



Population Balance Modeling

JMBC-Particle Technology 2015

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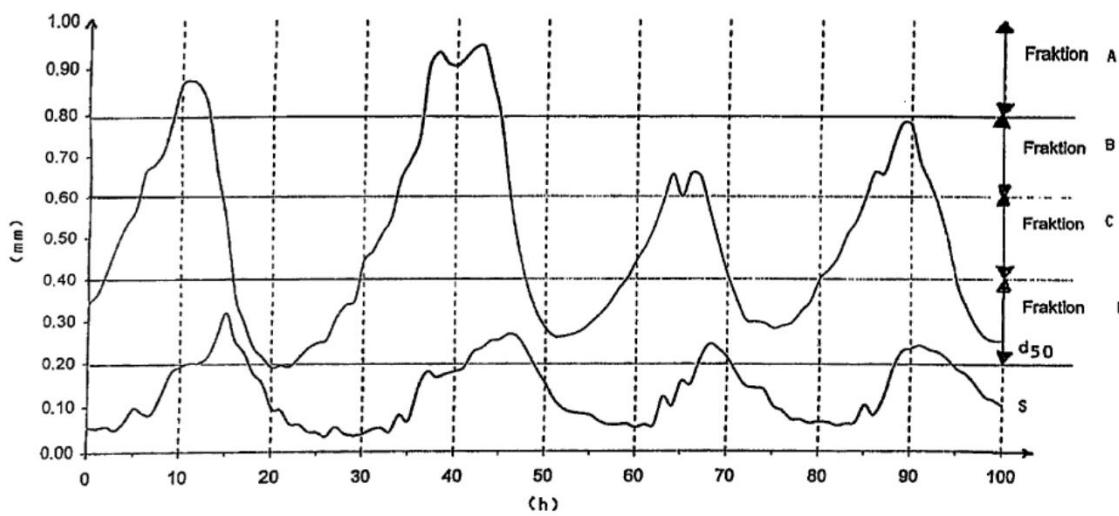
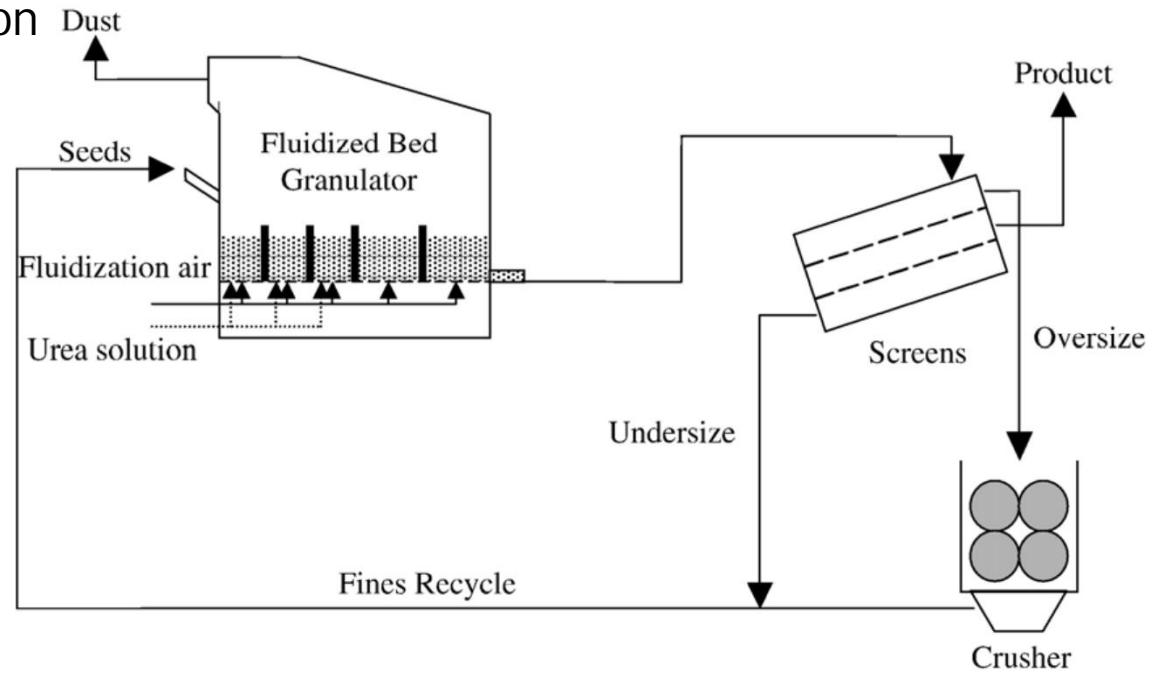
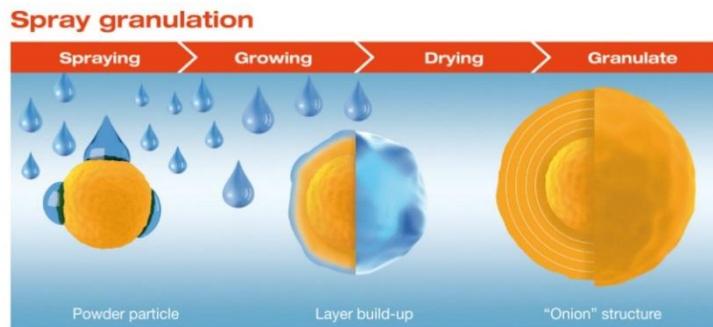
HEALTH • NUTRITION • MATERIALS

Overview

- Introduction & Industrial challenges
 - Granulation processes
 - Crystallization processes
- Population Balance Equation
 - General population balance
 - Nucleation
 - Growth
 - Agglomeration
 - Breakage
- Solution methods/Tools
 - Matrix methods (steady state solution)
 - Moment methods
 - Method of lines
 - Class methods

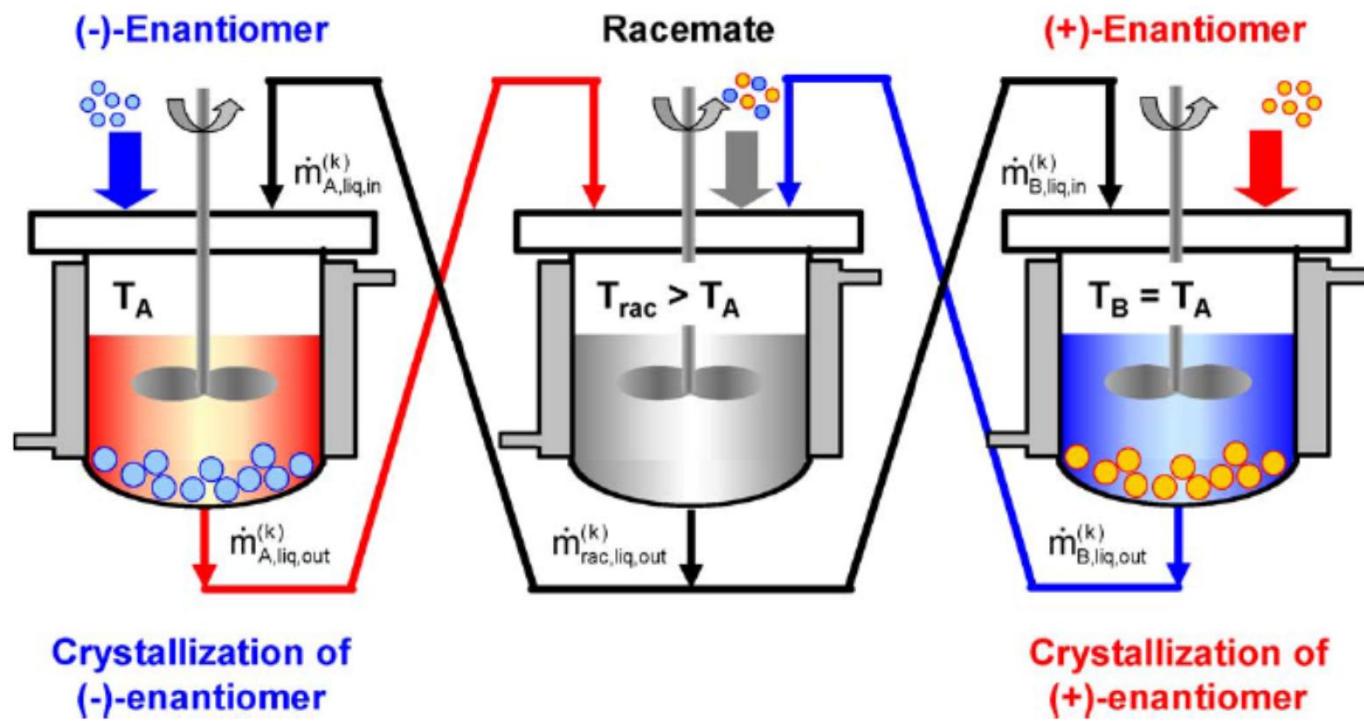
Fertilizer production

- Urea fluid bed granulation
 - Oscillations
 - Variable production
 - Variable costs



