



#### FACULTY OF PROCESS AND SYSTEMS ENGINEERING

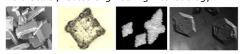
# Monte Carlo simulation of shape evolution in solutions A model study of BaSO4 precipitation

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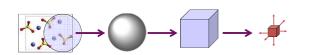
Systems Approach

### Motivation

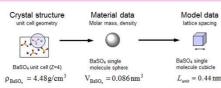
Crystallization is an established industrial production and separation technology for bulk chemicals, pharmaceuticals or agrochemicals Specific control of crystal size and crystal shape, plays an important role in achieving a high product quality in crystallization. A detailed understanding of the fundamental phenomena driving crystal growth is therefore crucial to design a tailor-made process environment where control of the crystal shape can be maintained with a desired accuracy. This requires an understanding of all different aspects from the atomic and molecular scales up to the process system level. Molecular modelling is therefore a major important part toward the completion of a multi scale process engineering methodology.



## Simulation basics



Approximation from complex molecular level to simplified mesoscale stochastic diffusion



Molecular and material data of Barium sulfate for estimation of scale

Solving time-independent Schrödinger equation Schrödinger equation Apply approximations like Born-Oppenheimer (mass difference) Use **simplifications** like Hartree-Fock Compare with experiments like attosecond laser pulse technology (COLTRIMS)

- Limited to - simple structures - small molecules - ground states

stationary states

 Use QM parameterized force fields
Solving complex systems of
equations of motion
Apply Newton's force law
Chose approximated potentials like Chose approximates -Lennard Jones Check simplifications to convert complex molecules into single beads Compare with dynamic experiment like surface growth AFM

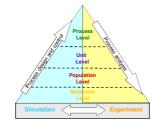
small time and length scales available force fields clean systems

Using parameterized probabilities from Evolving discrete entity systems with Monte Carlo simulation Use random number generators Use event probabilities for case differentiation i.e. face growth
Apply Boltzmann factors for event selection rules
Compare to dynamic experiments with real-time data

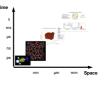
 Limited to mesoscale length and times available MD input data coarse-grained systems

# Molecular Modeling

Our multi level systems approach connects the different levels of a technical application from the top process level down to the molecular scale. We combine the system simulation based on a variety of models at process, unit, population and the molecular scale with well-designed experiments. The combination of data from simulation and experiment validates these models, enhances our understanding and generates new design pathways.



The time evolution of a crystal shape is driven by several phenomena. Convection and diffusion of molecules leads to transport in solution. This motion will lead to collision and binding of molecules to one another, the primary step for nucleation. Additional solute molecules will attach to the surfaces of such a nucleus in successive growth steps. This leads to face growth which depends on site binding energy as well as on the surface motion of molecules. The dynamical interplay of diffusion, nucleation and growth is key in understanding the dynamics of the crystal shape evolution in solution.

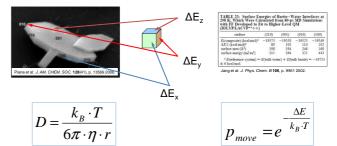


· Motion of BaSO<sub>4</sub> depends on molecule size r, viscosity  $\eta$  and temperature T via the Einstein-Smoluchowski diffusion constant D

- · Crystal growth of BaSO<sub>4</sub> depends on (i j k)-surface properties
- Free molecules attach to a crystal nucleus at different faces with different probability p

 $\cdot$  Monte-Carlo move probability  $p_{move}$  relates the energy difference ΔE between surface-free/surface-surface sites as a function of temperature T

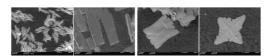
· Step-wise simulation of free diffusion, attachment and surface relocation for every molecule in a selected system box



 $BaSO_4$  molecule diffusion constant ...  $D \approx 10^{-9} \text{ m}^2/\text{s}$ •BaSO<sub>4</sub> radius ...  $r \approx 0.2 nm$ , viscosity of water ...  $\eta \approx 1 cP$ •Temperature ...  $T \approx 300K$ , Boltzmann constant ...  $k_B = 1.38 \cdot 10^{-23} J/K$ 

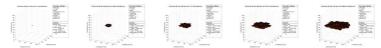
# **Experiment vs. Simulation**

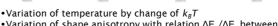
- Reactive crystallization experiments in a CSTR
- Mixing of water based BaCl2 and Na2SO4 solutions • Variation of process conditions like temperature,
- concentration, feed policy and stoichiometry Concentration between 0.01M and 0.3 M
- •Temperatures between 300K and 340K
- •Feed policy  $BaCl_2 \rightarrow Na_2SO_4$  or  $Na_2SO_4 \rightarrow BaCl_2$ Stoichiometry of 1:1 or 1:10 or 10:1
- Observation of crystals with REM microscopy



#### Monte Carlo simulation in closed box systems

• 3D cubic lattice basis or 3D hexagonal lattice basis with box size up to 500<sup>3</sup> •Variation of concentration with number of molecules inside box up to 1.000.000 •Observation of short and long time evolutions up to 1.000.000 steps





•Variation of shape anisotropy with relation  $\Delta E_z / \Delta E_x$  between 1 and 0.1

•Variation of initial nucleation shape from cubic to plate to hexagonal

