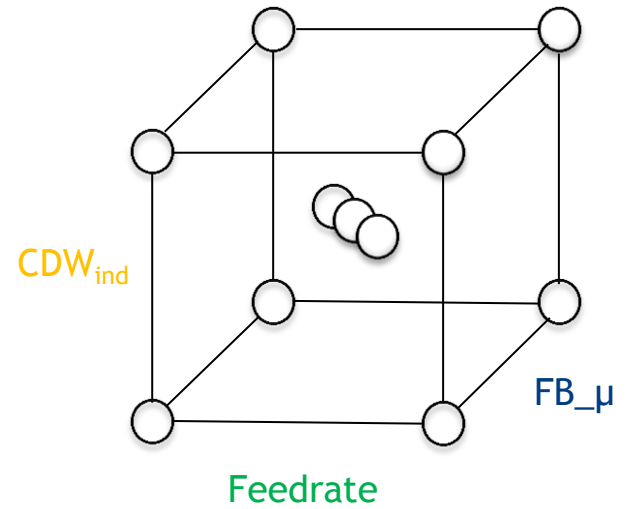
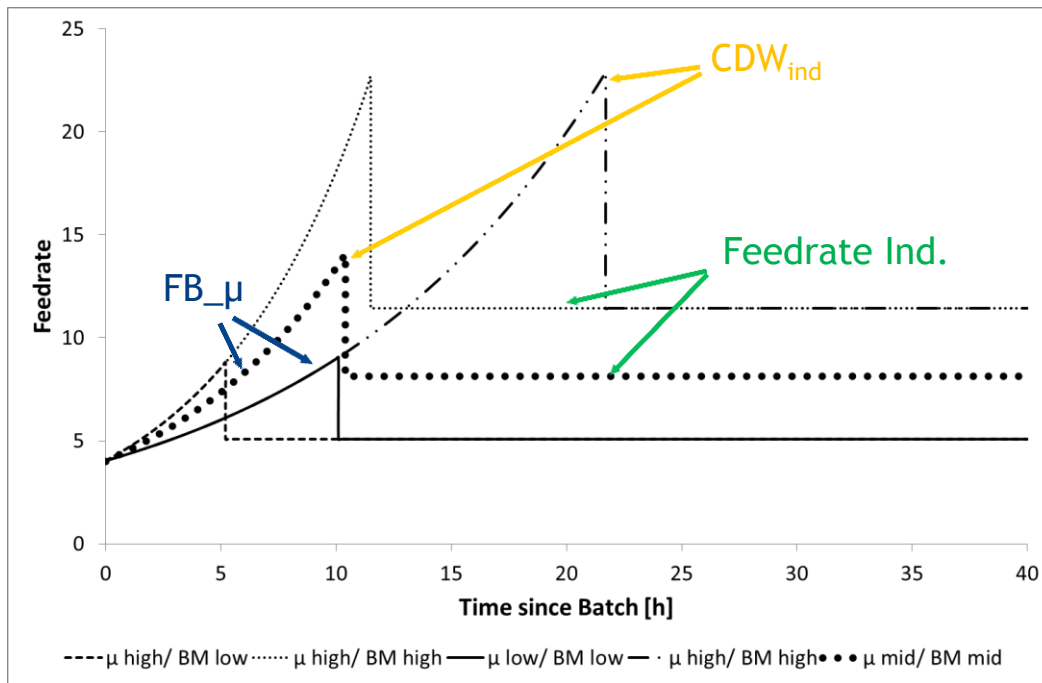


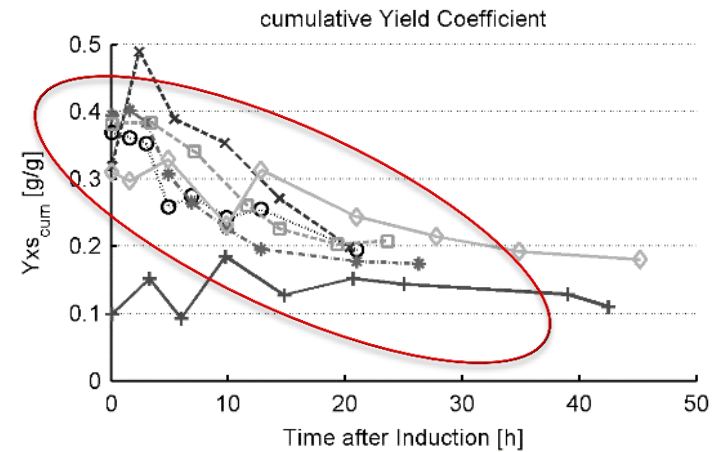
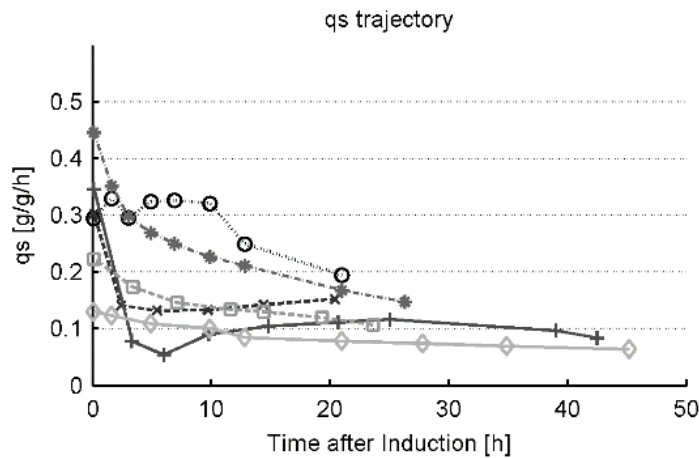
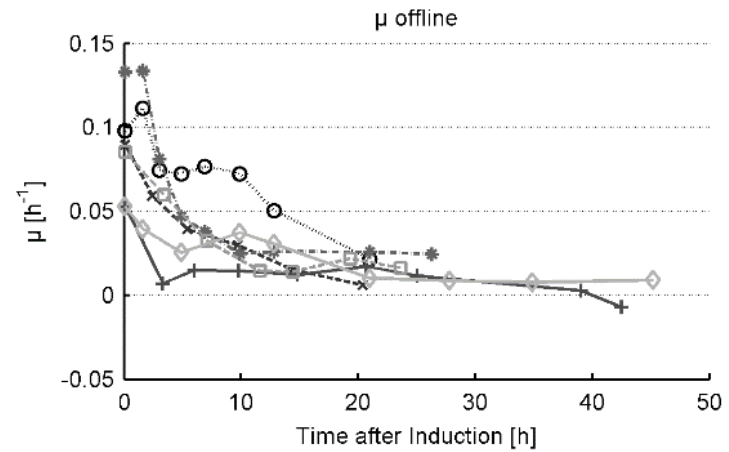
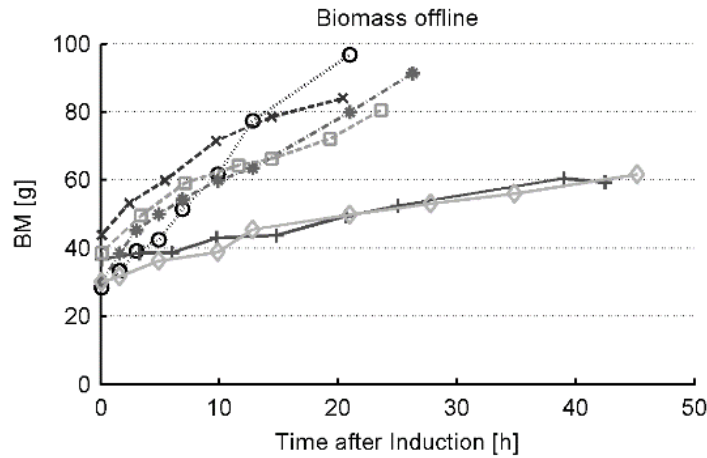