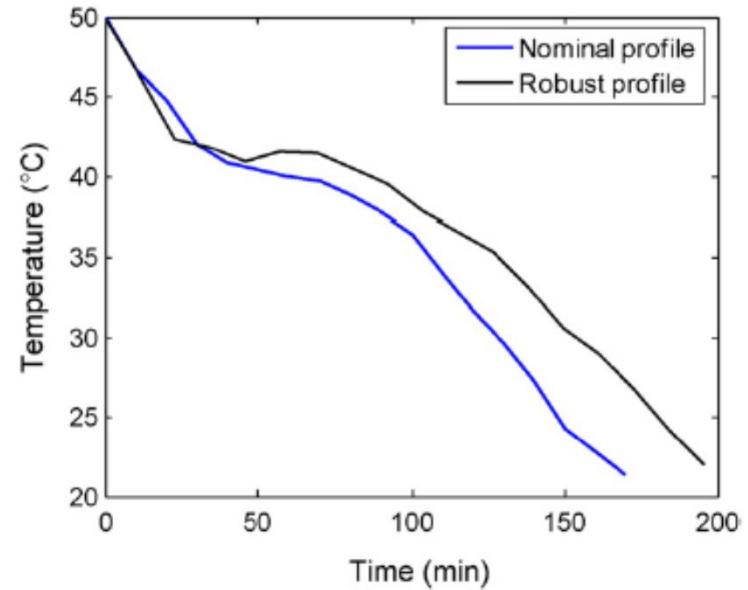
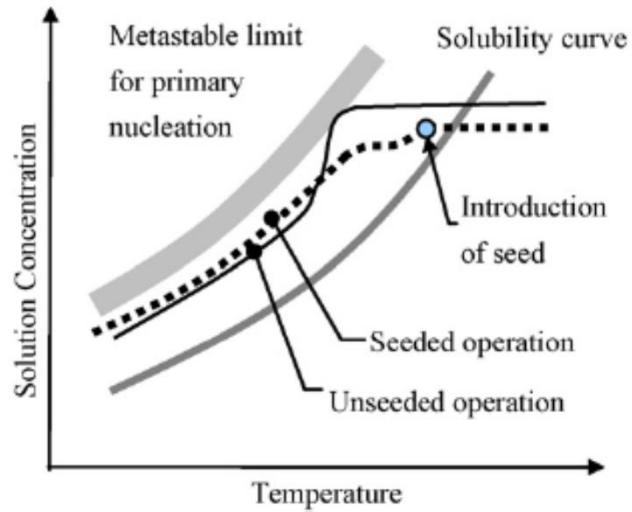
Batch crystallization

- Enantiomer separation



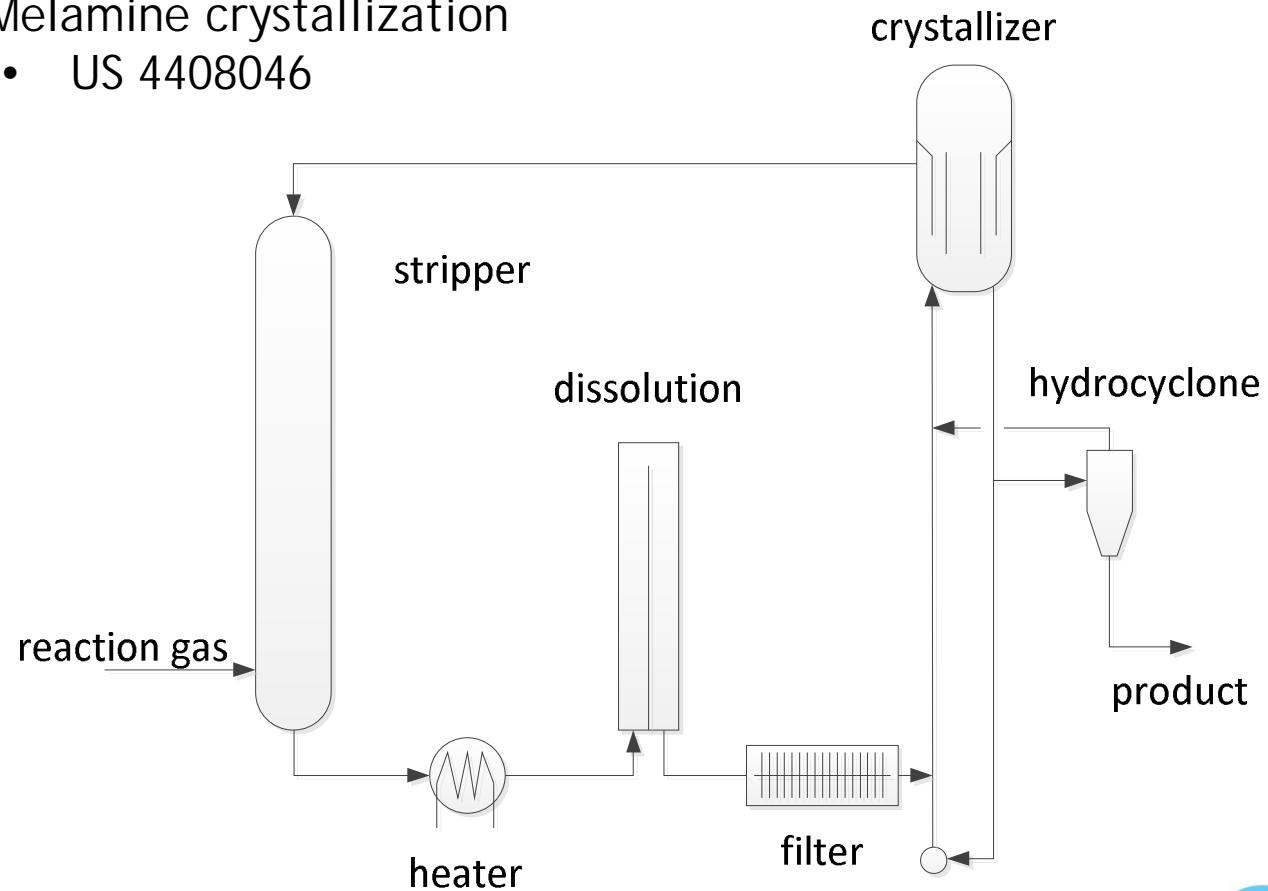
Batch crystallization

- Optimal cooling profile



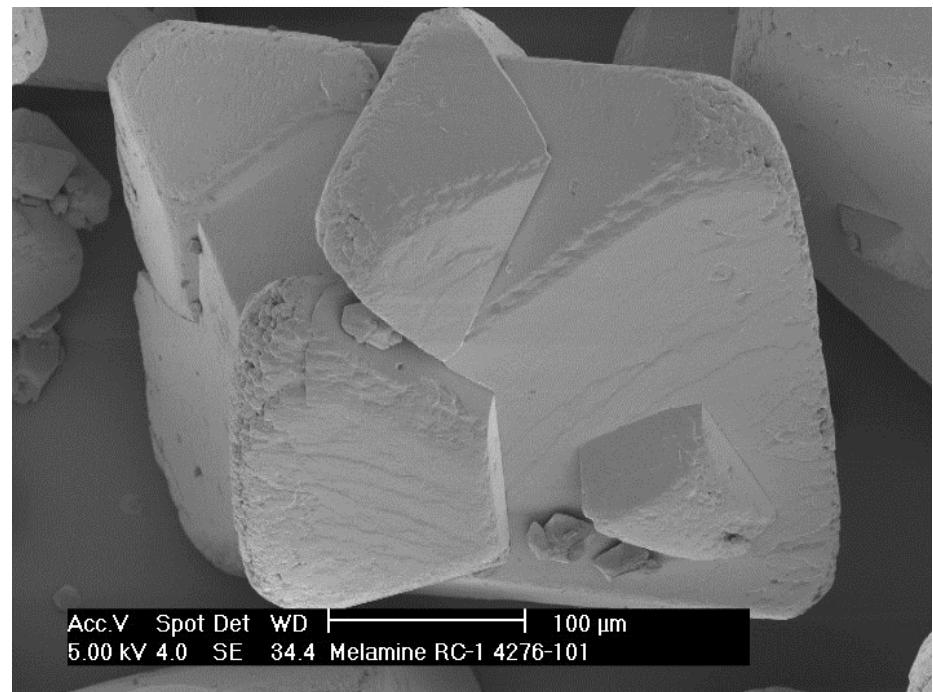
Continuous crystallization

- Melamine crystallization
 - US 4408046



Continuous crystallization

- Melamine particle
 - Agglomerate of crystals
- Effect on properties
 - Sensitive to attrition
 - Dust formation
 - Inclusion mother lye
 - Caking possible

