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# Quality by Design

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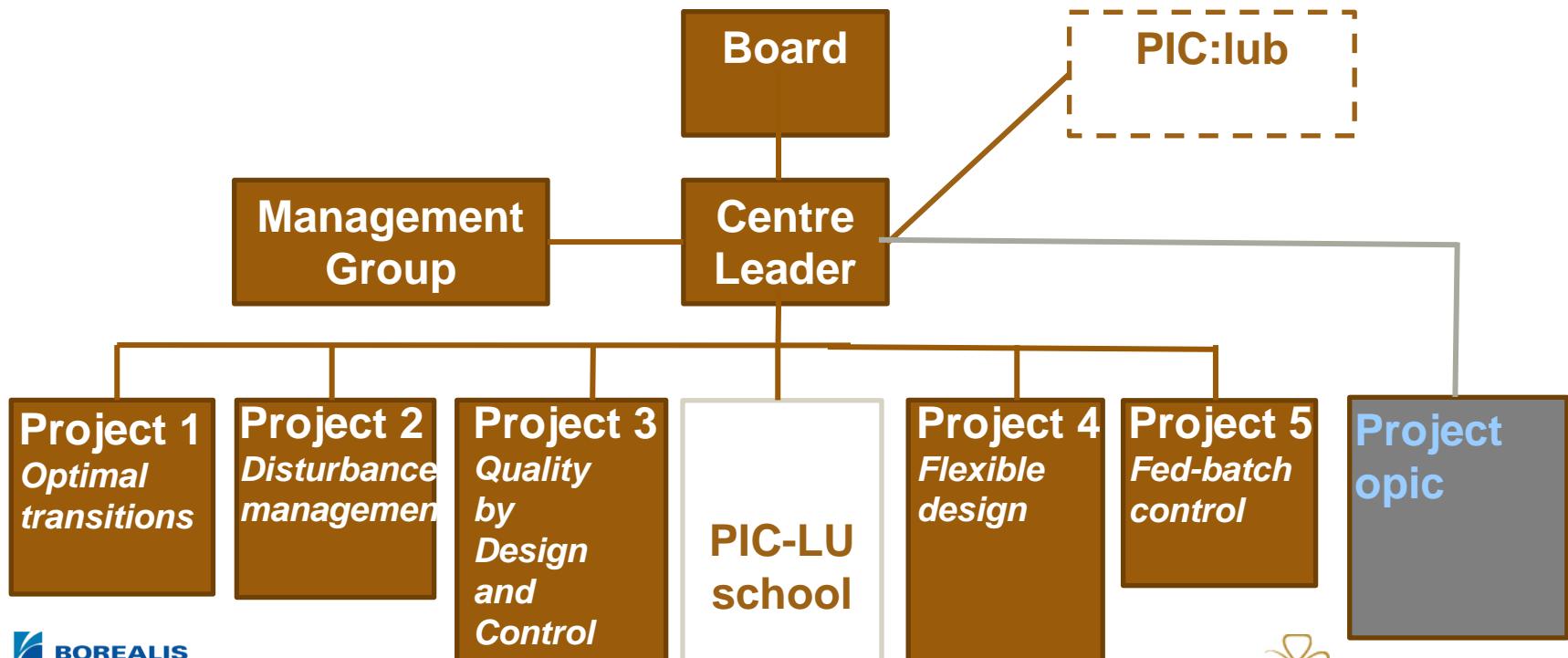


# Innehåll

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- PICLU projekt 3: *Quality by design and control*
- Biofarmaceutisk industri och “**Quality by Design**”
- Matematisk modellering vid Novo Nordisk
  - Case story
- Samarbetet mellan LU och NN
- Results

# Organisation – PICLU etapp2



 **BOREALIS**  
SHAPING the FUTURE with PLASTICS

 **Modelon**

 **SIEMENS**

 **pic**  
PROCESS INDUSTRY CENTRE

 **novo nordisk®**  
 **Pfizer**  
 **AMGEN**  
 **KNAUER**  
ASI - ADVANCED SCIENTIFIC INSTRUMENTS

 **K.A.Rasmussen**  
Norway

 **novozymes®**  
Rethink Tomorrow

 **Perstorp**  
WINNING FORMULAS

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 **AkzoNobel**  
Tomorrow's Answers Today

# Organisation – PICLU etapp2

## Projekt 3 – Quality by Design and Control

### A) Modellbaserad produktionsdesign



### B) Modellering av proteinseparation



### C) Tekniköverföring Verktyg, metodik & kurser



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Project  
Optimisation  
transitions