### Current driver: Simplicity - constant feed rate

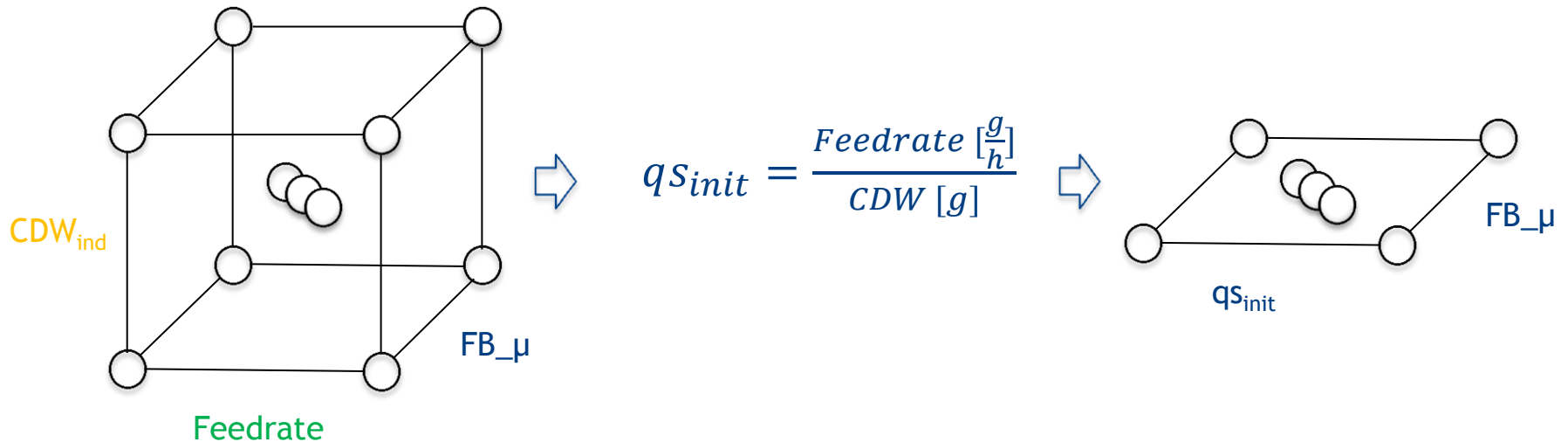


### Exemplary process development routine



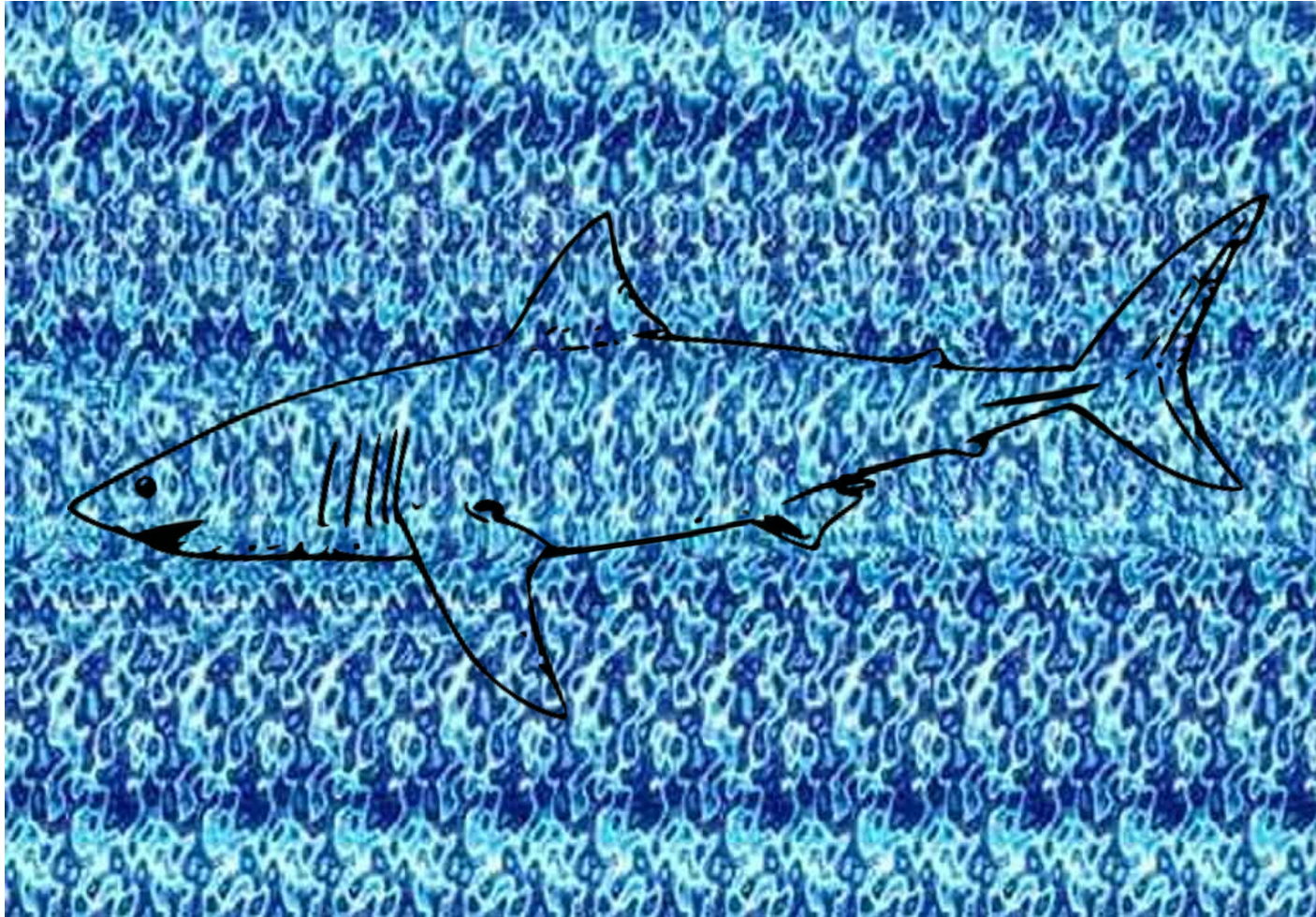


- From technical to physiological factors
