

Control of Size and Shape Distribution in Continuous Crystallisation Systems

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Acknowledgments



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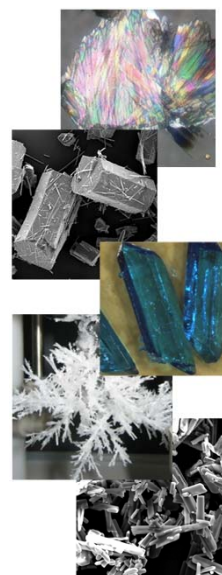
Overview

- **Introduction**
- **Composite-PAT array (CPA) and CryPRINS**
 - Continuous real-time monitoring of crystallization processes
 - CSD control via tailored dissolution in batch crystallisation (model-based and model-free)
 - Model-based control of CSD in continuous crystallizers
 - Control of shape distribution using growth modifiers
 - Conclusions

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Monitoring and Control of Crystallisation Processes - Motivation

- **Many technology and economic drivers**
- **70% of all solid products & 90% of APIs involve a crystallization step**
- **Control of crystal properties important**
 - Efficient downstream operations (filtration, drying)
 - Product effectiveness (tablet stability, bio-availability)
- **Strict regulatory requirements related to variation of quality**
- **High economic penalty of producing off-spec product (£1-2 million/batch)**
- **Quality-by-design, fast scale up and product consistency**



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Continuous Crystallisation

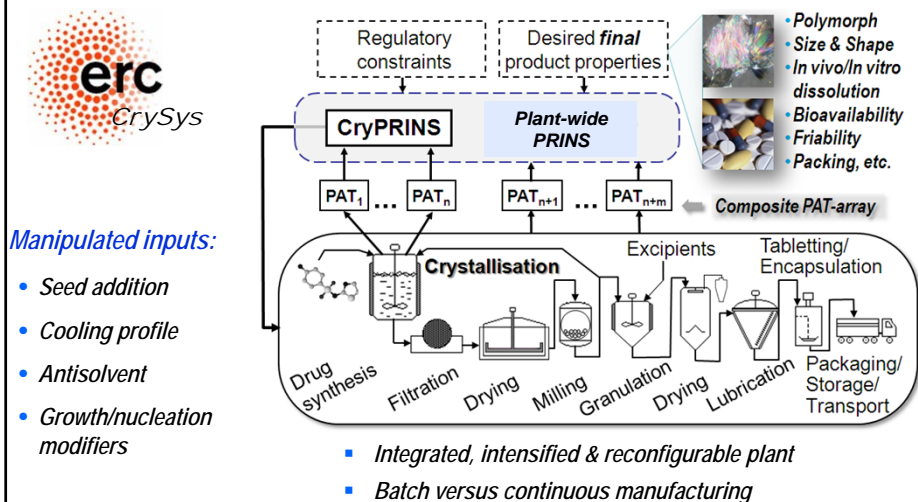
- Has been identified as a key paradigm shift with high potential of improving pharmaceutical production [1]
- Continuous processing has the advantages:
 - Consistency in product quality
 - Reduction of cost by asset utilization
 - Shorter down time
 - Ease of scale up
 - Achieve operating conditions unattainable in batch processes
- Continuous processing is impossible without suitable control strategies

[1] Chen et al., Cryst. Growth Des., 2011, 11, 887-895

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Key role of monitoring and control in process intensification and integration