ct

BORE  
SHAPING the FUTURE  
*Moderne*

SIEMENS

pic  
PROCESS INDUSTRY CENTRE

storp  
FORMULAS

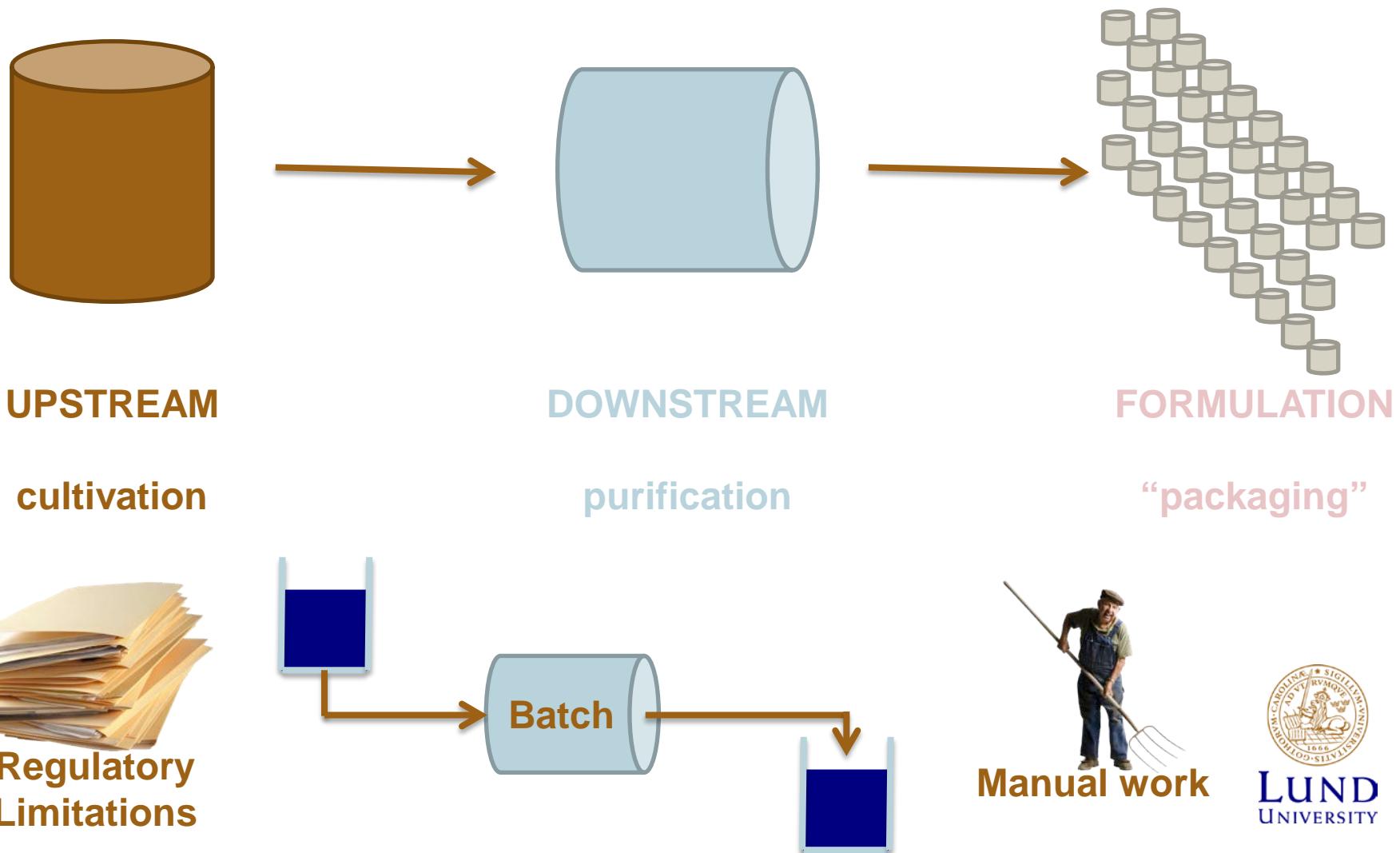
# Novo Nordisk at a glance



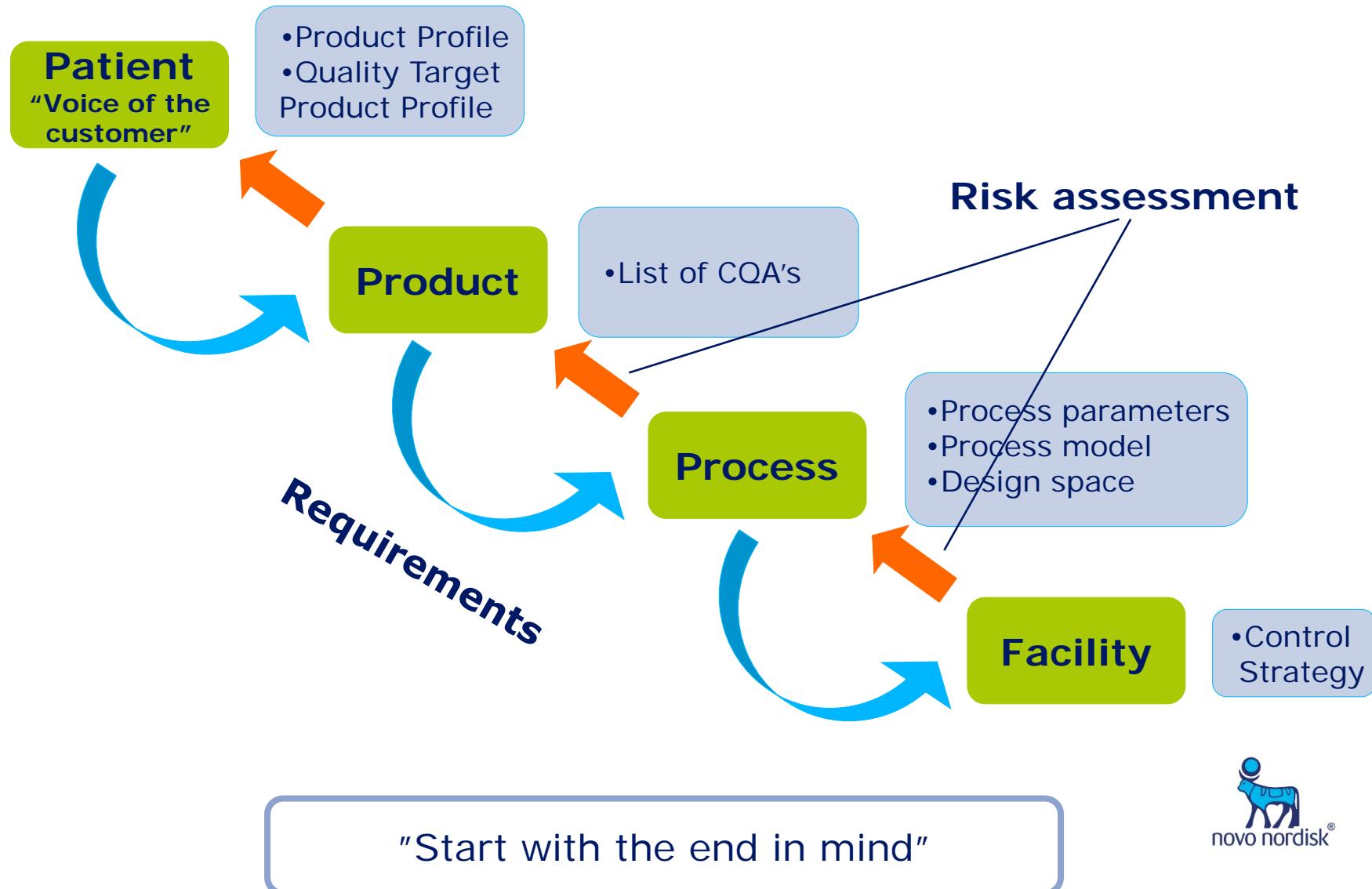
- More than 40,000 employees in 75 countries
- A world leader in diabetes care since 1923
- Leading position in:
  - Haemostasis management
  - Growth hormone therapy
  - Hormone replacement therapy
- Total net turnover (2013): ~84 billion DKK
- R&D spent (2013): ~12 billion DKK
- Committed to financial, environmental and social results