  - Combination of feedrate and  $CDW_{ind}$  to  $qs_{init}$



Wechselberger et al 2012: Efficient feeding profile optimization for recombinant protein production using physiological information

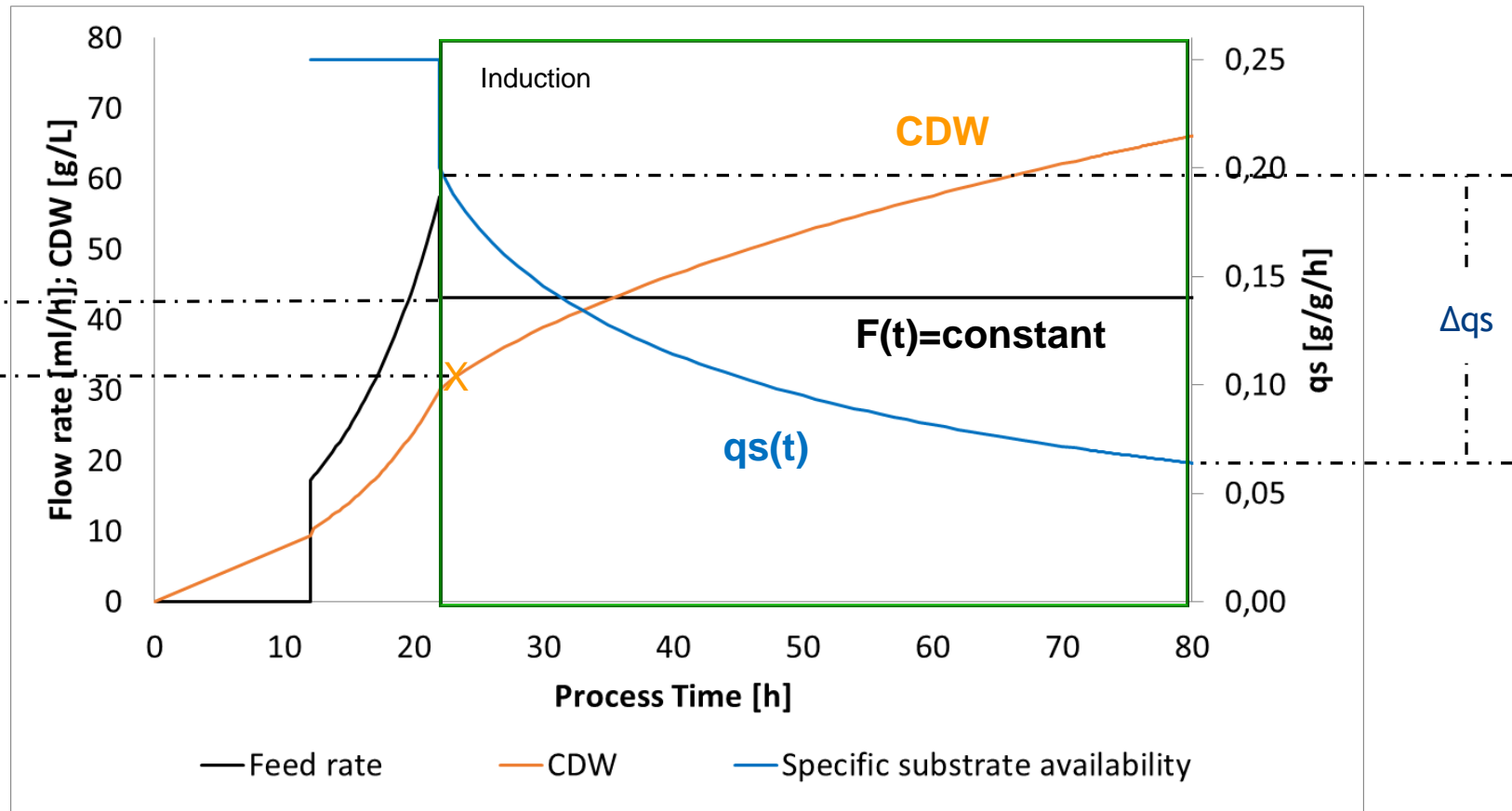
# All Good?