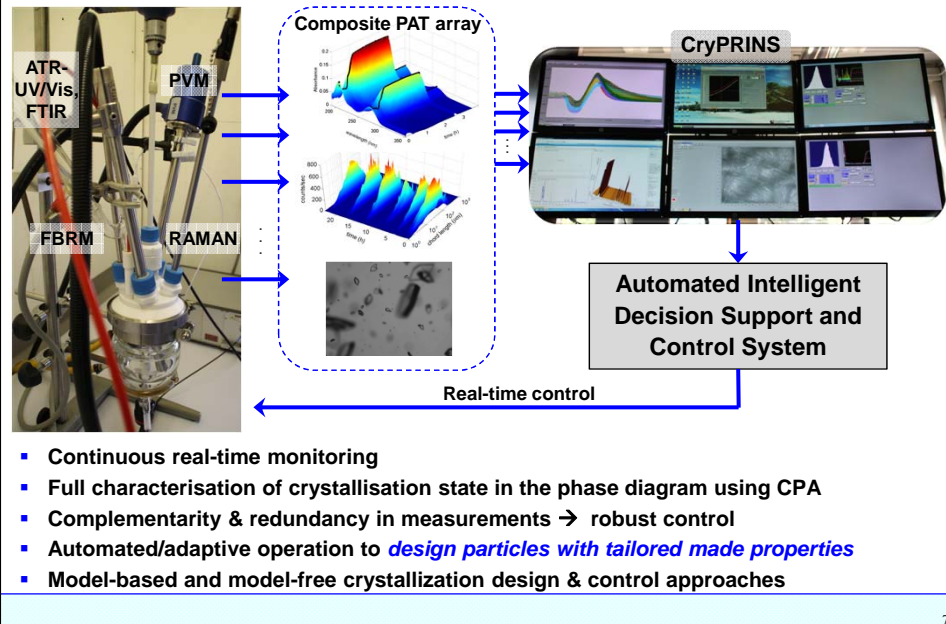
New generation of integrated, intensified & intelligent crystallization systems with drastically improved flexibility, predictability, stability & controllability.



Nagy&Braatz, Handbook of Ind. Cryst., 2012; Nagy&Braatz, Annu. Rev. Chem. Biomol. Eng., 2012

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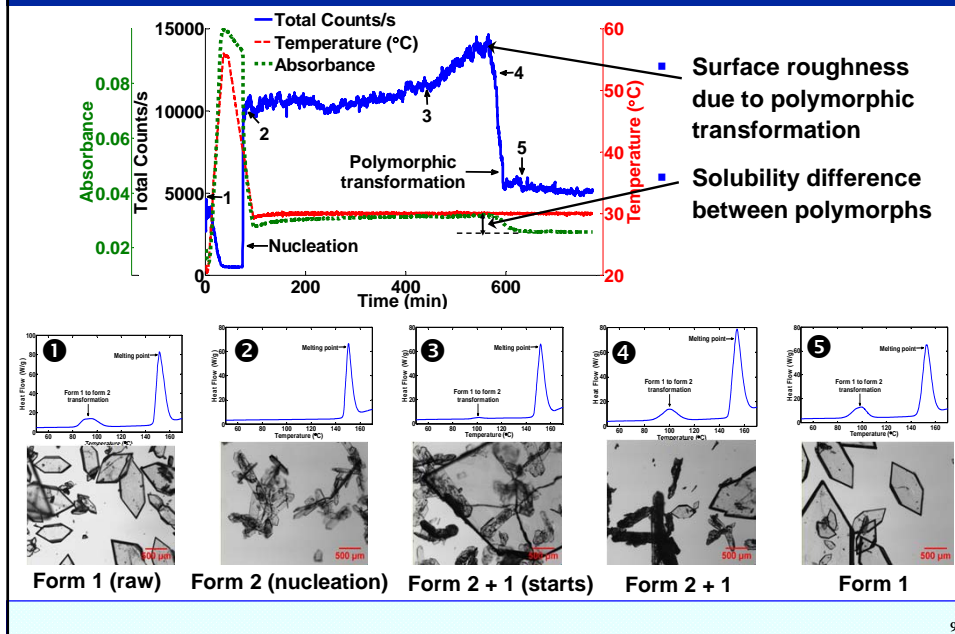
Crystallization product engineering via real-time feedback control



Overview

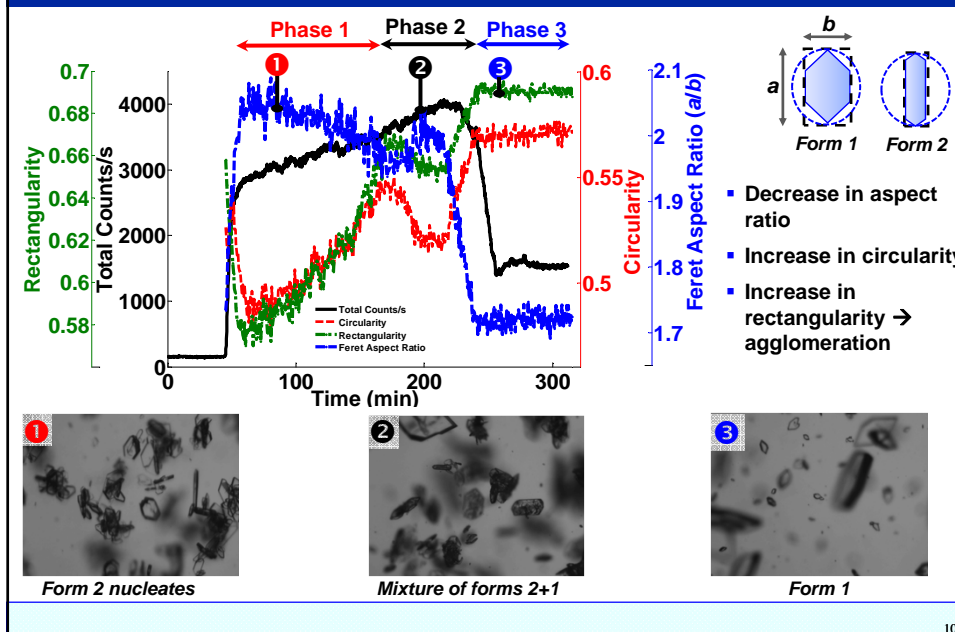
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FBRM for detection of OABA polymorphism