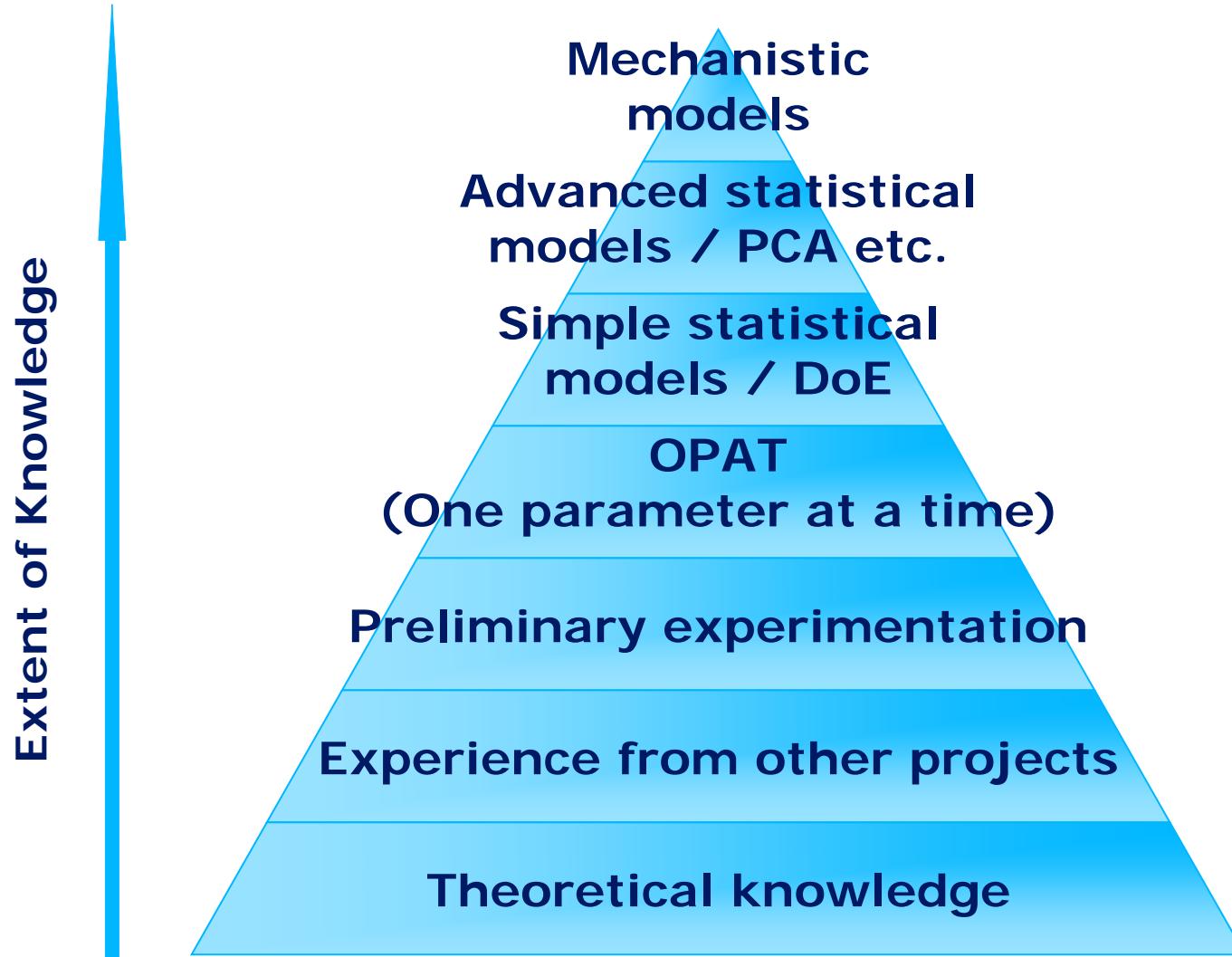
# Biopharmaceutical production



# QbD Governance / Risk Assessment



# Process Understanding



# Mathematical Modelling – Unit Operations

- Chromatography
  - Ion-Exchange (IEC) – mAbs, Haemostasis, insulin, GLP-1...
  - Size Exclusion (SEC) – Haemostasis
  - Hydrophobic (RP/HIC) - Insulin
  - Multi-Modal (MM) – Hæmostasis, Fab fragments...
  - Affinity (AC) – Haemostasis
  - Scaling – "All"
- Chemical Reactions/Modifications
  - PEG-modifications – Haemostasis
  - Acylations – Insulin, GLP-1
  - Enzymatic reactions etc. – Hæmostasis, hGH, Diabetes...
- Formulation
  - Stability – "All" (e.g. mAbs, Insulin...)
- Membrane Processes
  - Filtration and virus filtration – hGH, "Vira"...
- Other Opportunities
  - Centrifugation, Crystallisation, Precipitation, Freeze/Spray-Drying