Simply Water? - See the shark? (Magic eye image)



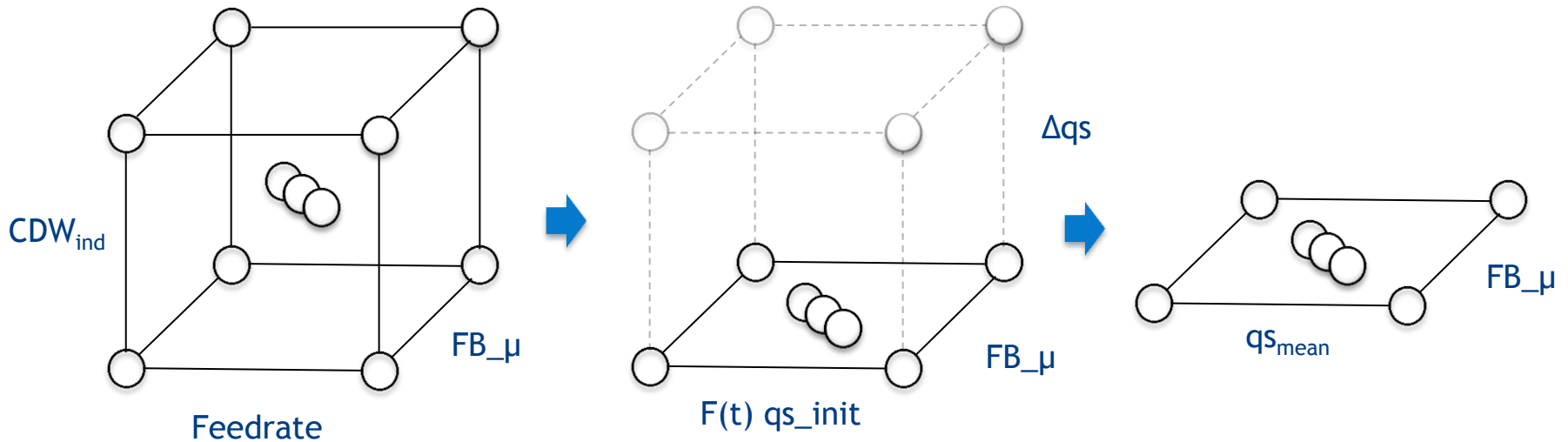
### Current Driver: Simplicity - constant Feed Rate



**Result: UNCONTROLLED decrease of  $q_s$  -  $\Delta q_s$**

addressing “hidden” factors

- From physiological factors to physiological descriptors
- Physiological CONTROL necessary



# Motivation

## Revisited



- Max. Productivity
- Constant product quality
- Robustness/Stable scale up
- Transferability of gained knowledge
  - Time to market
  
- **Problem statement of state of the art**
  - Uncontrolled/undefined physiological status of the culture
    - Hidden factors
  - Focus of feeding strategy is “the reactor”
  
- **Put the cells in the center of focus**





## Physiologically uncontrolled

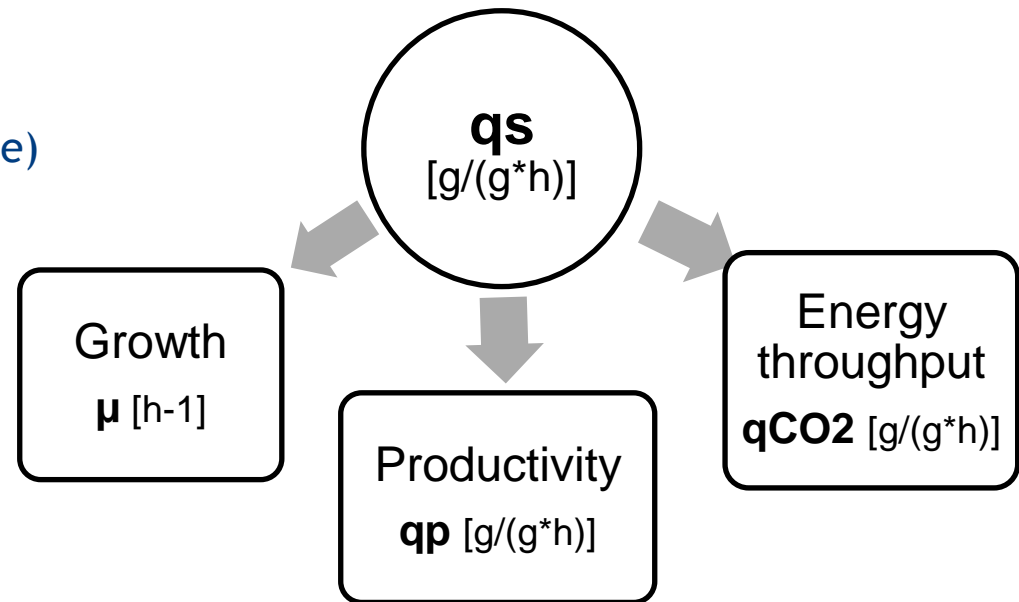
- E.g. volumetric constant feed
- Neglects cell physiology
- Poor process knowledge, unknown effect of physiological changes

## Physiologically controlled

- Dynamically adapted feed rate
  - Active control of cell physiology ( $\mu$ ;  $q_s$ ; ....)
  - Enhanced process knowledge
  - Scale Up/Transferability!
- » Which physiological variable to control?
  - » Requires online BM estimation

## Which physiological variable to control?

- Accessible specific rates:
  - $q_s$  (specific substrate uptake rate)
  - $\mu$  (specific growth rate)
  - $q_{CO_2}$  (specific carbon evolution rate)
- Common denominator:
  - Energy supply (feed)
- $q_s$  has the hierarchically highest position
  - Providing energy, growth independently
  - Online estimation and prediction of productivity possible



## Which physiological variable to control?

- Induction phase
  - Recombinant protein production competes with growth
  - $q_s/\mu = Y_{xs}(t)$  (variable!)

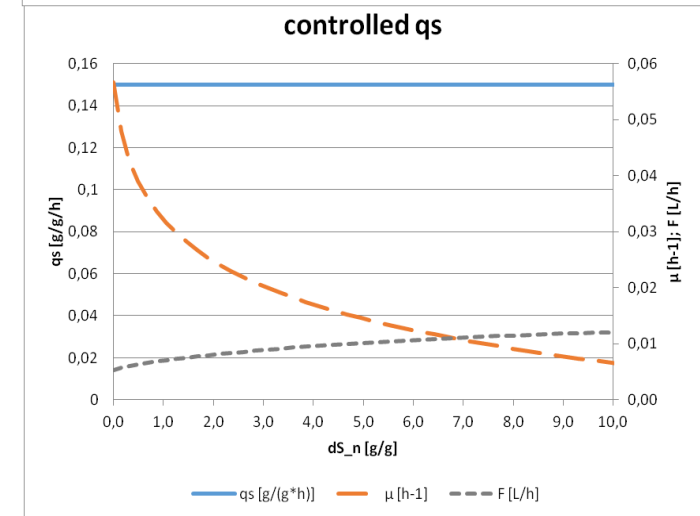
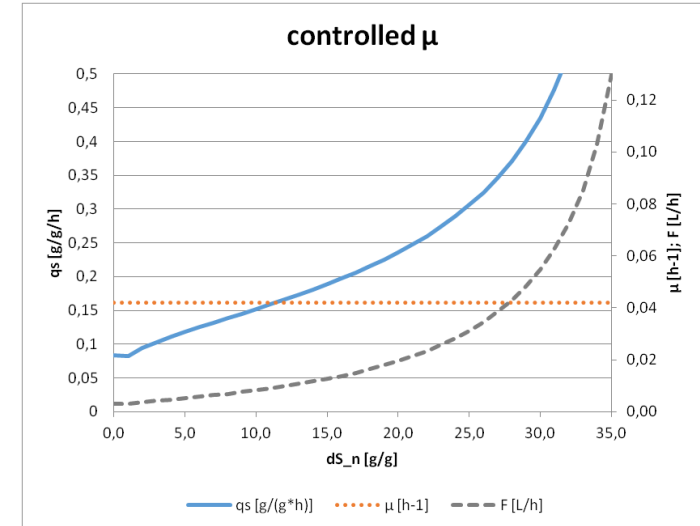
- $\mu$  Control during induction
  - Error prone BM estimation is used twice
  - $q_s$  - is boosted
  - Feedrates - technically not feasible!