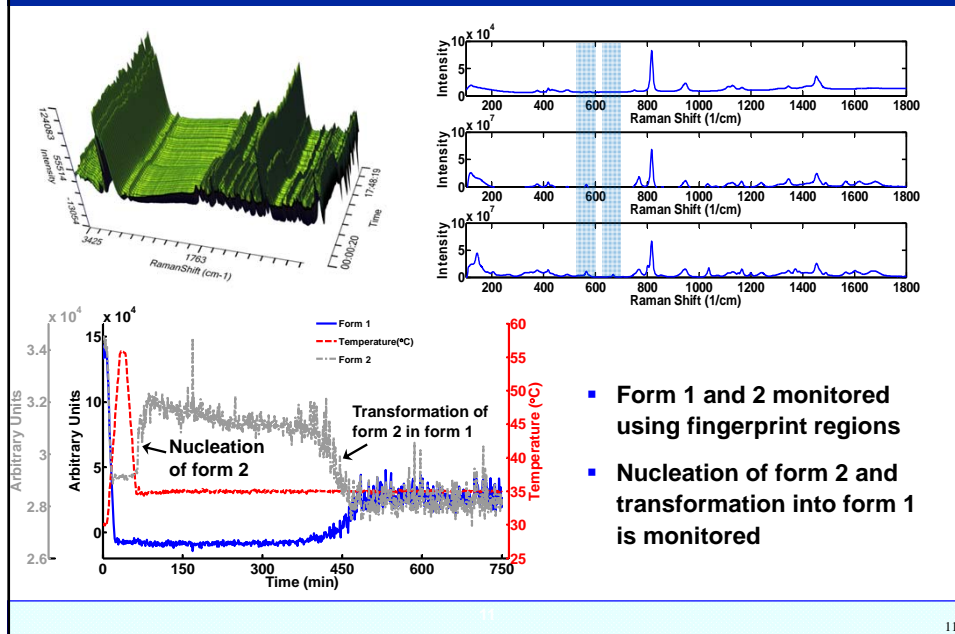
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Image analysis (IA) for monitoring polymorphic transformation of OABA



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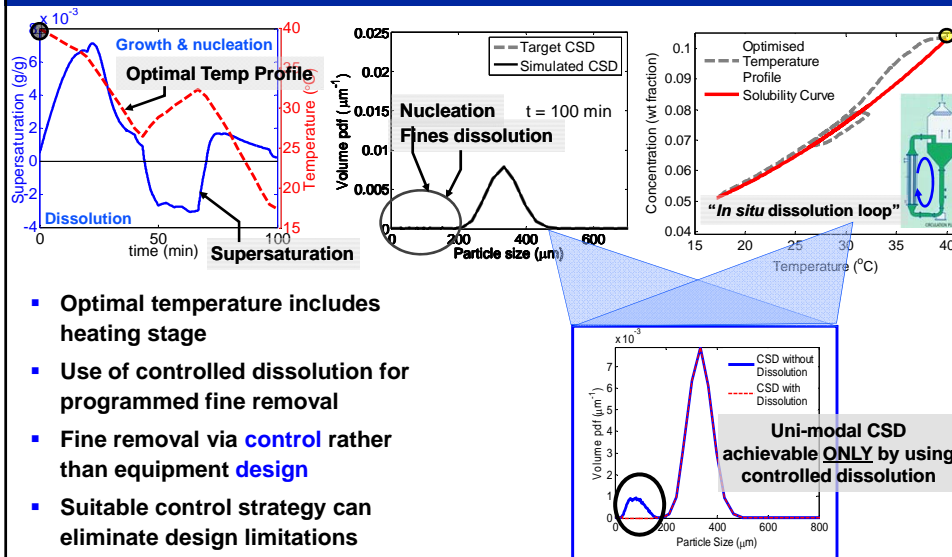
Monitoring polymorphic transformation OABA using process Raman Spectroscopy