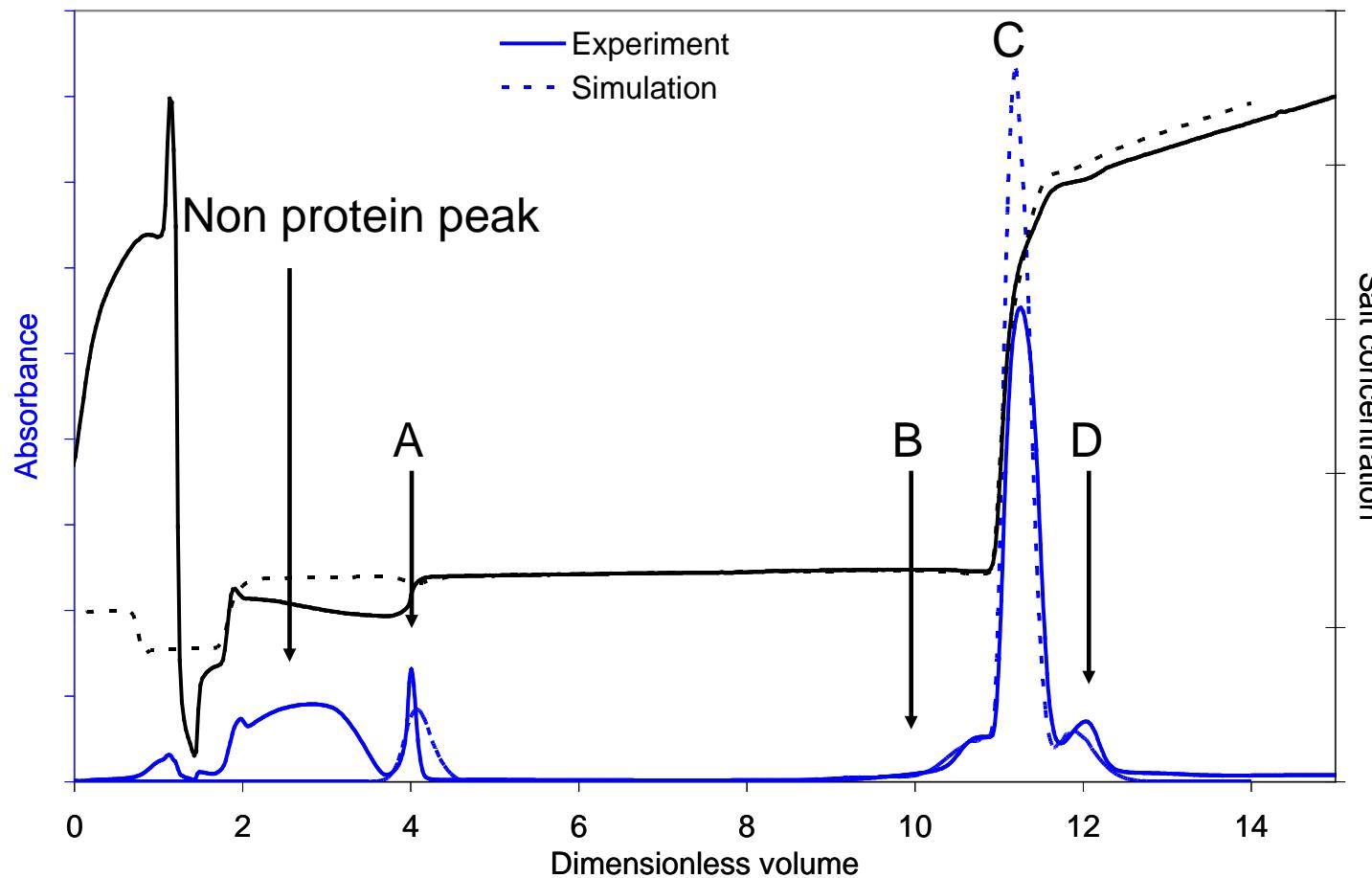
# Mathematical Modeling - Use

- Process and analytical development
- Process optimisation
- Process validation/challenge and critical parameters
- Plant design
- Process control (PAT)
- Trouble shooting and deviation handling
- Process understanding and Design Space
- Scaling of chromatography



# Case Story: IEC Process, Trouble shooting

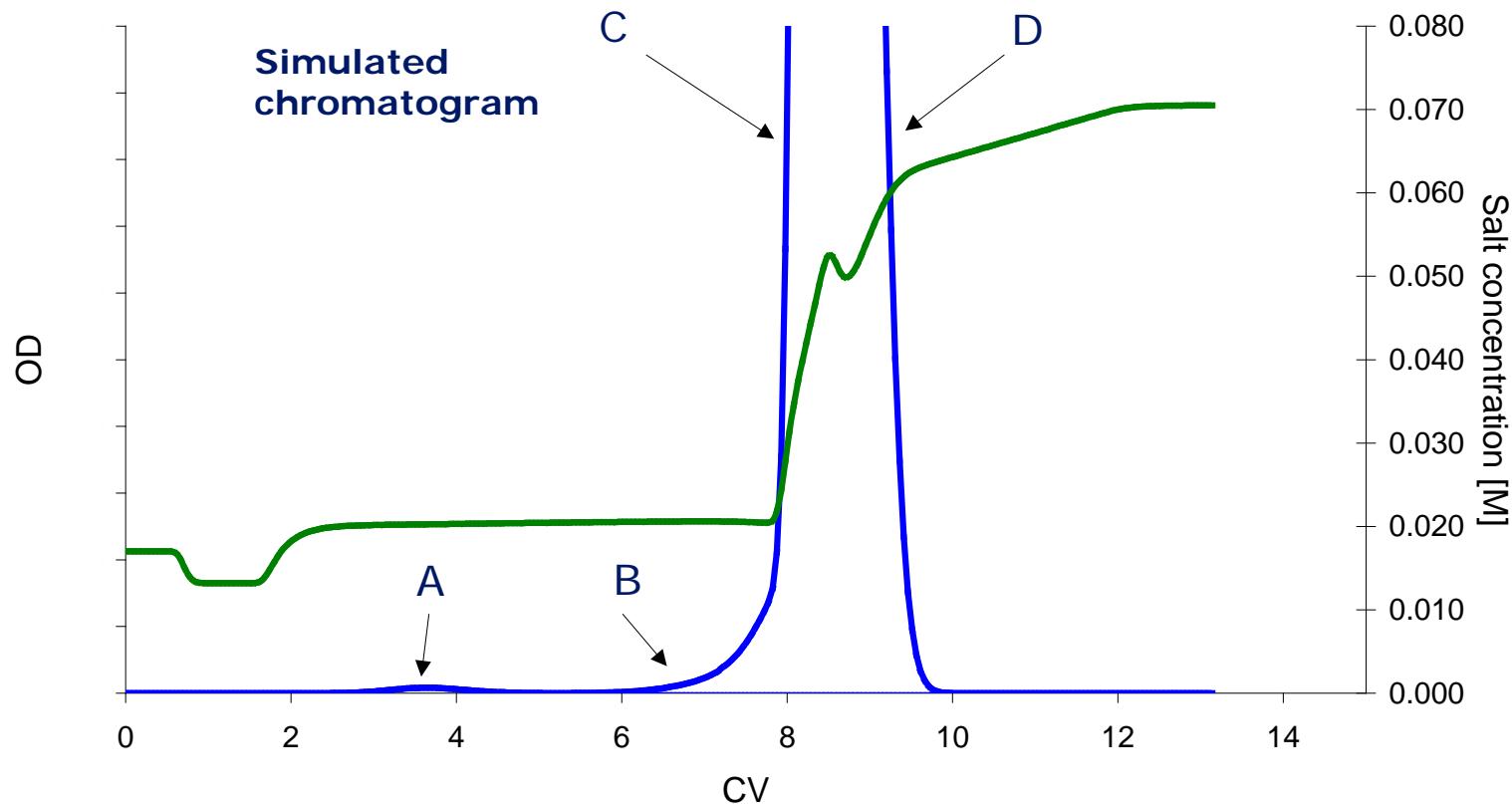
Starting material: 81% C, 8% A, 2% B and 9% D