$$\mu \left[ \frac{1}{h} \right] = \frac{r_x \left[ \frac{g}{h} \right]}{X[g]}$$

- $q_s$  Control during induction
  - Error prone BM estimation is used once
  - Steady  $\mu$  decrease
  - Feedrate increase of low dynamics

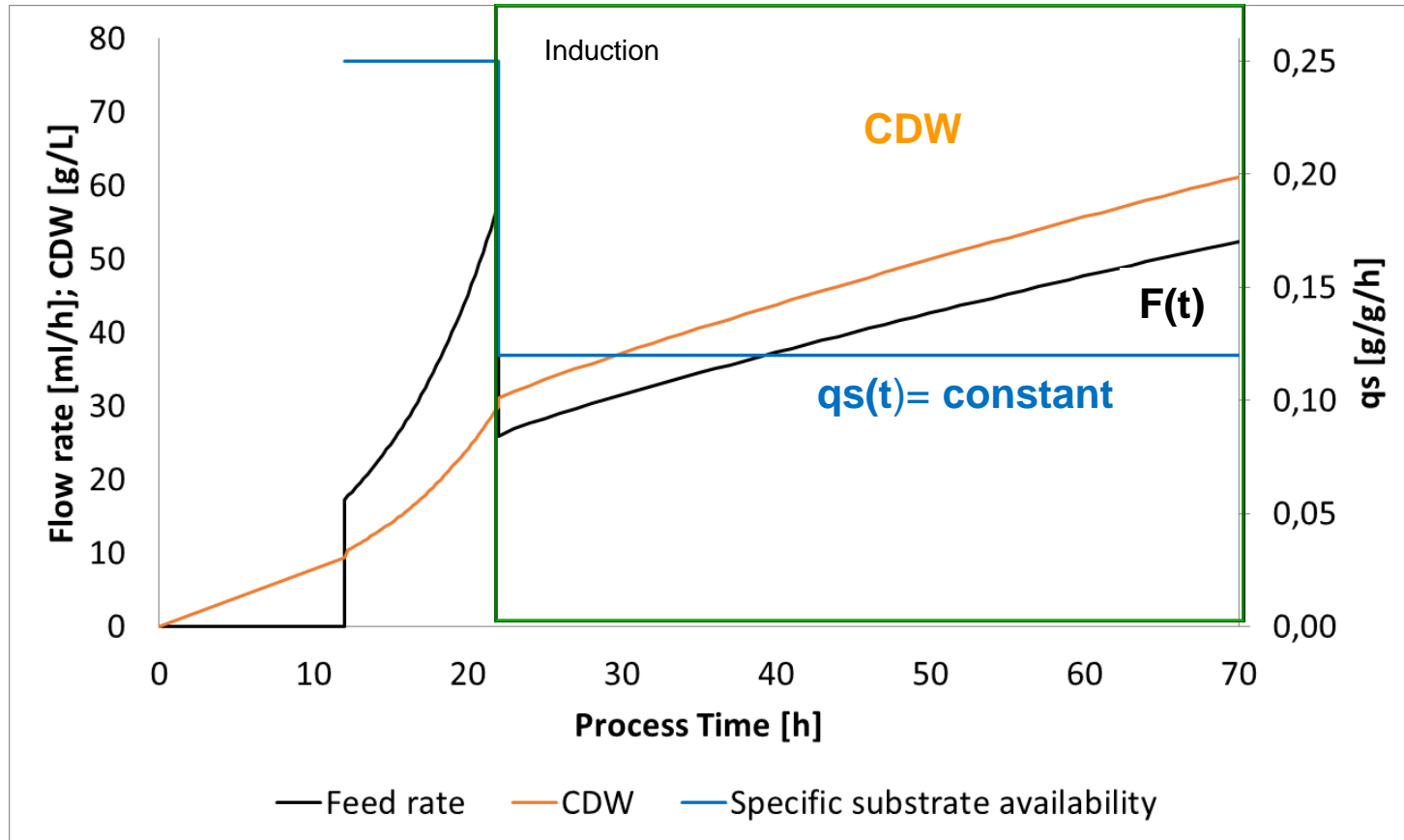
$$q_s \left[ \frac{g}{g \cdot h} \right] = \frac{r_s \left[ \frac{g}{h} \right]}{X[g]}$$

➤  $q_s$  control appears technically more feasible



Which physiological variable to control?