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In situ fine removal via controlled dissolution



- Optimal temperature includes heating stage
- Use of controlled dissolution for programmed fine removal
- Fine removal via **control** rather than equipment **design**
- Suitable control strategy can eliminate design limitations
- Model-free approach: DNC

Nagy et al., CGD 2011; Nagy, CACE 2009

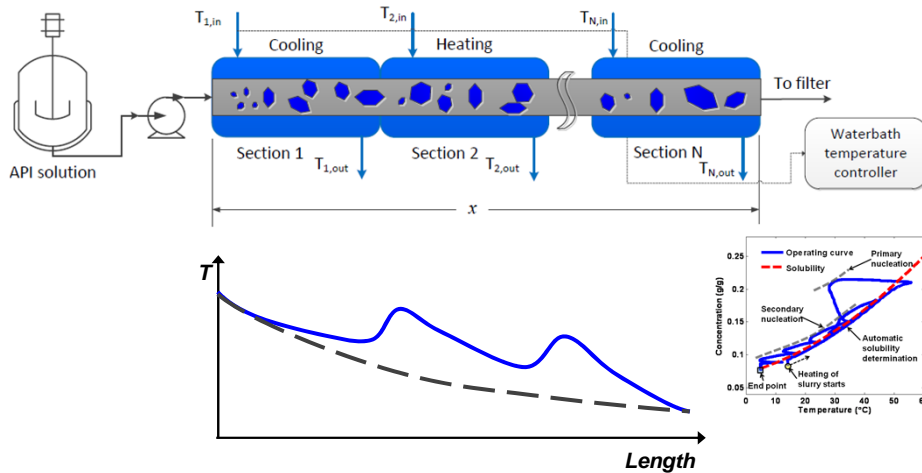
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Continuous plug flow crystallizer with controlled dissolution segments



- Spatially distributed operating profile (heating/cooling or antisolvent/solvent)
- Alternating nucleation-growth-dissolution segments

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PBM of the Continuous Plug Flow Crystallizer

Steady state model equations

- Population balance equation (PBE) is used to model the crystallization process
- Steady state PBE for growth and nucleation

$$u_x \frac{\partial n}{\partial x} + \frac{\partial Gn}{\partial L} = B\delta(L - L_0); S \geq 0$$

- PBE for dissolution

$$u_x \frac{\partial n}{\partial x} - \frac{\partial Dn}{\partial L} = 0; S < 0$$

- Kinetics

$$\rightarrow G(t) = k_g S^g (1 + \gamma L)^p;$$

$$\rightarrow D(t) = \frac{k_d}{L^q} (-S)^d;$$

$$B = k_b S^b; S = (C - C_{sat})$$

- Mass balance

$$u_x \frac{dC}{dx} = -3\rho_s k_v G \int L^2 n dL$$

High resolution technique for solving PBES

- Efficient, accurate and captures discontinuity
- Define the cell average in each cell

$$n_i = \frac{1}{\Delta L} \int_{L_{i-1/2}}^{L_{i+1/2}} n dL ; \quad \begin{array}{c} \bullet \\ | \\ L_{i-1/2} \quad n_i \quad L_{i+1/2} \\ | \\ \bullet \end{array}$$

- The PBE becomes a set of ODEs

$$\frac{dn_i}{dx} = -\frac{1}{\Delta L} (F_{i+1/2} - F_{i-1/2});$$

$$F_{i+1/2} = G_{i+1/2} n_{i+1/2}$$

- Flux reconstruction in cell boundary

$$n_{i+1/2} = n_i + \frac{1}{2} \phi(r_{i+1/2})(n_{i+1} - n_i)$$

- van Leer flux limiter to remove oscillation near discontinuity

$$\phi(r_{i+1/2}) = \frac{|r_{i+1/2}| + r_{i+1/2}}{1 + |r_{i+1/2}|};$$

$$r_{i+1/2} = \frac{n_i - n_{i-1}}{n_{i+1} - n_i}$$

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Optimization Problem: CSD shaping in continuous crystallisation