*Simulation and standard process compared*

# Case Story: Reaction on previous step went wrong:

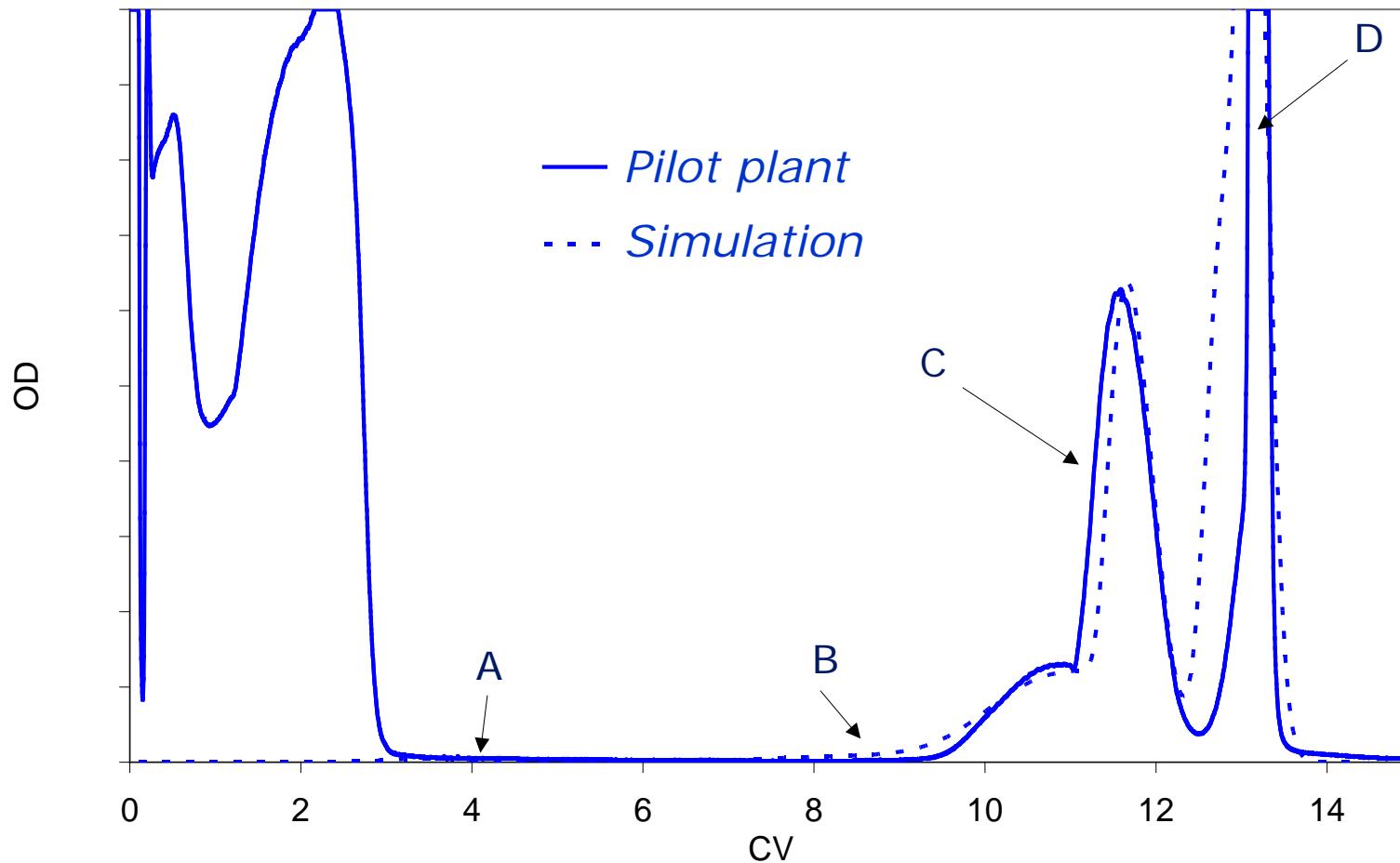
Starting material: 39% C, 1% A, 1% B and 59% D



*Standard method process A*



# Case Story: New in-silico process



*Simulation and process compared*

# Case Story: Results

After last step	Purity [%]	D [%]	B [%]	Yield [%]	Other
Standard method*	96.9	0	1.04	75	2.06
Modified method	97.5	0	0.83	68**	1.67