## Controlling Physiology



## Required BM Estimation

- Problem statement
  - $q_s$  control requires BM estimation for dynamic feed rate adaption

$$F(t) = \frac{q_s * X(t) * \varphi}{c}$$

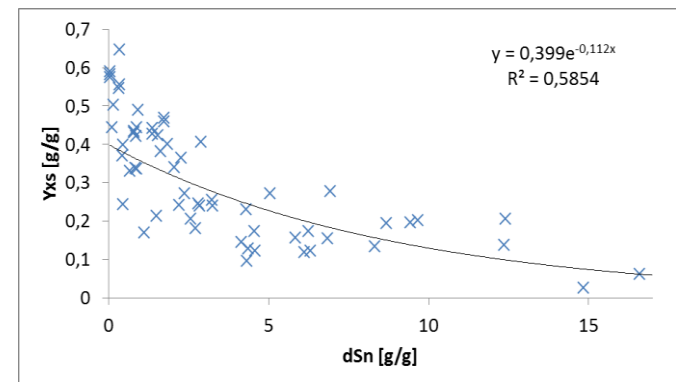
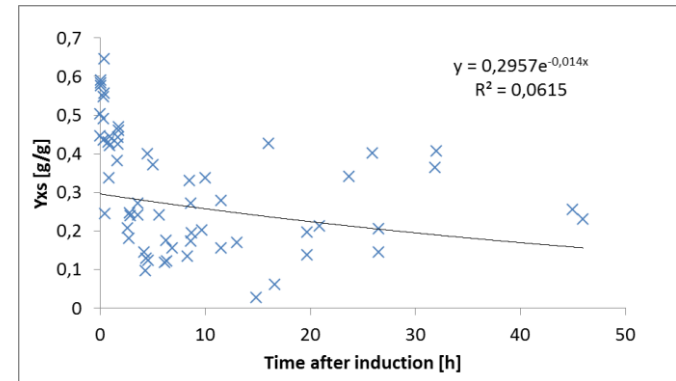
$F(t)...$	<i>Flow rate [g/h]</i>
$X(t) ...$	<i>Biomass [g]</i>
$c...$	<i>Feed concentration [g/L]</i>
$\varphi ...$	<i>Density Feed [g/L]</i>
$q_s...$	<i>specific substrate rate [g/g/h]</i>

- Output:
  - Substrate feed rate  $F(t)$  [g/h]
  - Feeding rate needs to be adjusted for changes in  $BM(t)$
  - Calculation cycle for  $F(t)$  every 5 min
- Required Inputs:
  - Accurate biomass estimation is required ->  $BM(t)$
  - Reactor content monitoring (Biomass reduction; sampling)



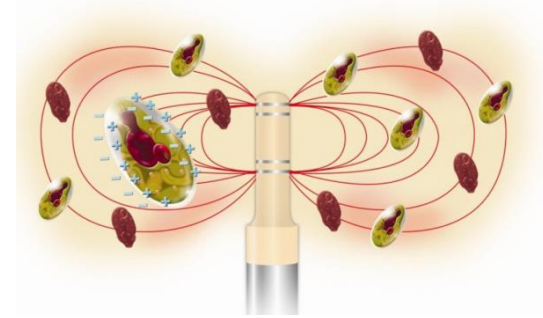
### Y<sub>x/s</sub> trajectory based control principle:

- Y<sub>x/s</sub> trajectory function based on historical data
- Y<sub>x/s</sub> as a function of the fed substrate (dS<sub>n</sub>)
  - Fed substrate is normalized on BM @ induction -> dS<sub>n</sub>
  - a dimension to quantify the cell age/experienced metabolic stress
- Open loop controller (no feed back loop)
  - beforehand feed profile calculation

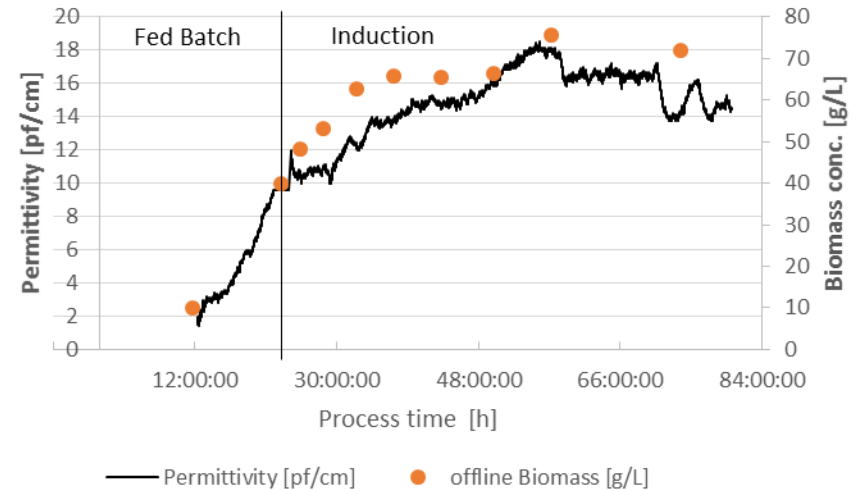


### BM estimation via permittivity measurement

- **Measurement principle:**
  - Permittivity ~ capacitance of liquids [pf/cm]
    - Resistance to a spreading electric field
  - Cells have a transmembrane potential dependent on the fitness of the cell
    - Integer cells act as condensers (Energy retention)
  
- **Biomass estimation:**
  - Permittivity signal correlated to viable Bio-volume
  - Bio-volume = Biomass dry-weight
    - Assuming a constant bio-density
  
- **Obligatory Inputs**
  - Permittivity signal
  - Correlation of permittivity and BM dry weight
    - Requires a calibration

