

Department of Biochemical and Chemical Engineering Process Dynamics and Operations Group (DYN)

Time-optimal Control of Emulsion Co-polymerization by Tracking Necessary Conditions of Optimality

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- Emulsion polymerization
- Control approach
- Conditions for time-optimal operation
- Estimation approach uncertainties
- Performance of the control approach
- Summary



Time-optimal Control of Emulsion Co-polymerization



Emulsion polymerization

- Important industrial process for production of dispersed macromolecules
- Environmentally friendly due to use of water as a solvent
- High degrees of polymerization possible
- Relatively low-viscosity product
- Favorable chemical properties (e.g. high molecular weights)
- Applications
 - Adhesives
 - Paints
 - Polymer films
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Emulsion Polymerization

- 1. Mixing of water and monomer
 - Formation of two liquid phases with relatively large droplets (μm – mm)
- 2. Addition of emulsifier
 - Very small droplets (micelles, d≈10nm) develop
- 3. Addition of water-soluble initiator
 - Reaction starts in the water phase
 - Polymer chains are formed
- 4. Polymer precipitates and forms particles
 - Particles are the main location of polymerization
 - Monomer and radicals diffuse through the water phase into the particles
 - Monomer phase vanishes (starved conditions)
- Multiphase semi-batch process
- Products-by-Process: End-use properties are determined by process conditions





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Goal

- Development of a control strategy for emulsion copolymerization featuring
 - Time-optimal operation to increase productivity
 - Satisfaction of quality constraints (copolymer composition, molecular weight distribution)
 - Capability to cope with fast disturbances (e.g. stirrer breakdown, feed pump failures)
 - Capability of coping with slow disturbances (e.g. caused by fouling)
 - Ease of implementation
 - Acceptable for operators



Time optimal control

Task:

- Time-optimal control while achieving quality constraints:
 - Molecular Weight Distribution (MWD)
 - Copolymer Composition Distribution (CCD)

Concept:

- Drive the process along the constraints ^[1]:
 - Limited heat removal capacity of the reactor
 - Avoidance of a droplet phase because the reaction rate becomes uncontrollable if droplets are present

[1] R. Gesthuisen, S. Krämer and S. Engell (2004). Hierarchical control scheme for time-optimal operation of semibatch emulsion polymerizations. *Ind. Eng. Chem. Res.* 43, p. 7410.



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Control concept





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Off-line optimization





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Conditions for time optimal operation (I)

Avoidance of droplets

- The monomers distribute among the phases
- Monomer is not well soluble in water, excess monomer forms droplets
- From the phase distribution, conditions for the total holdups of the monomers in the reactor can be derived
- The volume of the polymer and of the monomer and the water in the reactor must be computed
- This is done by forward (open-loop) simulation based upon the estimated (total) conversion



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Conditions for time optimal operation (II)

- Limited heat removal capacity of the jacket cooling
 - Limited by the heat transfer coefficient k
 - Reaction rate depends on the monomer concentrations in the polymer and the volume of the polymer

$$\begin{bmatrix} M \end{bmatrix}_{\max}^{p} = \left(\sum_{i} \dot{V}_{in,i} \rho_{i} c_{p,i} \left(T_{R} - T_{in,i} \right) + kA\Delta T_{\max} \left(\frac{M}{Q_{R}} \right)^{p} \right)$$
$$n_{M}^{SP} = \varphi \begin{bmatrix} M \end{bmatrix}_{\max}^{p} \frac{V_{Pol}}{1 - \begin{bmatrix} M \end{bmatrix}_{\max}^{p} \overline{V}}$$

to be estimated



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Limitations of the Monomer Holdup

 Seeded semi batch emulsion polymerisation of Styrene (simulation)





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Control concept





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Hierarchical control approach (II)



Simulation Study

Investigated Process:

- Seeded semi batch emulsion polymerisation of Styrene (M) with Butylmaleate (CTA)
- Kinetic model based on Vicente et al. 2001, Li & Brooks 1993:
 - Differential equations for M, CTA, initiator, volumes of polymer & water, radical conc. in the water phase, average number of radicals per particle, conversion, MWD
 - Algebraic equations, e.g. phase distribution



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Model Equations

$$\begin{aligned} \text{Monomer Balance} \quad & \frac{d[i]^R}{dt} = \frac{1}{V^R} \left(-R_i - \frac{dV^R}{dt} [i]^R + \dot{n}_i \right) \text{ with } R_i = \sum_{j=1}^n k_{Pji} P_j [M^i]^p \frac{\overline{n}N_T}{N_A} \\ \text{Initiator Balance} \quad & \frac{d[I]^R}{dt} = \frac{1}{V^R} \left(-2fk_d [I]^R - \frac{dV^R}{dt} [I]^R \right) \\ \text{Volume Balances} \quad & \frac{dV^R}{dt} = \sum_i \dot{n}_i \overline{V_i} + \sum_i R_i M_i \left(\frac{1}{\rho_{Pol}} - \frac{1}{\rho_i} \right) \quad , \quad \frac{dV_P}{dt} = \sum_i \frac{R_i M_i}{\rho_{Pol}} \\ \text{Temperature Balance} \quad & \frac{dT_R}{dt} = \frac{1}{C_s} \left(\sum_i R_i (-\Delta H_i) + \sum_i \dot{n}_i M_i c_{p_i} (T_{Rin} - T_R) + kA(T_J - T_R) \right) \\ & \frac{dT_J}{dt} = \frac{1}{C_J} \left((T_{Jin} - T_J) - kA(T_J - T_R) \right) \end{aligned}$$

- + Phase distribution equations
- + Temperature dependent rate constants

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Simulation Study Homopolymerization

- Optimal trajectories of the molar amounts of monomer and CTA Set point
- Discrete time PI-controllers
- Anti-wind-up
- **Trajectories are** tracked well
- Difference between estimates and true values



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of Emulsion Co-polymerization

Simulation Study

Comparison of produced and desired MWD





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Experimental Work by Wolfgang Mauntz

Copolymerization of MMA with BA





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Results at the 10 I Pilot Plant



Results at the Pilot Plant





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Summary

- Emulsion polymerization is a challenging multiphase process
- New time-optimal control scheme based on the estimation of the monomer holdups and kA
- Simple SISO controllers used to implement the desired set-points, no nonlinear controllers needed
- Process constraints are met
- Product quality was good
- Future work: Transfer to industrial application
- Robustification by additional measurements
- Modeling and control of the particle size distribution

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