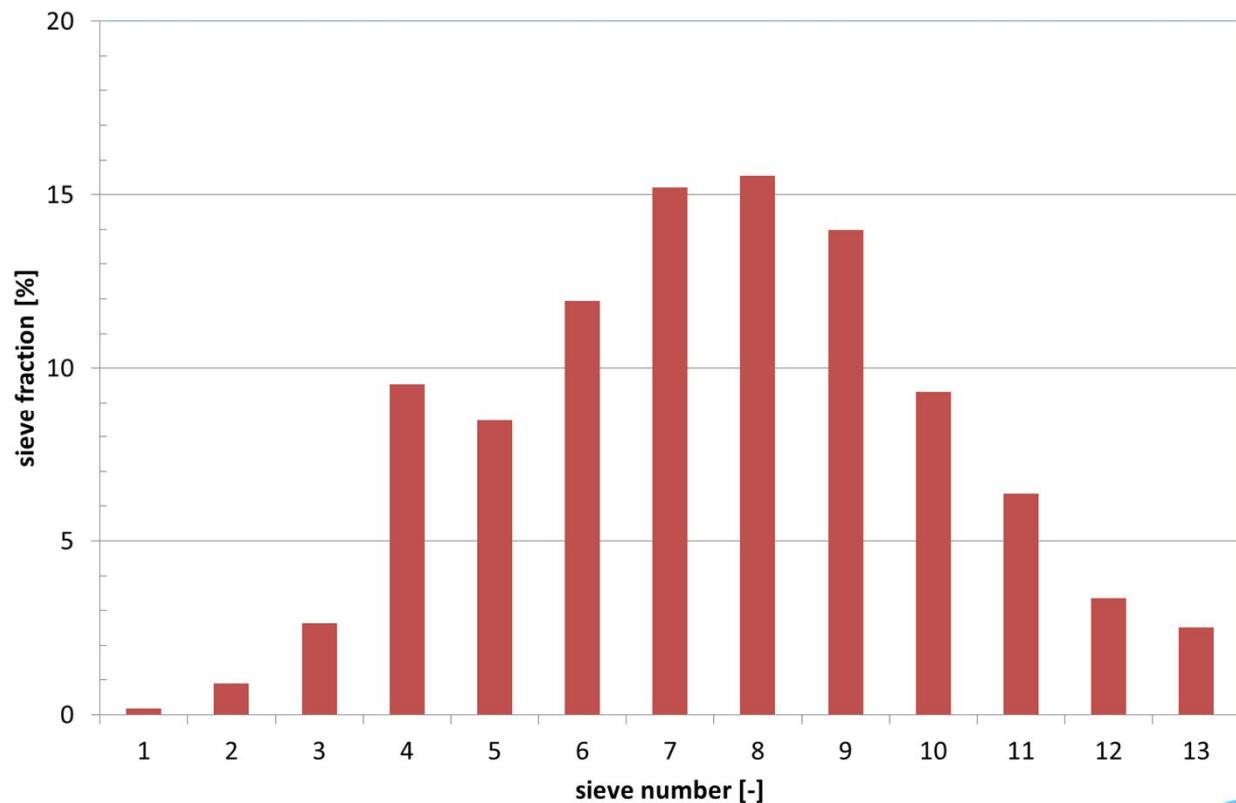


Industrial challenges

- Design of plant/operation
 - Estimation of recycles & required equipment
 - Feed rate & cooling profile
 - Size of equipment
- Troubleshooting/optimization
 - Flexibility in product size
 - production of fines/too small particles
 - Unwanted agglomeration
 - Strong oscillations
 - Energy reduction
- Debottlenecking
 - Increase capacity

Population density

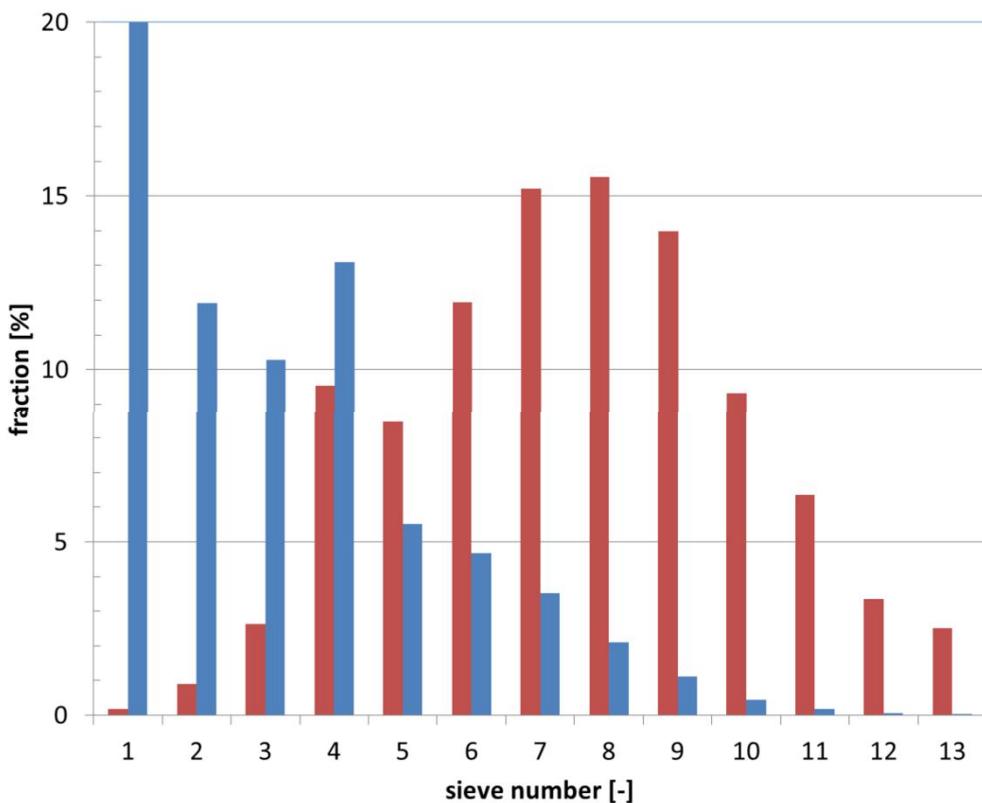
- Results sieve analysis



d_{sieve} [mm]	q_3 [%]
0.6	0.19
1	0.91
1.4	2.64
2	9.54
2.36	8.49
2.8	11.95
3.35	15.22
4	15.55
4.75	13.97
5.6	9.32
6.7	6.37
8	3.36
10	2.51

Population density

- From sieve data to number data



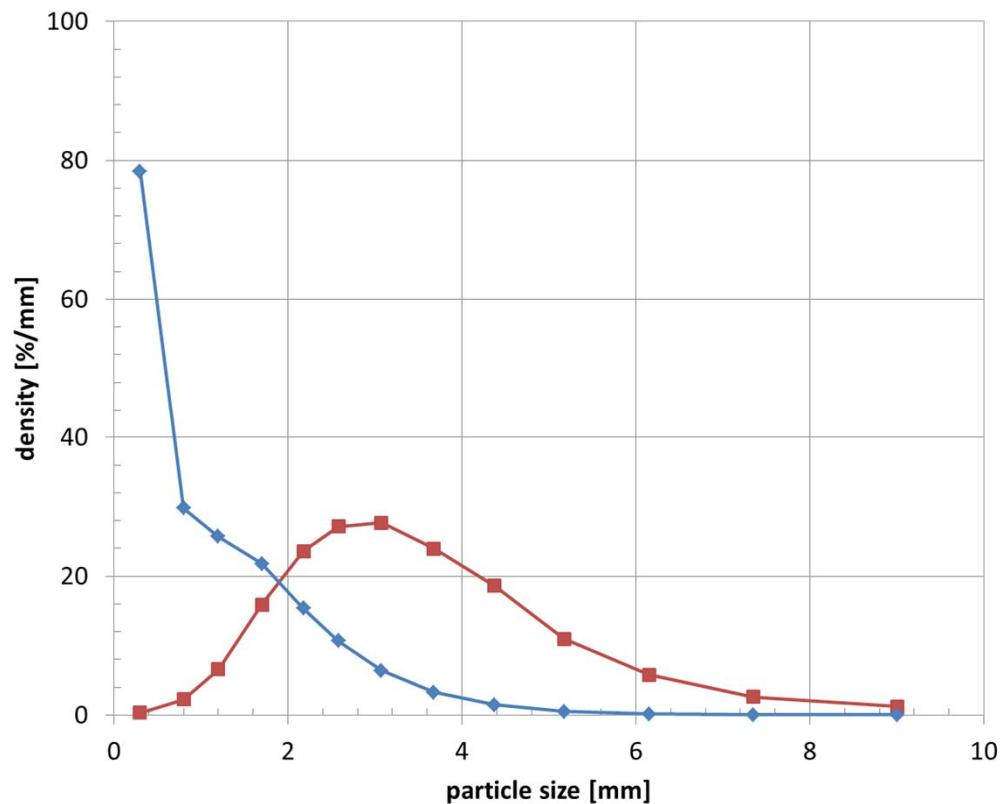
$$N_i = \frac{q_{3,i}}{k_v d_p^3}$$

■ sieve fractions
■ number fractions

d _{sieve} [mm]	q ₃ [%]	d _{avg} [mm]	N _i [#]	N _i /N _{tot} [%]
0.6	0.19	0.3	13.33	47.03
1	0.91	0.8	3.38	11.91
1.4	2.64	1.2	2.91	10.28
2	9.54	1.7	3.71	13.08
2.36	8.49	2.18	1.56	5.52
2.8	11.95	2.58	1.33	4.69
3.35	15.22	3.075	1.00	3.53
4	15.55	3.675	0.60	2.11
4.75	13.97	4.375	0.32	1.12
5.6	9.32	5.175	0.13	0.45
6.7	6.37	6.15	0.05	0.18
8	3.36	7.35	0.02	0.06
10	2.51	9	0.01	0.02

Population density

- Particle size distribution



d_{avg} [mm]	N_i [#]	N_i/N_{tot} [%]	n_i [%/mm]	v_i [%/mm]
0.3	13.33	47.03	78.39	0.31
0.8	3.38	11.91	29.79	2.26
1.2	2.91	10.28	25.71	6.59
1.7	3.71	13.08	21.80	15.90
2.18	1.56	5.52	15.33	23.58
2.58	1.33	4.69	10.65	27.15
3.075	1.00	3.53	6.41	27.67
3.675	0.60	2.11	3.25	23.92
4.375	0.32	1.12	1.50	18.63
5.175	0.13	0.45	0.53	10.97
6.15	0.05	0.18	0.17	5.79
7.35	0.02	0.06	0.04	2.58
9	0.01	0.02	0.01	1.25

■ volume density
◆ number density

$$n(l_{low}) = \lim_{l_{up} \rightarrow l_{low}} \frac{N_i}{l_{up} - l_{low}}$$

Population balance

- Conservation law on particles
 - Similar to mass & heat balance
 - Describes changes of particle ensembles
- Phenomena to describe
 - Nucleation & Growth
 - Agglomeration
 - Breakage
- One-dimensional PBE for compartment