*Comparison between new and standard method*

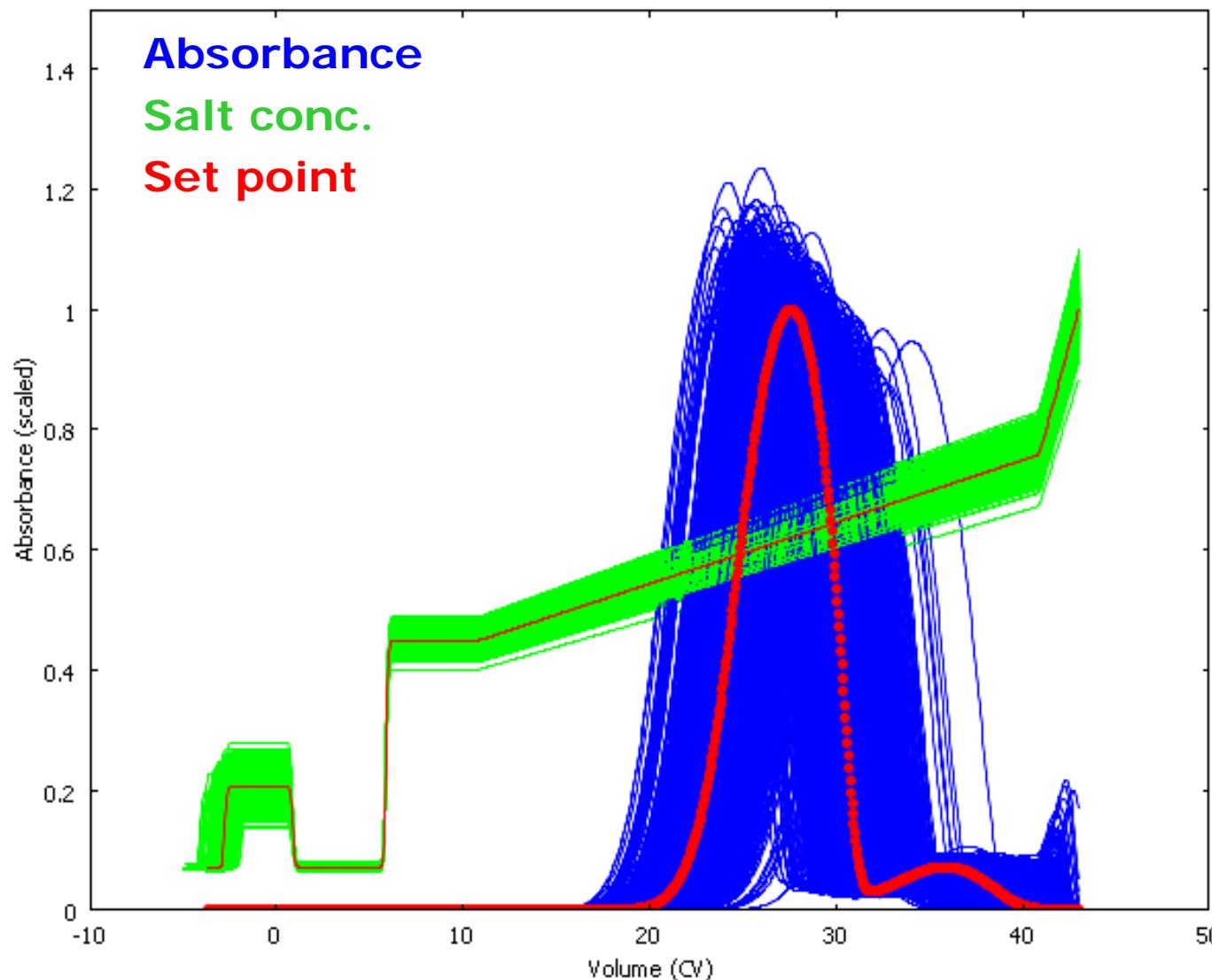
*\* Mean of all batches*

*\*\* Loss due to low load (loading on total polypeptide concentration)*

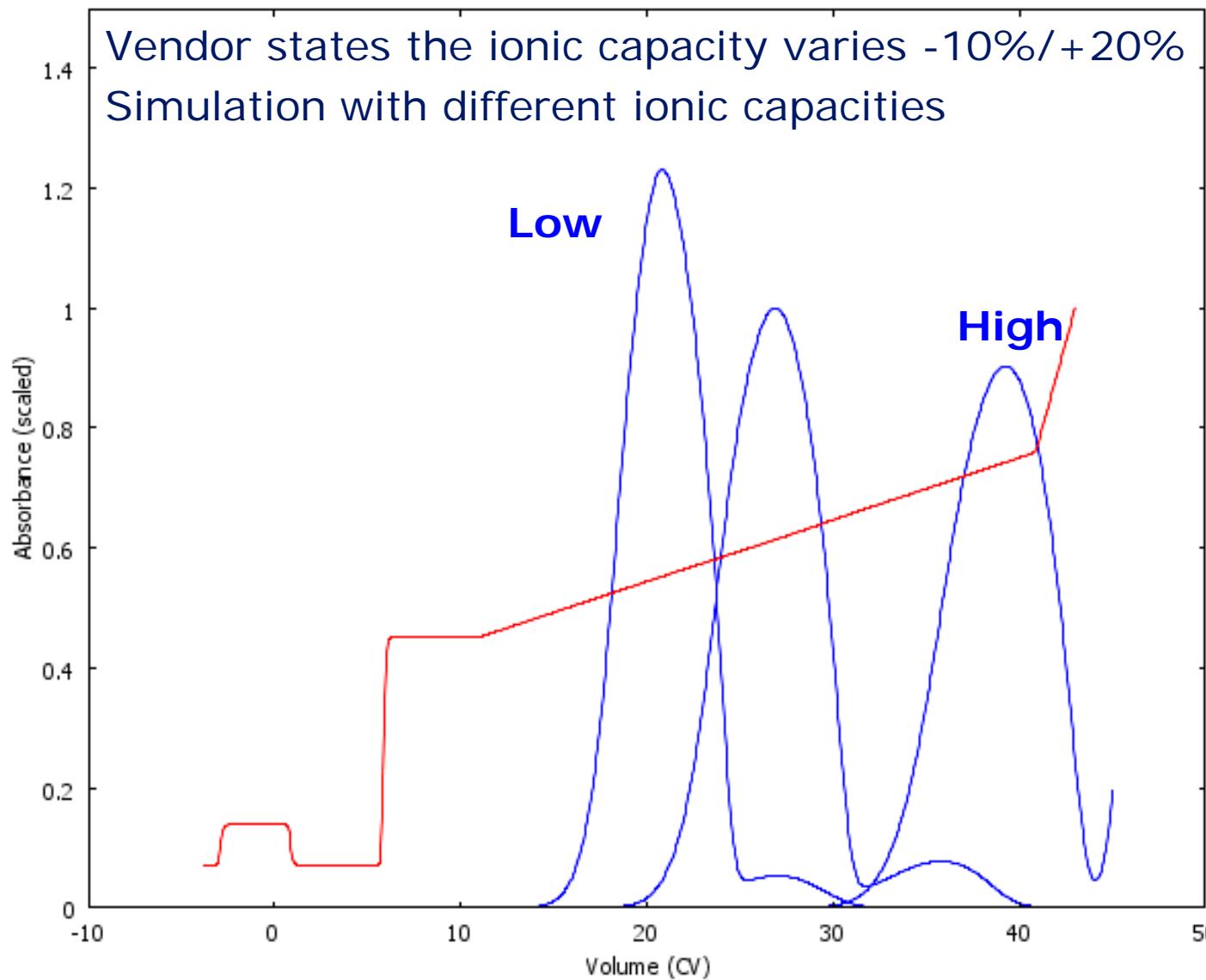
- More pure than normal
- Lower yield
- The batch was released