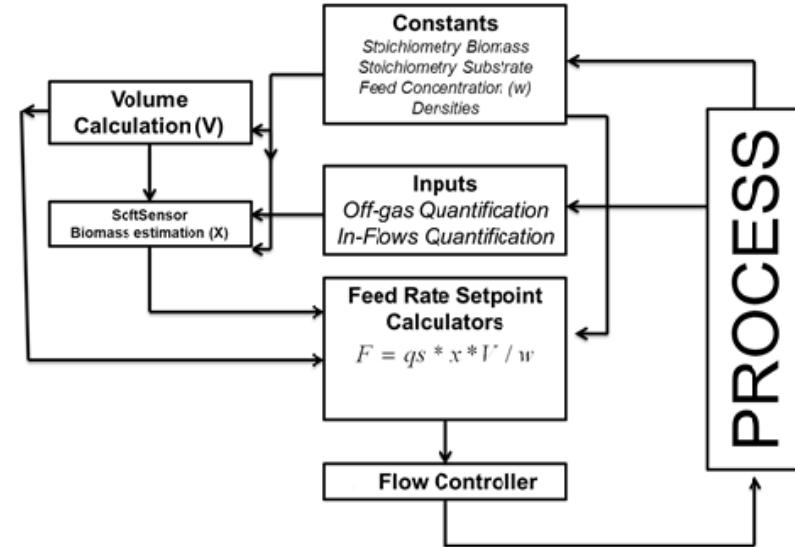


Aber Instruments Ltd, Aberystwyth, Wales



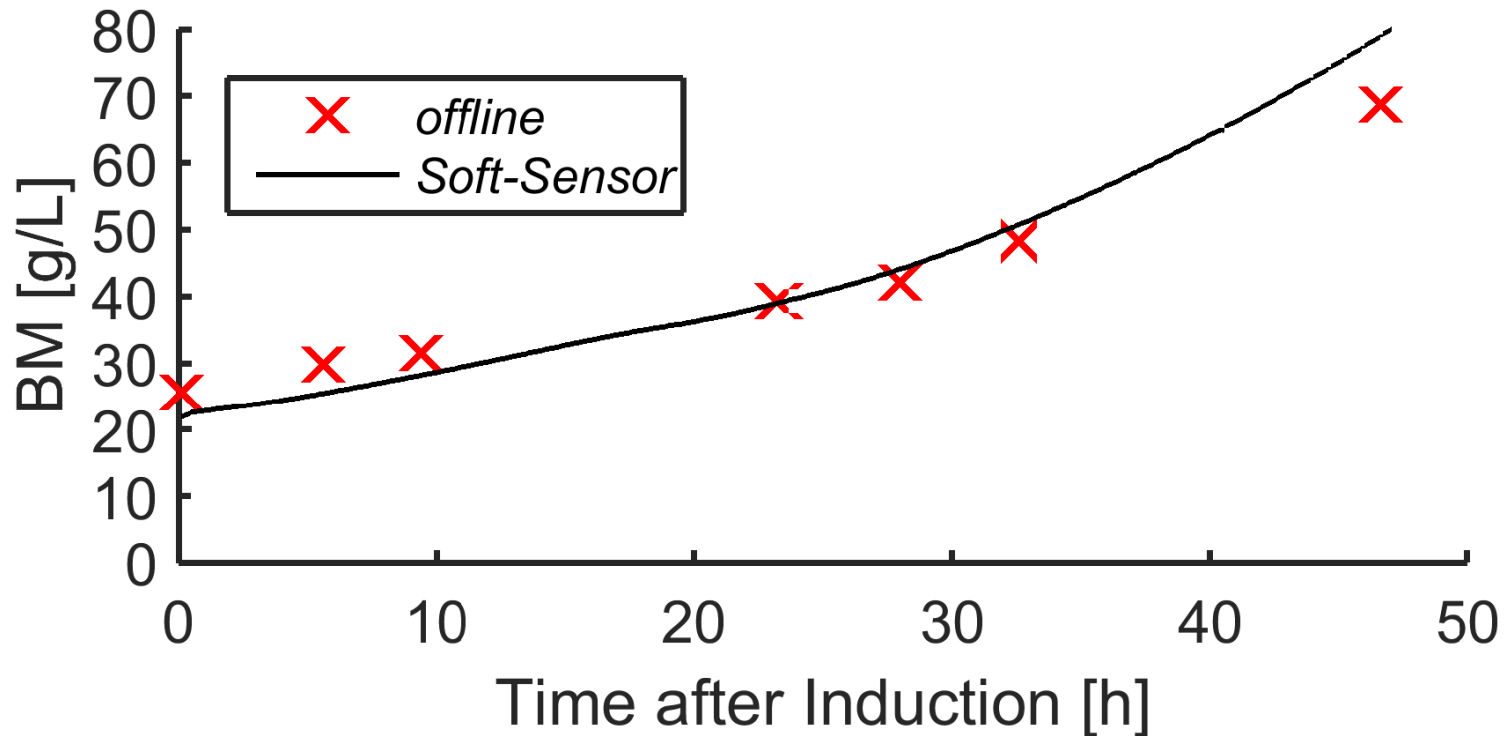
### Biomass estimation via Balancing (Softsensor)

- Measurement principle:
  - Real time  $rX$  estimation in time increments ( $dt$ ) based on balances;
    - $C_{in} - C_{out} = C_{bound}$  (elementary balance)
    - $Do_{Rin} - Do_{Rout} = Do_{Rreactor}$  (electron balance)
- Biomass estimation:
  - Integration of  $rX$  over  $dt$  yields incremental BM production
  - Cumulation of increments for total BM estimation
- Obligatory Inputs
  - Feed conc./ density
  - Stoichiometry of BM + BM at softsensor start
  - Measured variables
    - $CO_2/O_2$  concentration Offgas
    - Flow IN (Feed/Gas)/Flow OUT (Gas/Sample)



Sagmeister et. al. soft sensor assisted dynamic bioprocess control: Efficient tools for bioprocess development (2013)

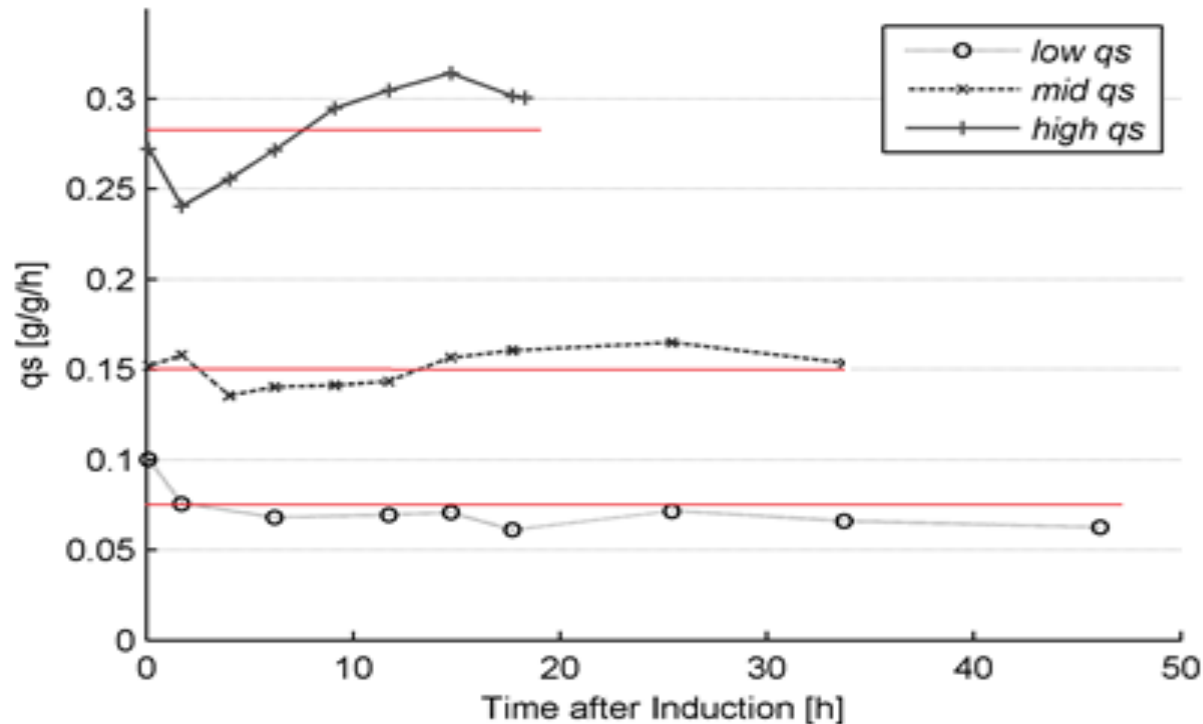
## Required BM Estimation



Transferability! → Data from Transfer to Industrial environment!