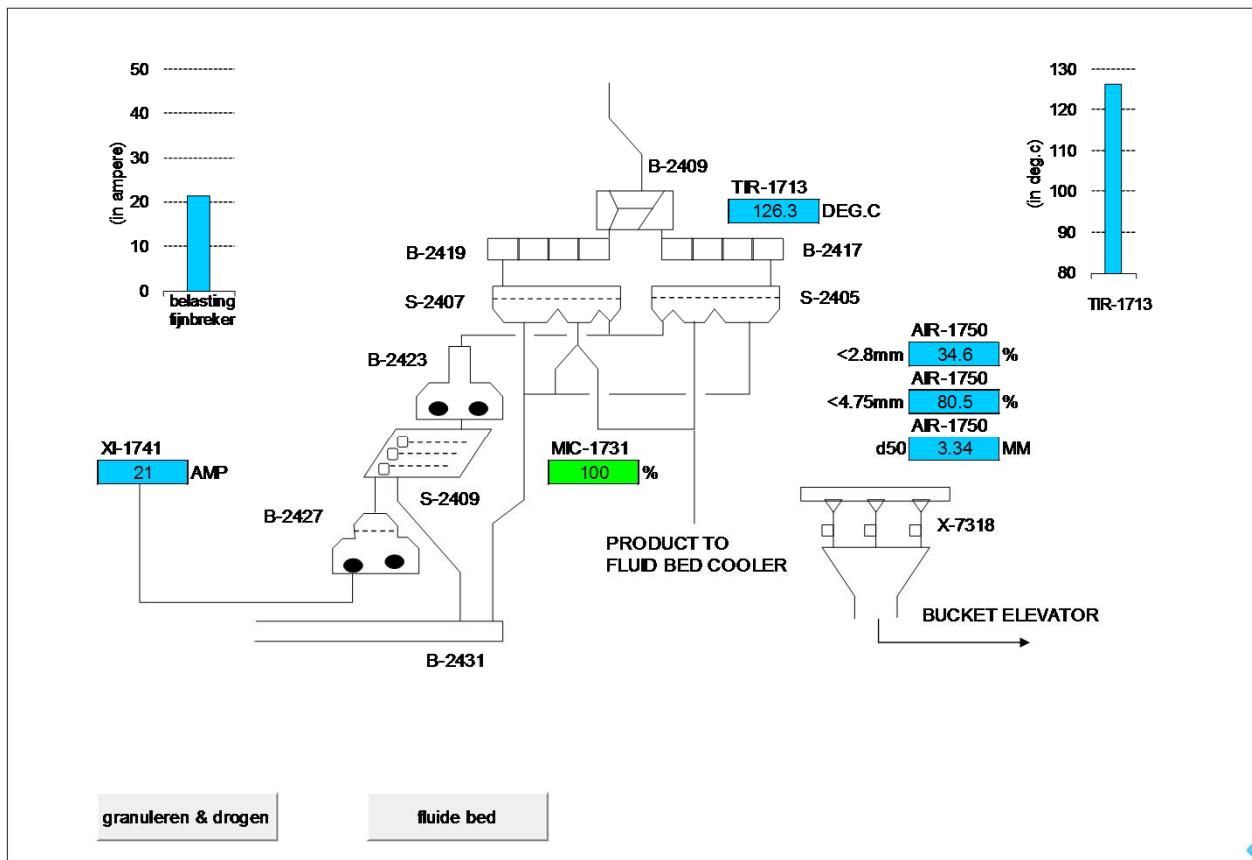
$$\frac{\partial n}{\partial t} + \frac{\partial Gn}{\partial l} = B - D \pm \sum \Phi_{in/out}$$

Population balance

- Solution methods
 - Steady state solutions
 - Matrix approach
 - Analytical solutions
 - Dynamic solutions
 - Moment methods
 - Method of lines
 - Class methods
 - Commercial tools
 - SolidSim/Aspen plus
 - gCrystal/gSolid
 - Experimental verification

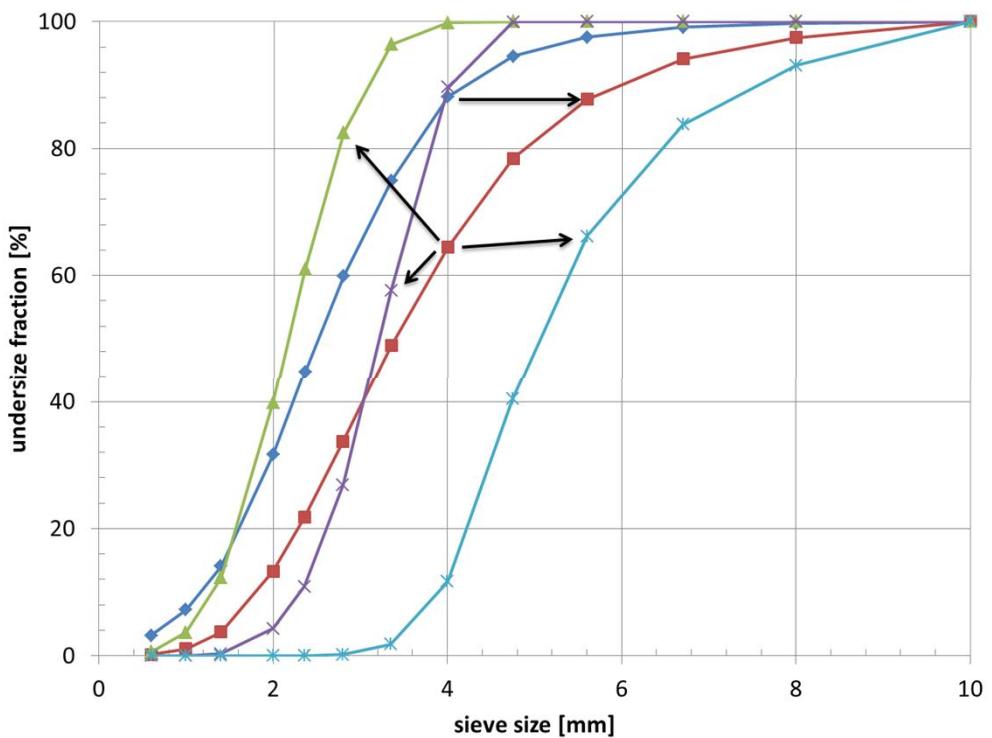
Matrix approach towards population balance

- Milling & sieving



Milling & sieving

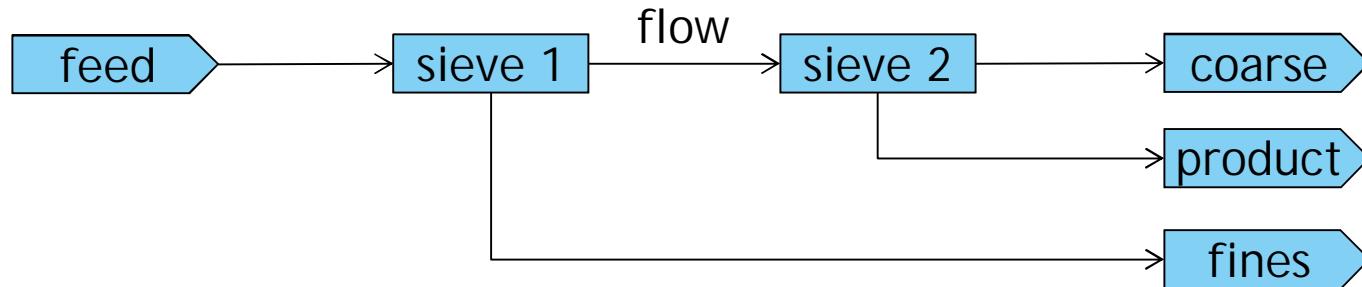
- Process data



d _{sieve}	recycle Q ₃ [%]	granules Q ₃ [%]	fines Q ₃ [%]	product Q ₃ [%]	coarse Q ₃ [%]
[mm]	[%]	[%]	[%]	[%]	[%]
0.6	3.19	0.19	0.64	0.00	0.00
1	7.21	1.09	3.67	0.02	0.00
1.4	14.09	3.73	12.27	0.29	0.00
2	31.63	13.27	39.86	4.30	0.00
2.36	44.75	21.76	60.93	10.86	0.02
2.8	59.94	33.70	82.54	26.90	0.17
3.35	74.88	48.92	96.39	57.64	1.80
4	88.18	64.47	99.82	89.69	11.65
4.75	94.51	78.44	100.00	99.95	40.42
5.6	97.54	87.77	100.00	100.00	66.15
6.7	99.10	94.13	100.00	100.00	83.77
8	99.71	97.49	100.00	100.00	93.06
10	100.00	100.00	100.00	100.00	100.00
d ₅₀	2.51	3.40	2.17	3.21	5.07