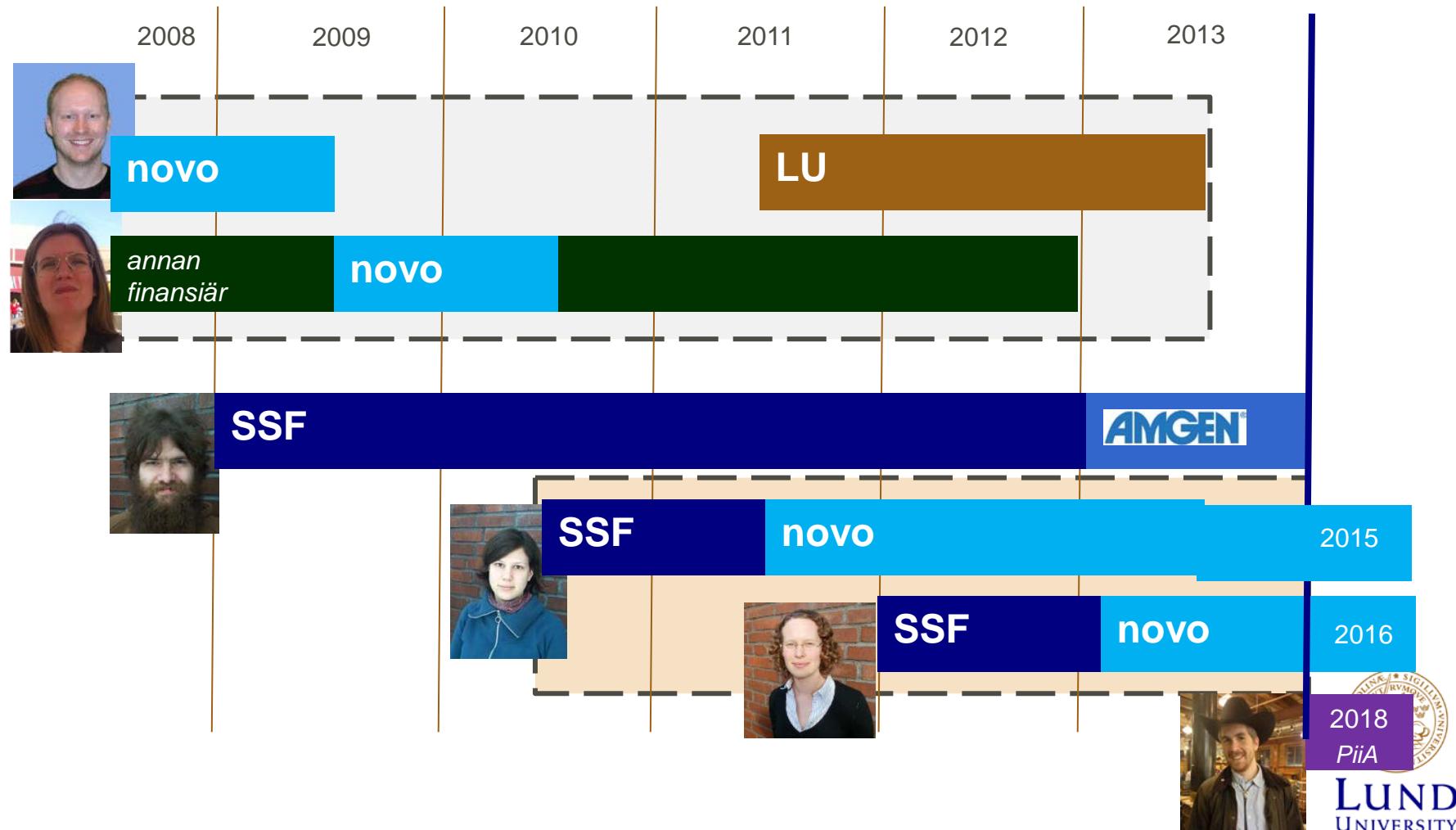
# Other Applications: Simulated elution profile



