

Dimension reduction of two-dimensional population balances based on the quadrature method of moments

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Motivation

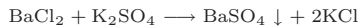
- Crystal production for chemical and pharmaceutical products
- Quality criteria - Control of crystal size distribution and **crystal shape distribution**
- Process design and process control via modeling and simulation
- Employment of population balance equations (PBE) for crystallization modeling
- Shape-dependent crystal growth leads to **multi-dimensional** PBE
- Solution of multi-dimensional PBE → **complex and numerically advanced problem**
- Model reduction via moment methods → application of quadrature method of moments (QMOM)
- Loss of information due to QMOM application → volume-dependent information usually **not available**

Aim of the Research

- Application of **advanced** QMOM method
- Simplification of two-dimensional PBE to a → **one-dimensional advection system**
- Restoration of **volume-dependent** information
- Calculation of crystal volume distribution and volume-dependent properties → **now possible**

Experimental data on shape-dependent growth of crystals

- Bulk precipitation [1] or emulsion-based precipitation [2,3] of → **Barium sulfate crystals**



- crystal shape observation via microscopy (i.e. TEM, REM)

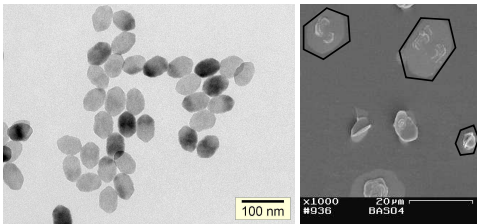


Figure 1: Left: TEM picture of Barium Sulfate crystals from an emulsion-based precipitation process; Right: REM picture of Barium Sulfate crystals from a bulk-phase precipitation.

- Assumption of self-similar hexagonal shape**
- Experimental shape observation

- variable width L_1
- corresponding $L_3 = 2L_1$ and $L_4 = 1.5L_1$
- variable thickness L_2

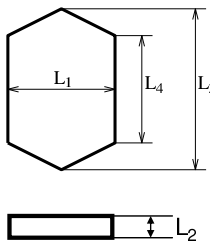


Figure 2: Idealized Barium Sulfate crystal with hexagonal shape.

- different** growth rates for width and thickness
- Growth rate for L_1 :
 $G_1(c) = dL_1/dt = G(c)$
- Experimental observation of plate thickness L_2
- Growth rate for L_2 :
 $G_2(L_2, c) = dL_2/dt = (1 - L_2/L_{2,max})G(c)$
with $L_{2,max} = 3\mu\text{m}$ (from experiments)

- Baldyga Ansatz [4] for $G(c)$:
 $G(c) = k_D(c - c_{sat} + c_* - \sqrt{c_*^2 + 2c_*(c - c_{sat})}); c \geq c_{sat}$
- Total volume of a single crystal: $V_{cr}(L_1, L_2) = 3.5L_1^2L_2/2$
- Total volume of **all** crystals by integration: $V_{cr,tot}$
- Coupling with concentration balance for **Barium Sulfate**

Model Equations

- Population balance equation for a **shape-dependent** crystal size distribution:

$$\frac{\partial f(t, L_1, L_2)}{\partial t} + \underbrace{G_1(c) \frac{\partial f(t, L_1, L_2)}{\partial L_1}}_{\text{Growth term for } L_1} + \underbrace{\frac{\partial G_2(L_2, c) f(t, L_1, L_2)}{\partial L_2}}_{\text{Growth term for } L_2} = 0$$

Initial size distribution:

$$f(0, L_1, L_2) = ad(L_1, L_2)e^{-b(L_1 - L_1^*)^2 + (L_2 - L_2^*)^2}$$

- a, b, L_1^*, L_2^* based on **experimental** data
- Coupling with balance equation for oversaturated solution:
 $c = c_0 - V_{cr,tot}(t) - V_{cr,tot}(t=0)\sigma_{mol}/V_{react}$
- Transformation into volume-based distribution with crystal volume v and the hexagonal base area κ^2
 $F(t, v, \kappa) = (2/\alpha)^{1/2} \kappa^{-2} f(t, L_1, L_2)$
- Derivation of the moment equations ($i=0,2,4,6,8,\dots$):
 $\frac{dM_i}{dt} + \sqrt{2\alpha}vG(c) \frac{dM_{i-1}}{dv} - (vG(c)/L_{2,max}) \frac{dM_i}{dv} + G(c) \frac{dM_{i+2}}{dv} + (2-i)\sqrt{\alpha/2}G(c)M_{i-1} - (G(c)/L_{2,max})M_i = 0$
- More moments than equations!
→ **Solve a closure problem!**

Closure of moment system

- Replacement** of $M_i(t, v)$ by sum of Gaussian quadrature with abscissae K_j and weights W_j :
 $M_i(t, v) = \sum_{j=1}^n K_j(t, v)^i W_j(t, v)$
- New PDE system for K_j and W_j
→ **Solution by closure!**
- Matrix regularisation
→ **decoupled** subsystem of n independent equations
- Coefficients can be solved using all initial and boundary conditions for M_i
Numerics with Gordon PD-algorithm
- Solution of advection system of equations for K_j and W_j with numerics:
→ second-order upwind scheme for advection term
→ second-order Runge-Kutta for source term

Numerical Results

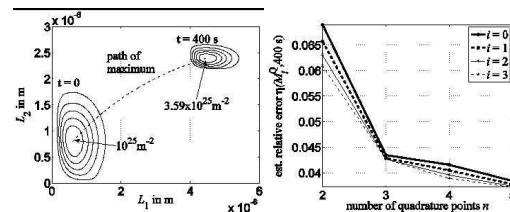


Figure 3: Left: Contour plot of the crystal size distribution with a dynamical path from $t=0$ to $t=400\text{s}$; Right: Estimated relative error of the moments M_i at $t=400\text{s}$.

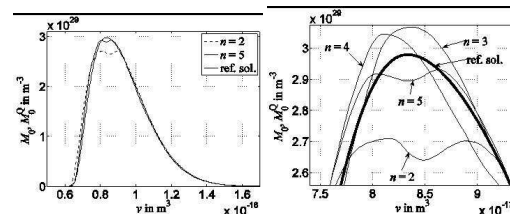


Figure 4: Left: Contour plot of the crystal size distribution with a dynamical path from $t=0$ to $t=400\text{s}$; Right: Estimated relative error of the moments M_i at $t=400\text{s}$.

Conclusion

- QMOM-based dimension reduction for two-dimensional PBE with → **direction-dependent growth**
- Numerical** solution of advection system of equations
- Advantage** - Calculation of **volume-dependent** properties
- Approach for **shape-dependent** crystallization modeling
- Extension of additional phenomena like **nucleation** possible

Literature

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