Sieve operation

- Process sequence



- Sieve/Tromp curve
 - Sieve curve: $T = \text{flow}/\text{feed}$

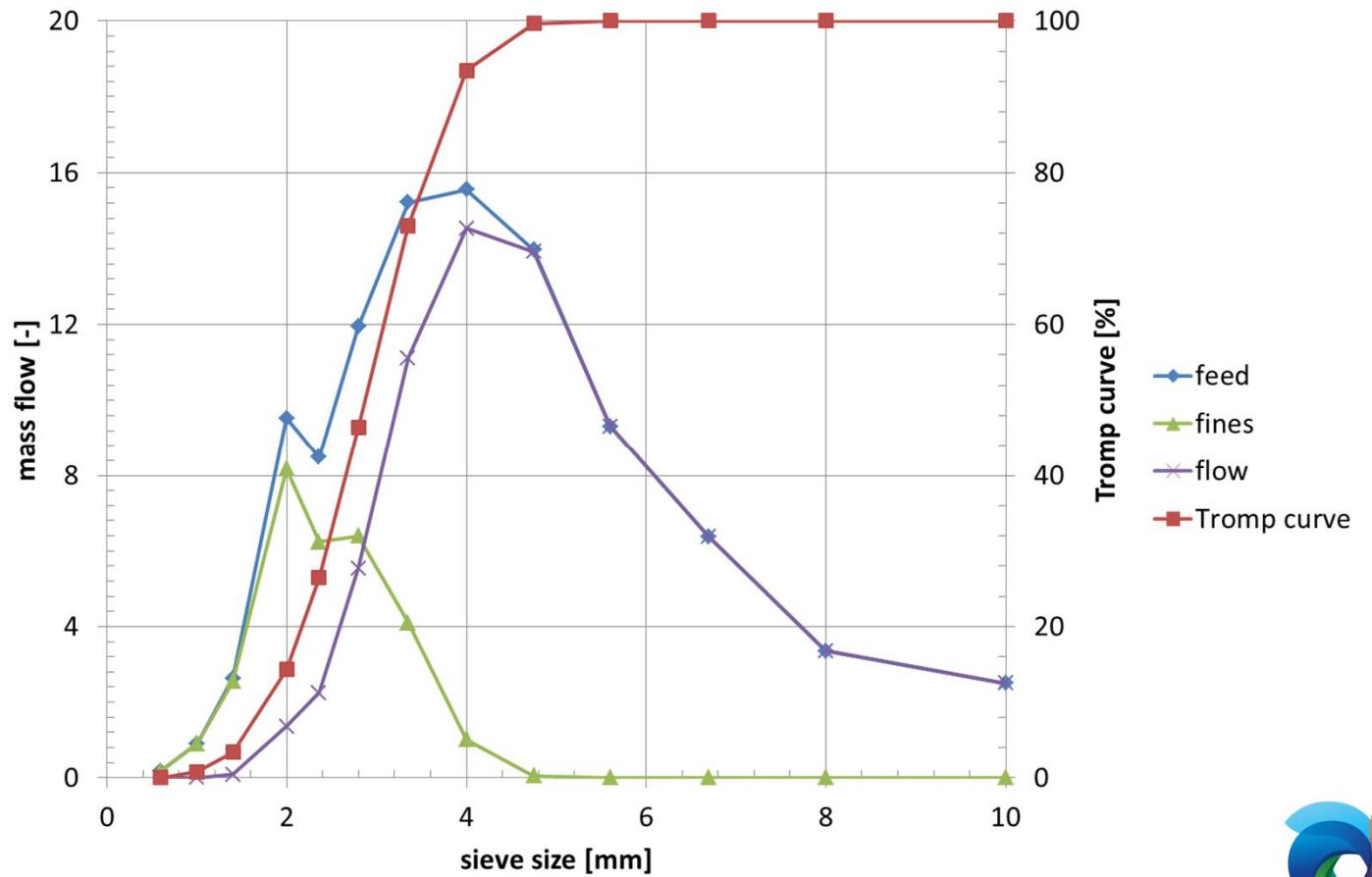
- Mass balance

$$\begin{bmatrix} \text{flow } 1 \\ \vdots \\ \text{flow } N \end{bmatrix} = \begin{bmatrix} T_1 & 0 & 0 \\ 0 & \ddots & 0 \\ 0 & 0 & T_N \end{bmatrix} \begin{bmatrix} \text{feed } 1 \\ \vdots \\ \text{feed } N \end{bmatrix}$$

$$\begin{bmatrix} \text{feed } 1 \\ \vdots \\ \text{feed } N \end{bmatrix} = \begin{bmatrix} \text{fines } 1 \\ \vdots \\ \text{fines } N \end{bmatrix} + \begin{bmatrix} \text{flow } 1 \\ \vdots \\ \text{flow } N \end{bmatrix}$$

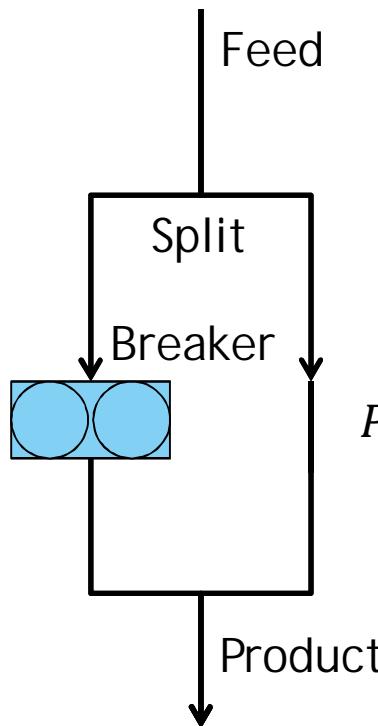
Sieve operation

- Sieve performance

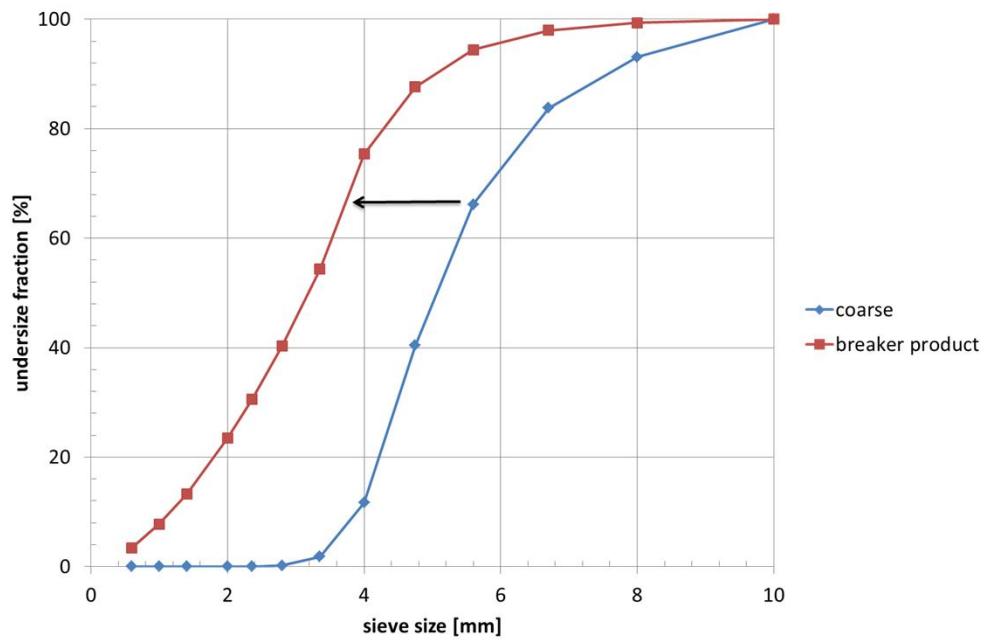


Milling operation

- flowsheet



$$P = (1 - S)F + BSF$$



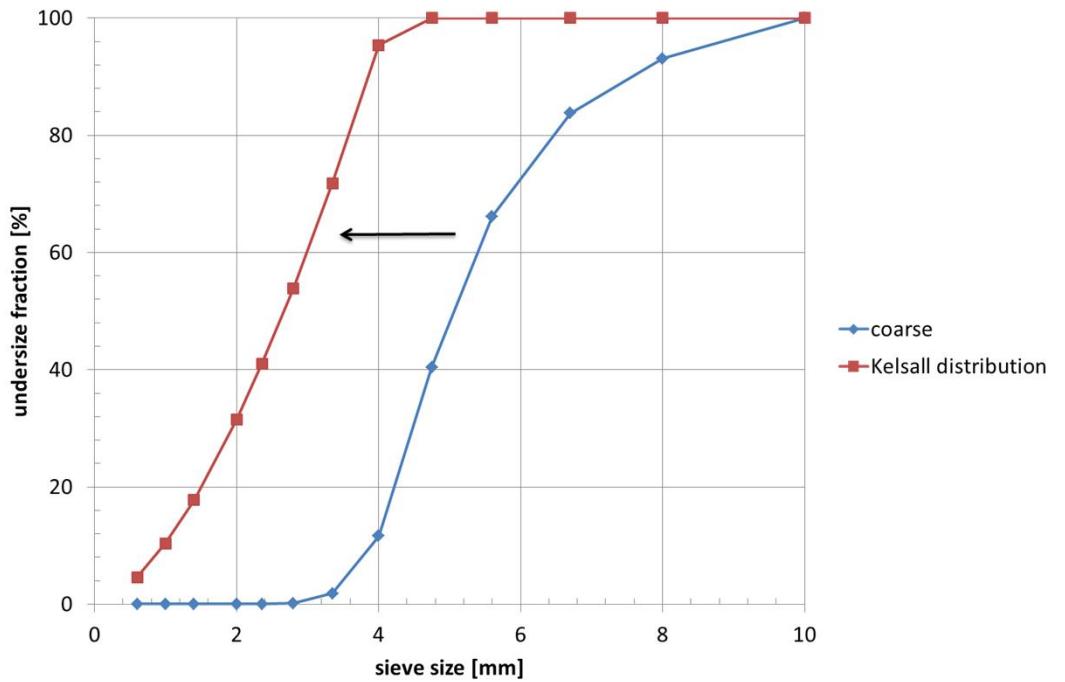
Milling operation

- Kelsall breaking model

$$Q_{3,frag} = \left(\frac{d}{d_{mill}} \right)^k$$

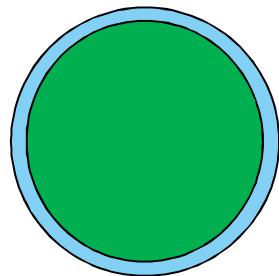
$$q_{3,i} = \left(\frac{d_i}{d_{mill}} \right)^k - \left(\frac{d_{i-1}}{d_{mill}} \right)^k$$

$$B = \begin{bmatrix} q_{3,1} & 0 & 0 \\ q_{3,1} & q_{3,2} & 0 \\ q_{3,1} & q_{3,2} & q_{3,N} \end{bmatrix}$$