# Other Applications: Resin Properties



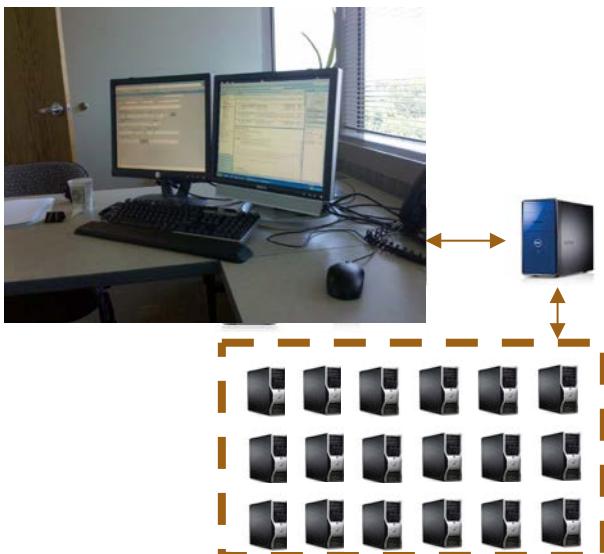
# Personer och delprojekt



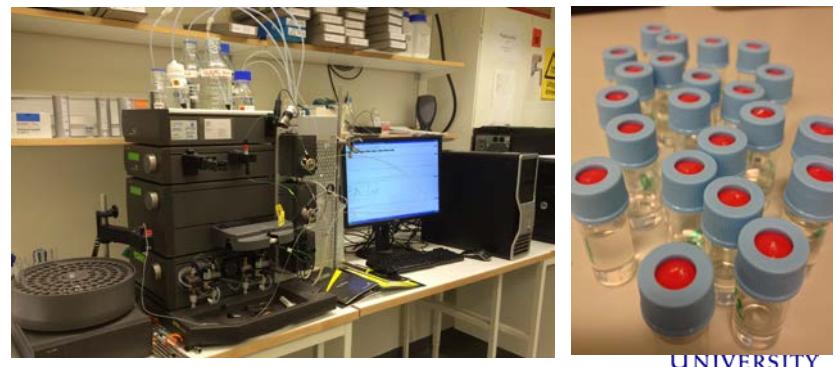
# Samarbetsprojekt

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- **Modellbaserad design**
  - Gemensam problemformulering
  - **Problemlösning, LU**
  - Tekniköverföring, NN



- **Modellering**
  - Gemensam problemformulering
  - **Experimentella studier, NN**
  - Modellering, LU



# Doktorer och doktorander

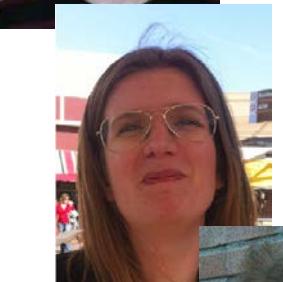
- **Marcus Degerman**  
(PhD 2008-2009, postdoc 2011-2013)

*Design of robust preparative chromatography*



Novo Nordisk  
Softhouse

- **Karin Westerberg** (2008-2012)  
*Modeling of quality and safety in biopharmaceutical production process*



Amgen

- **Niklas Borg** (2008-2013)  
*Modeling and calibration of preparative chromatography*



HiQ

- Frida Ojala (2010-**2015**)  
Modeling of protein aggregation
- Karolina Johansson (2011-**2016**)  
Modeling of hydrophobic interactions
- **Anton Sellberg** (2014-2018)



# Examensarbeten inom projekt 3

- 1) **Niklas Borg** (2008), Fast model calibration...
- 2) Fredrik Nielsen (2009), Optimization of ion-exchange... (**Novo**)
- 3) **Niklas Andersson** (2009), Simulation of continuous chromatography...
- 4) Marcus Almqvist (2009), Modeling and calibration ... using gProms
- 5) Mikael Edmundsson (2011), Metodik för modellkalibrering...
- 6) **Karolina Johansson** (2011), Flexible pooling... (**Pfizer**)
- 7) Alex Olsson (2012), Calibration and optimization... (**Novo**)
- 8) Peter Fransson (2012), Robust optimization...
- 9) Owais Sulehria (2012), Data to Knowledge...
- 10) Bruno Otero Garcia (2013), Optimization of two connected steps... (**Novo**)
- 11) **Anton Sellberg** (2013), Design space...
- 12) Emil Håkansson (2013), Simulated moving bed... (**ETH, Novartis**)
- 13) André Bugge (pågår), Optimization of integrated separation... (**Novo**)



# Publikationer – i tidskrifter

1. F. Ojala, M. Degerman, T. Budde Hansen, E. Broberg Hansen, B. Nilsson:  
**Prediction of IgG1 aggregation in solution.**  
*Biotechnology journal*, (Online April 24, 2014), 2014.
2. B. Otero, M. Degerman, T. Hansen, E. Hansen, B. Nilsson:  
**Model-based design and integration of a two-step biopharmaceutical production process.**  
*Bioprocess and biosystems engineering*, (Online March 2014), 2014.
3. N. Borg, K. Westerberg, N. Andersson, E. von Lieres, B. Nilsson:  
**Effects of uncertainties in experimental conditions on the estimation of adsorption model parameters in preparative chromatography**  
*Computers & Chemical Engineering*, 55 148-157, 2013.
4. K. Westerberg, E. Broberg-Hansen, L. Sejergaard, B. Nilsson:  
**Model-based risk analysis of coupled process steps.**  
*Biotechnology and bioengineering*, 110(9) 2462-2470, 2013.
5. K. Westerberg, E. Broberg Hansen, M. Degerman, T. Budde Hansen, B. Nilsson:  
**Model-Based Process Challenge of an Industrial Ion-Exchange Chromatography Step**  
*Chemical Engineering & Technology*, 35(1) 183-190, 2012.
6. K. Westerberg, N. Borg, N. Andersson, B. Nilsson:  
**Supporting Design and Control of a Reversed-Phase Chromatography Step by Mechanistic Modeling**  
*Chemical Engineering & Technology*, 35(1) 169-175, 2012.
7. K. Westerberg, M. Degerman, B. Nilsson:  
**Pooling control in variable preparative chromatography processes.**  
*Bioprocess and biosystems engineering*, 33 375-382, 2010.
8. M. Degerman, K. Westerberg, B. Nilsson:  
**Determining Critical Process Parameters and Process Robustness in Preparative Chromatography - A Model-Based Approach**  
*Chemical Engineering & Technology*, 32(6) 903-911, 2009.
9. M. Degerman, K. Westerberg, B. Nilsson:  
**A Model-Based Approach to Determine the Design Space of Preparative Chromatography**  
*Chemical Engineering & Technology*, 32(8) 1195-1202, 2009.
10. M. Degerman, N. Jakobsson, B. Nilsson:  
**Designing robust preparative purification processes with high performance**  
*Chemical Engineering & Technology*, 31(6) 875-882, 2008.
11. + två under review
12. + ytterligare två manuskript

4 (av 10) artiklar  
tillsammans  
med Novo Nordisk



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# Sammanfattning

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- Samarbetet mellan LU och Novo Nordisk
  - Gemensamma problemformuleringar
  - Mycket arbete av doktorander vid Novo Nordisk
  - Resultat "överförs" till Novo Nordisk.  
Novo fortsätter utvecklingen för "industrianpassning"
  - Gemensamma publikationer
- Novo har haft möjligheten att sätt in resurser,  
egna och vid LU.

Projektet har karakteriseras av  
**Långsiktig och ömsesidig kompetensutveckling**