## Soft-sensor: real $q_s$ trajectories

- $q_s$  closely controlled
- $q_s$ -control is compromised when approaching  $q_{s,max}$



## Required BM Estimation

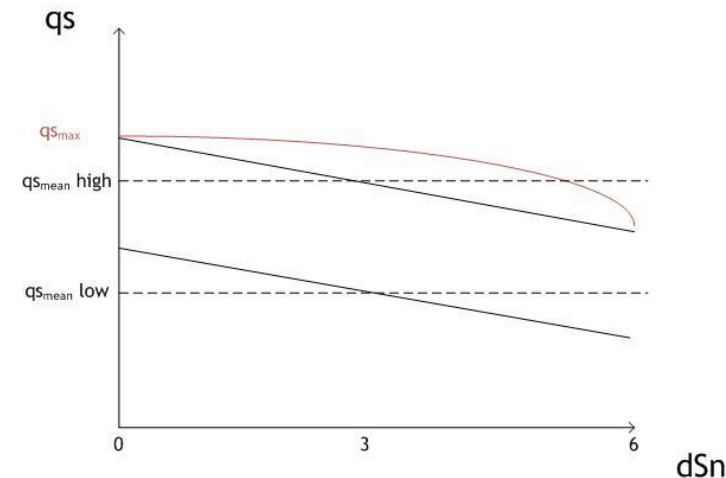
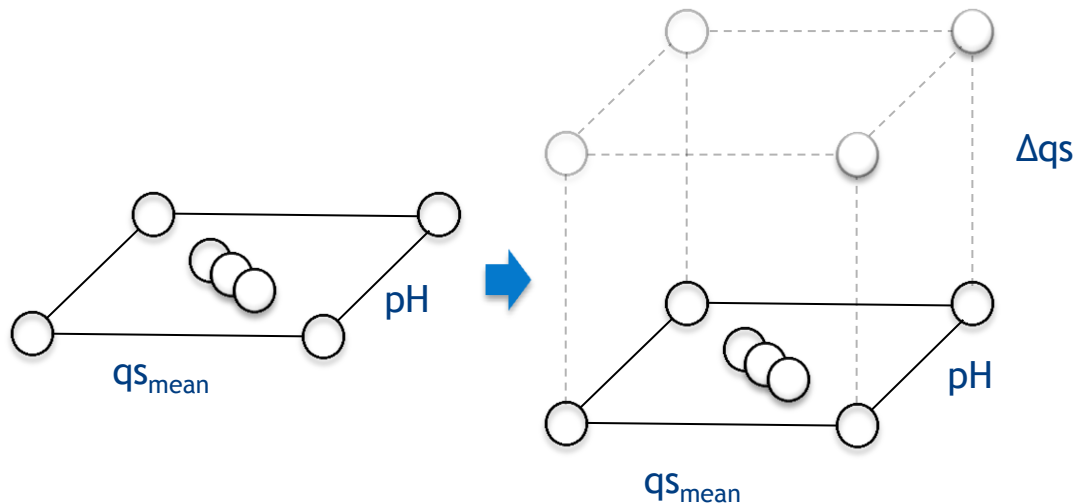
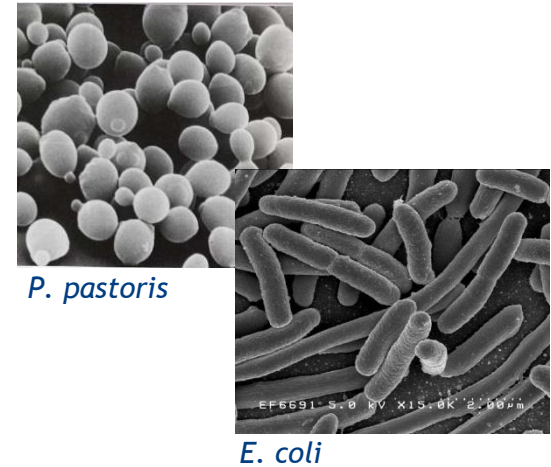
	Y <sub>x/s</sub> trajectory	Soft sensor	Permittivity
Principle	Biomass estimation through Y <sub>x/s</sub> trajectory	Elemental balance based, non-invasive, real time measurements	Biomass - permittivity signal correlation
Implementation effort	Low costs No additional equipment/ Software	Low cost Software integration + Off gas analyzer	High cost hard type sensors needed (exclusive suppliers)
Accuracy	Sufficient with high process knowledge	Good Dependent on C-balance BM start point!	Good Calibration quality
Robustness	Low (open loop)	High, consistency check possible	Mid (closed loop) Signal highly sensitive
Transferability	Historical data required (Scale dependent?)	Highly transferable	Calibration not transferable

### Softsensor based control principle

- Transferability
  - Organisms (Tested for *E. coli*/*P. pastoris*)
  - Process Modes Batch/Fed Batch
- Usage for estimation of different physiological variables
  - Implement N-Balance for metabolite accumulation

### Additional degree of freedom for process development

- Used CONTROLLED dynamics
- Dynamic  $q_s$  trajectory (ramps/oscillations)



## Summary

- Controlled and defined culture state
  - Physiological state maintained during the process
  - Transferable concept
    - To industrial environment
    - Various physiological factors ( $\mu/q_s/q_{CO_2}$ )
- Ease bioprocess development
  - Additional degree of freedom for DoE`s
    - Clearly defined factors
    - High dynamic range
  - Exclusion/Elucidation of hidden effects
  - Controlled dynamics - benefit of physiological process control
    - Positive/ negative ramps
    - Mixed feed profiles