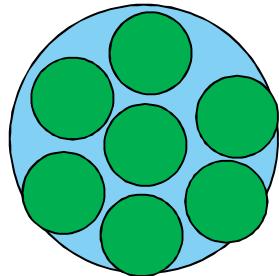
granulation

- Two mechanisms
 - Growth by layering

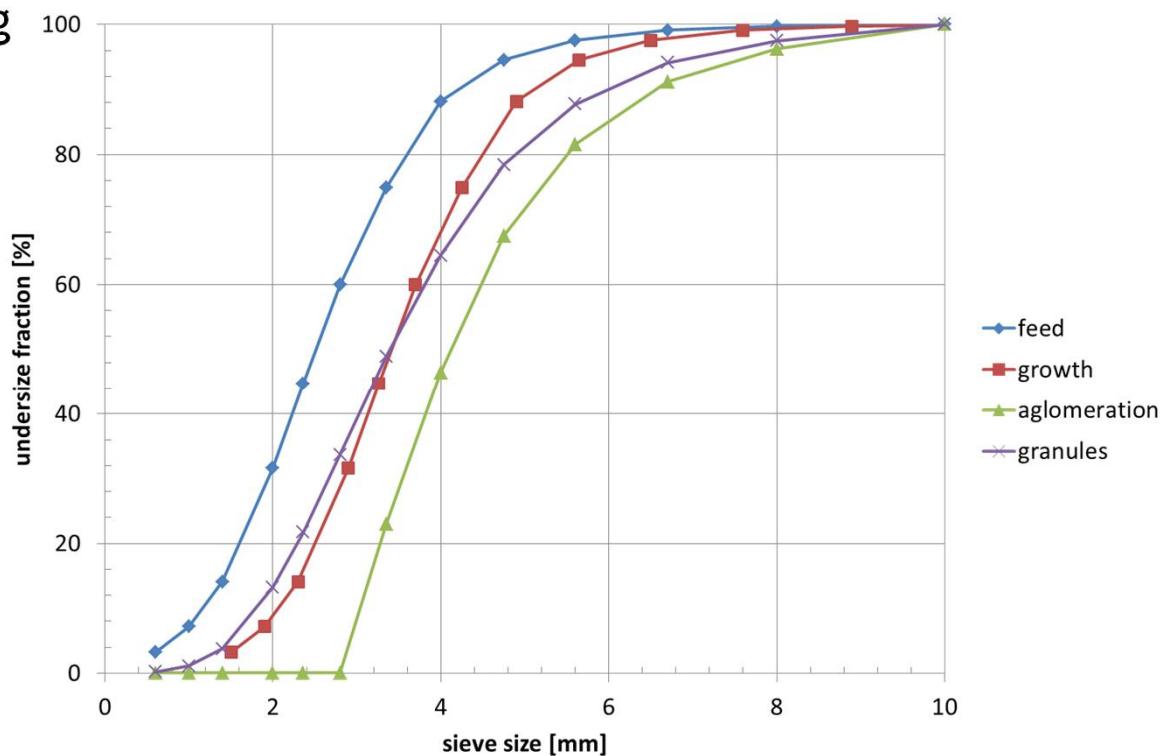


$$d_{new} = \beta d_{old}$$

- Agglomeration

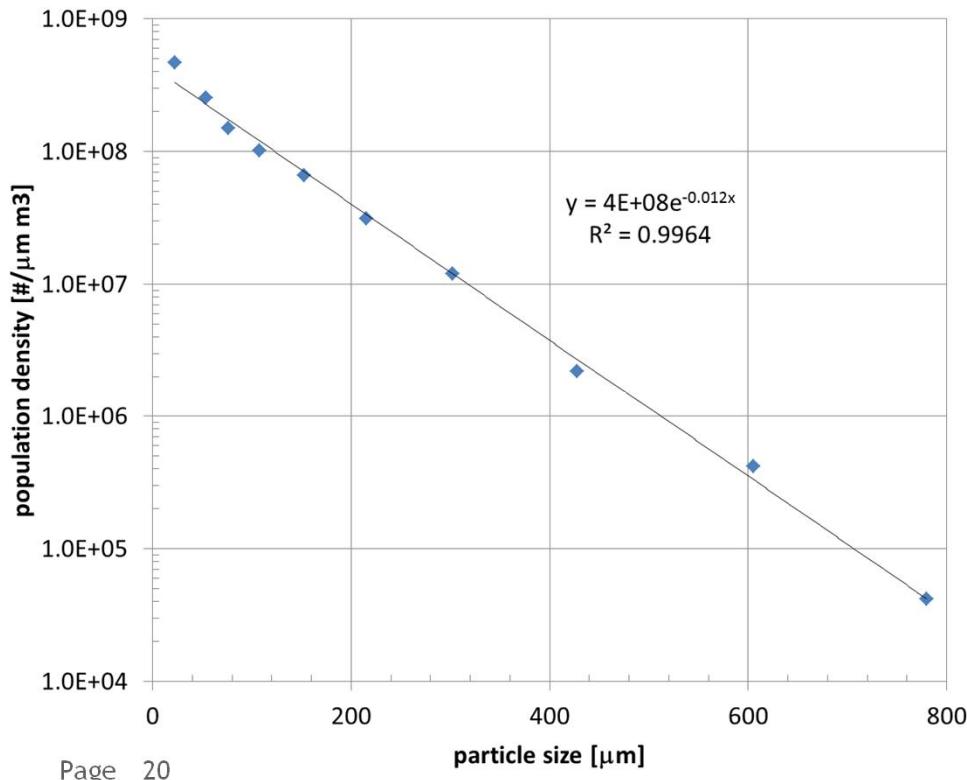


$$Q_{3,new} = \frac{Q_{3,old} - Q_{3,crit}}{1 - Q_{3,crit}}$$



MSMPR crystallizer

- Mixed suspension, mixed product removal
 - Continuous system
 - Size independent crystal growth
 - No agglomeration/attrition



$$n(L) = \frac{B}{G} \exp \left[-\frac{L}{G\tau} \right]$$

◆ data A.G. Jones

Method of moments

- Moments of distribution

$$m_i = \int_0^{\infty} n(L)L^i dL$$

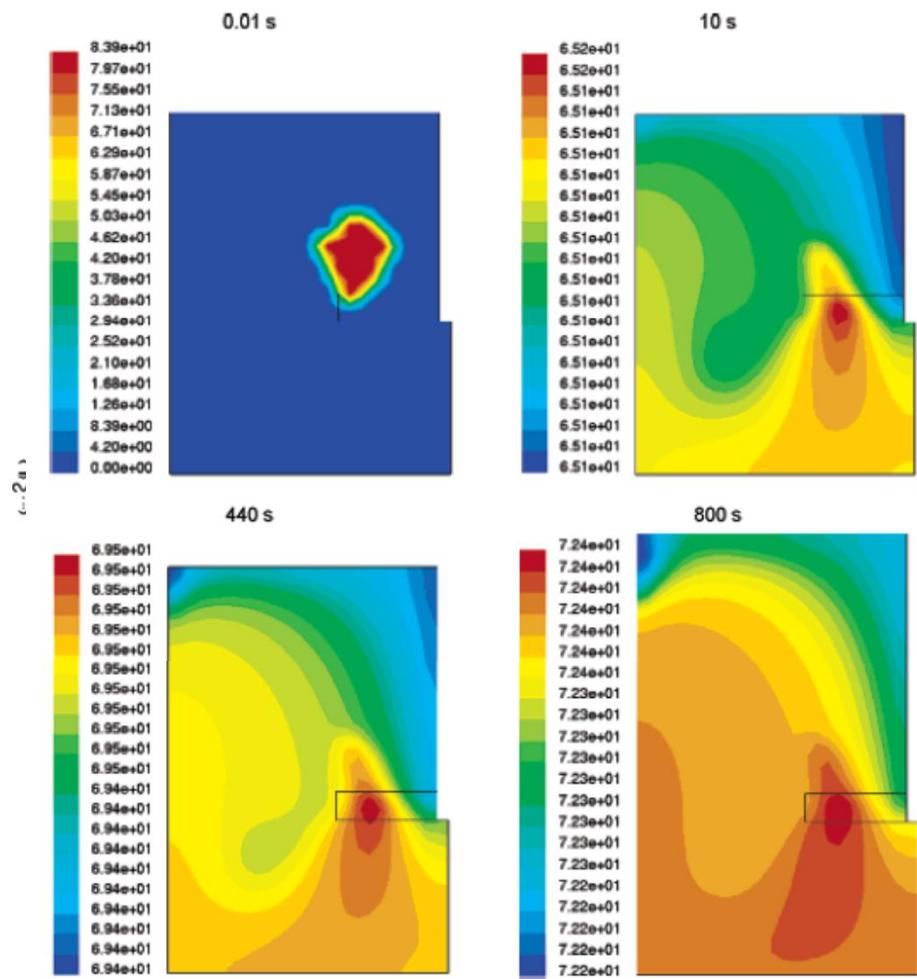
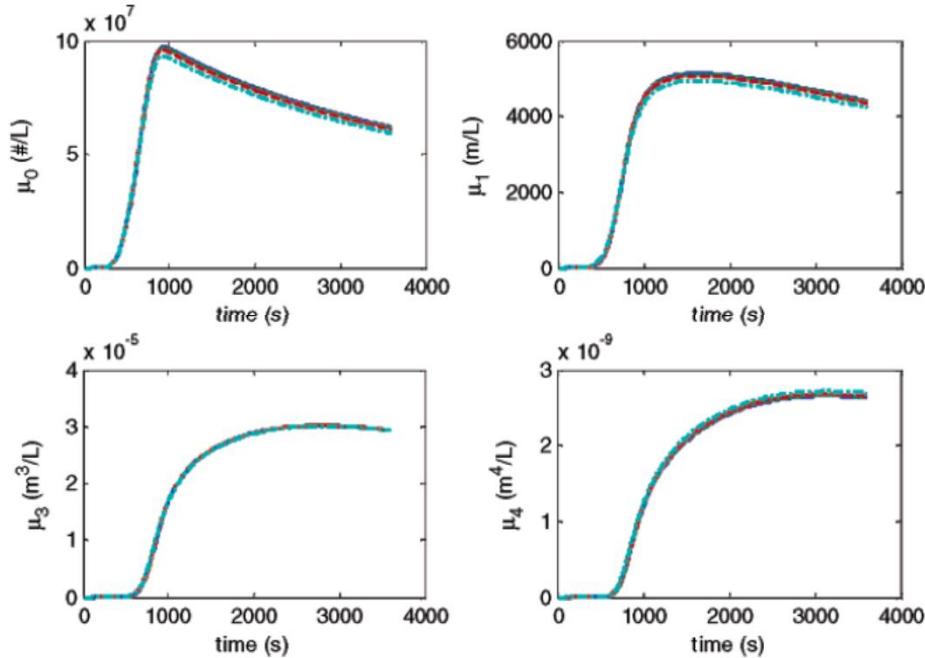
- Zeroth moment: number of particles
- First moment: total length of particles
- Second moment: total area of particles
- Third moment: total volume of particles
- Crystal growth:

$$\frac{dm_0}{dt} = BV \quad \frac{dm_i}{dt} = im_{i-1}G$$

- Applied in CFD applications

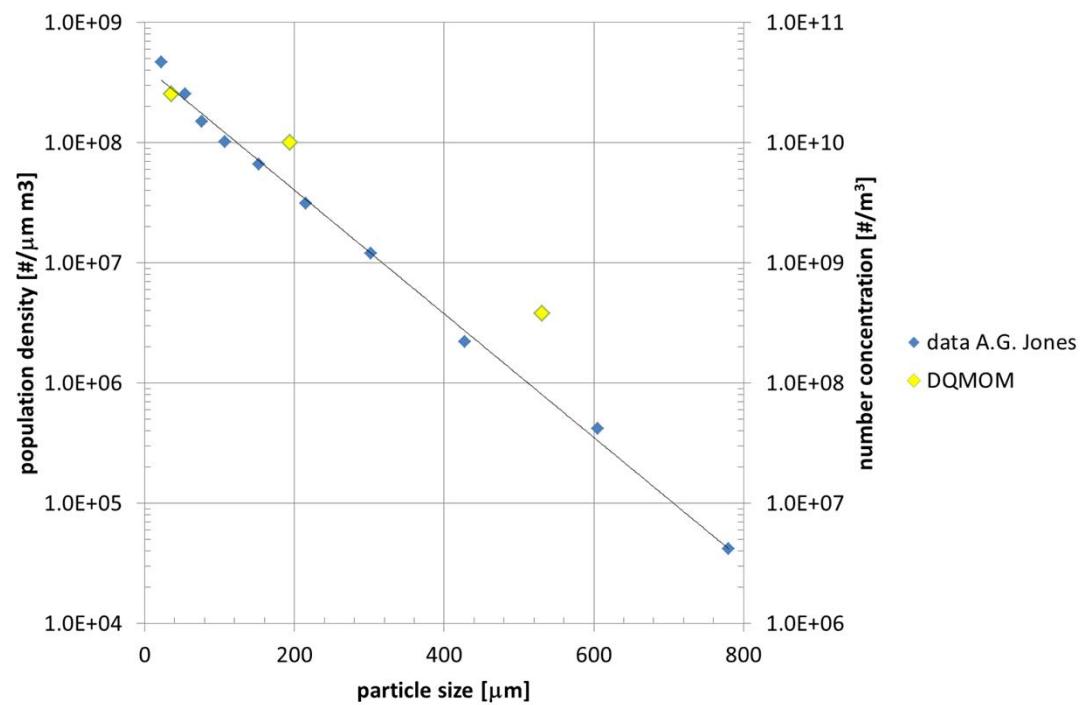
Method of moments & CFD

- Anti-solvent crystallization
 - Crystal Growth & Design
 - 6 (2006), 1291 - 1303



Discrete Quadrature Method Of Moments

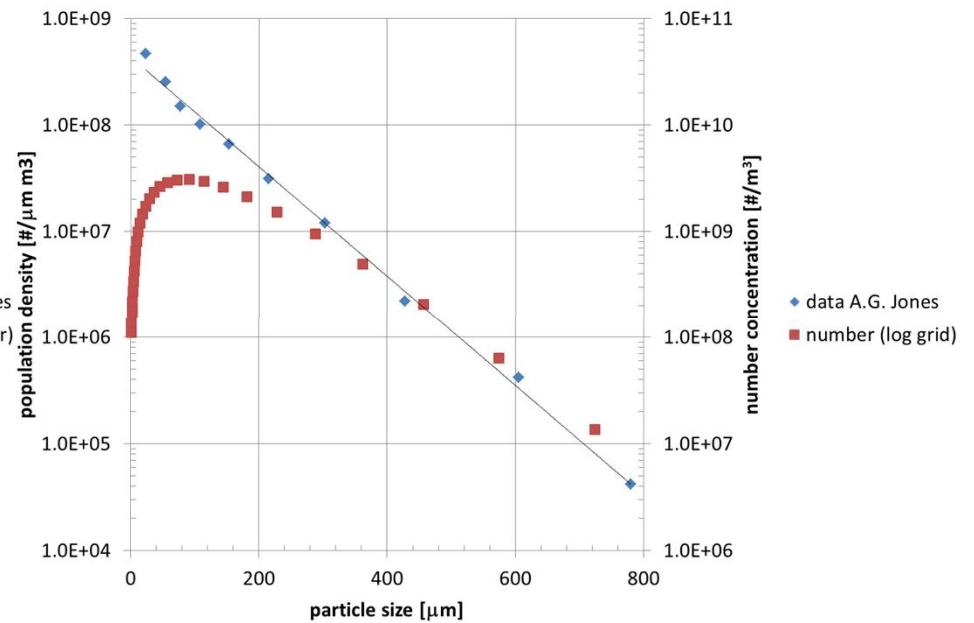
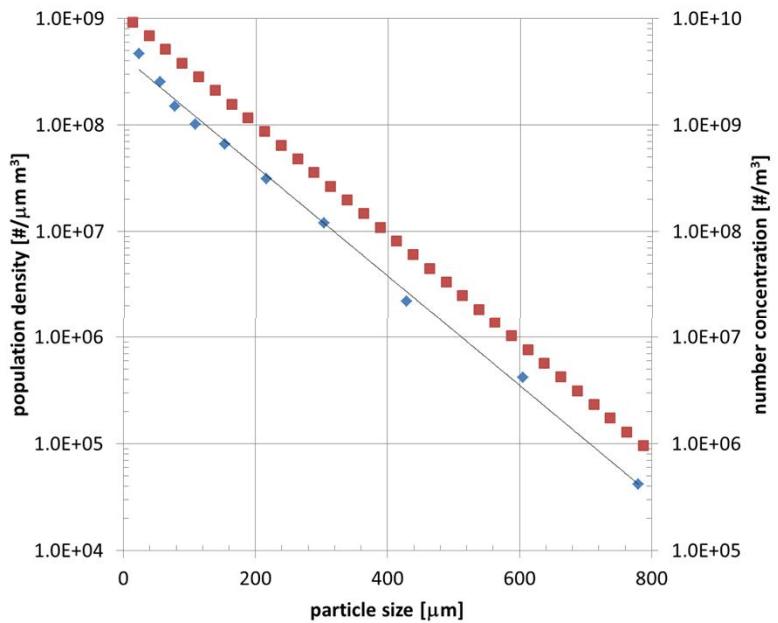
- Aerosol Science, 36 (2005), 43 - 73
- Discretization of population density with Dirac functions
 - Variable number concentration and particle size



Class method for PBE

- Transformation from partial differential equation to set of ordinary differential equations
 - From density to number concentrations
 - Discretization of size domain

$$N_i = n(L_i) \Delta L$$



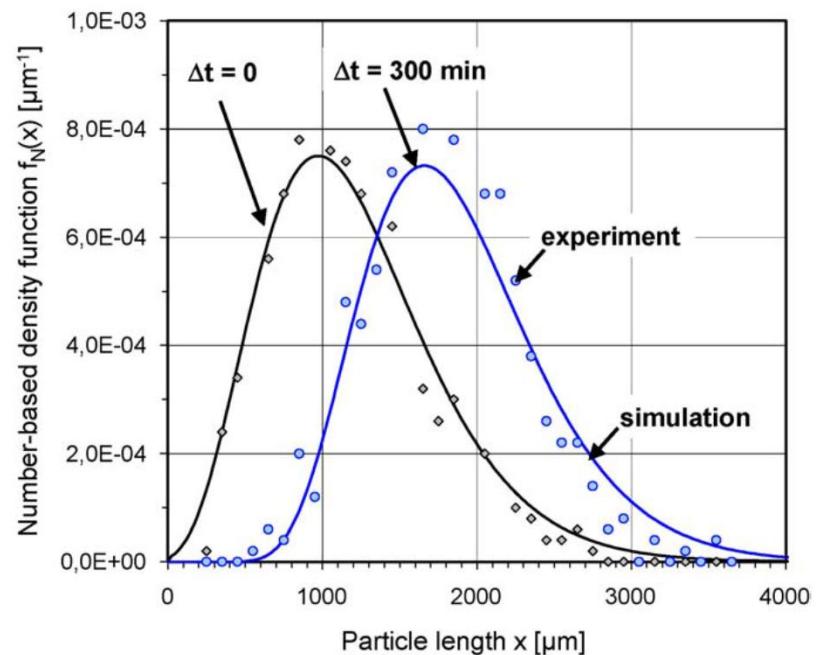
Class method for PBE

- Transformation from partial differential equation to set of ordinary differential equations
 - From density

$$\frac{\partial n}{\partial t} + \frac{\partial Gn}{\partial l} = B - D \pm \sum \Phi_{in/out} \Rightarrow$$

- to number concentrations

$$\frac{dN_i}{dt} = \frac{aG_i N_i + bG_{i-1} N_{i-1}}{L_i} + B_i - D_i \pm \sum \Phi_{i,in/out}$$



Class method for PBE

- Incorporation of agglomeration
 - Hounslow et al, AIChE J., 34 (1988), 1821 - 1832

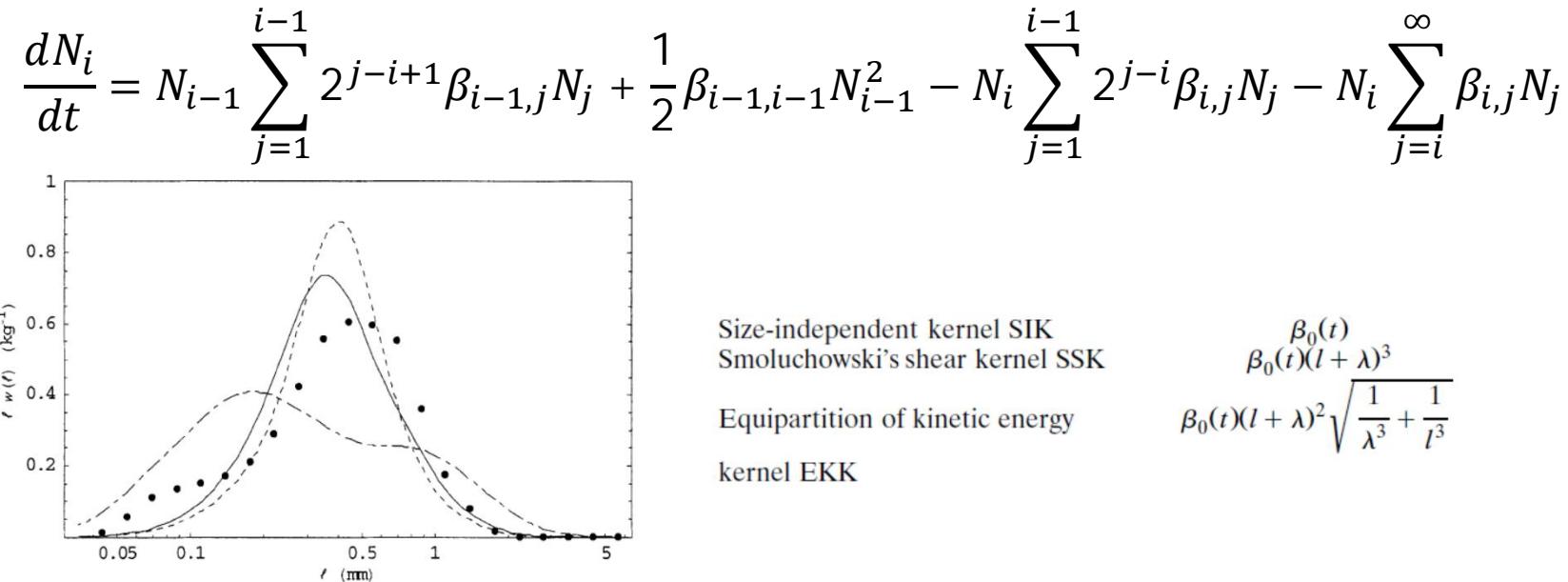


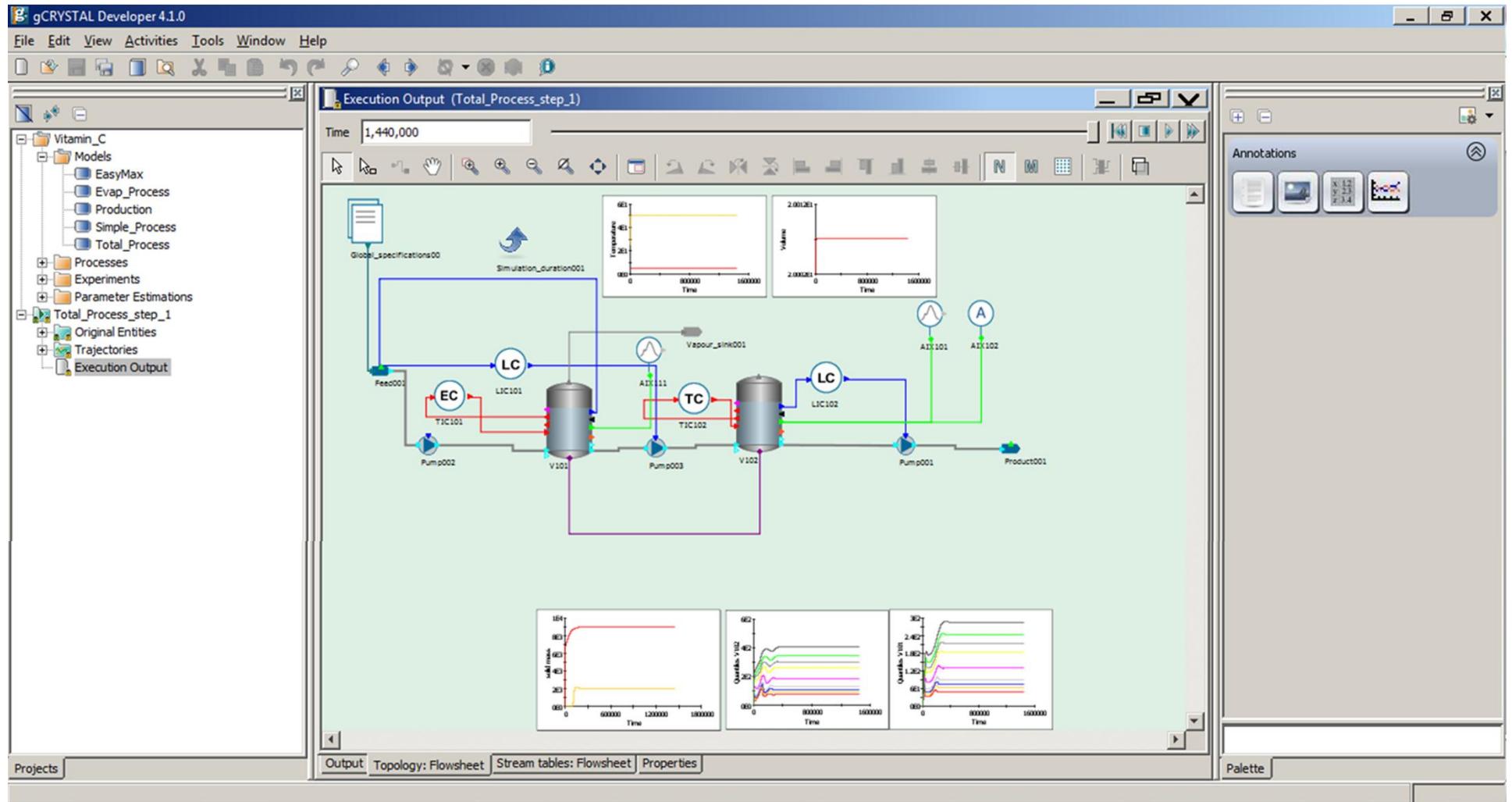
Figure 5. Granule-size distribution results of initial simulations using SIK (dotted line), SSK (chain-dashed line) and EKK (continuous line).

Class method for PBE

- Other methods possible
 - Higher order discretization
 - Logarithmic densities
 - Pivot method (variable size grid)
- Population Balances, D. Ramkrishna, Academic Press, San Diego, USA, ISBN 0-12-576970-9

Commercial tools

- gCrystal

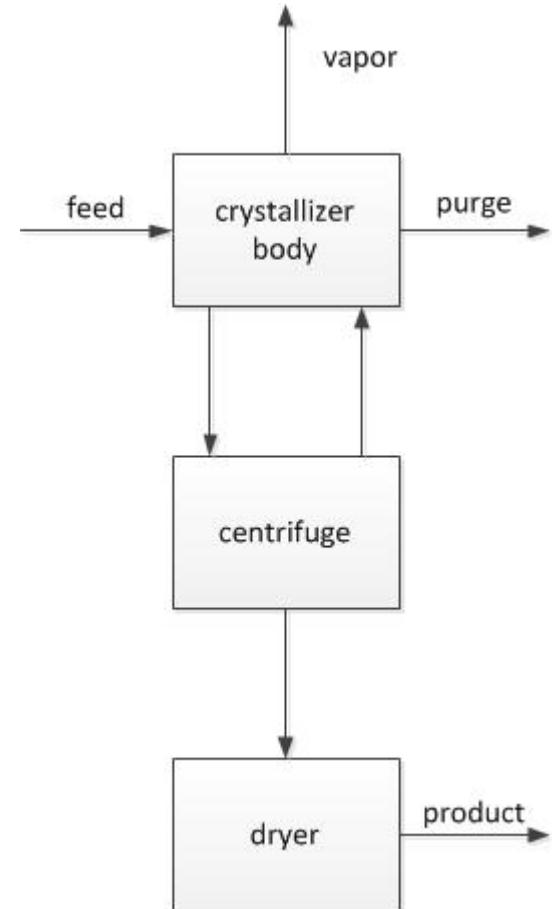


References

- Population Balances, D. Ramkrishna, Academic Press, San Diego, USA, ISBN 0-12-576970-9
- Crystallization Process Systems, A.G. Jones, Butterworth-Heinemann, Oxford, UK, ISBN 0-7506-5520-8
- A Discretized Population Balance for Nucleation, Growth, and Aggregation, M.J. Hounslow et al, AIChE J, 34 (1988), 1821 - 1832.

Exercise

- Design vitamin C crystallization plant
 - Specifications for Vitamin C product:
 - Ascorbic acid content > 99 wt-%
 - organic impurities < 0.2 wt-%
 - Particle size distribution
 - Max 20 % < 75 mm,
 - Max 30 % > 150 mm
 - Specification for Vitamin C process:
 - Requested production:
 - 3 kta
 - Feed stream:
 - 20 wt-% ascorbic acid in water
 - 0.1 wt-% KGA present
 - Centrifuge:
 - Cake liquid content: 10 wt-%
 - Cryst. Res. Technol. 43 (2008), 381 - 389





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