- Temperature profile along the crystallizer with dissolution for fine removal
- Objective function to be minimized:

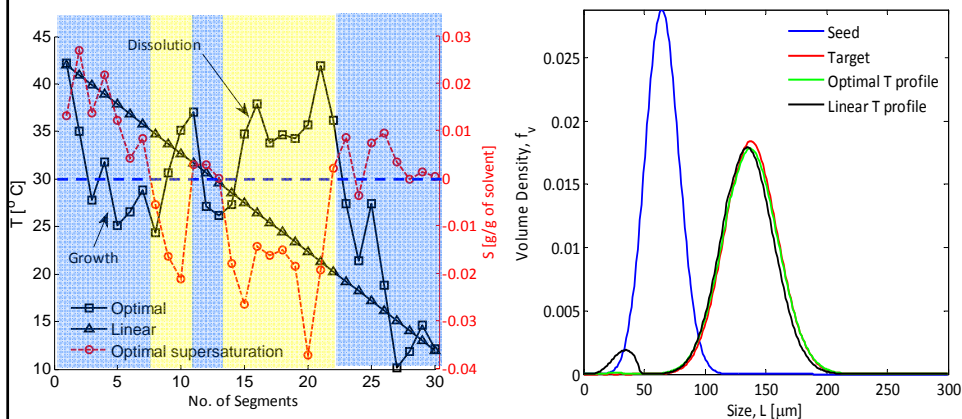
$$\min_{T^{(k)}} \left\{ J = \sum_{i=1}^N \lambda_i (f_{v,i}^t - f_{v,i})^2 \right\};$$

↑ Target CSD ↑ Predicted CSD

- Gradient based methods are often caught in local minima due to high nonlinearity of the problem
- A stochastic technique genetic algorithm (GA) is used to solve the optimization problem
- Allows also to optimize number of segments needed → MINLP
- **Combined design and control** of crystallisation processes

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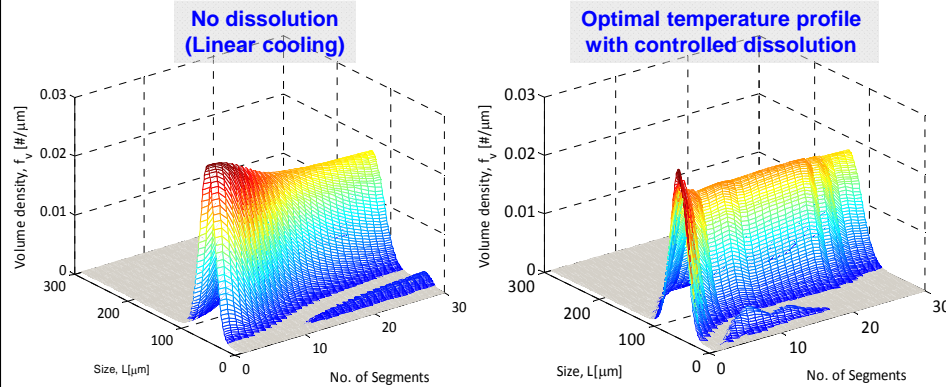
Spatially distributed control of product CSD with fines removal



- Linear temperature profile produces large amount of fines
- The optimal profile alternates between growth and dissolution eliminate fines
- Three growth and 2/3 dissolution clusters
- Optimal profile also needed within clusters

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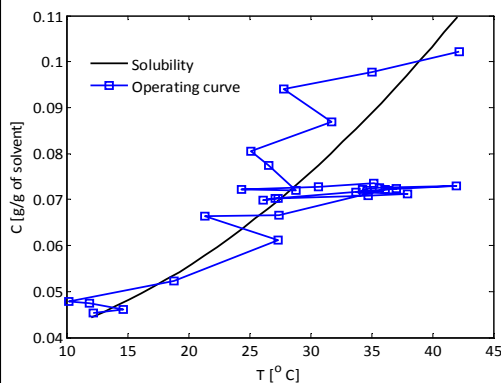
Spatial evolution of CSD



- Linear temperature profile produces lots of fines
- The optimal profile alternates between growth and dissolution to eliminate fines

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Spatial operating profile in the phase diagram



- Spatial optimal profile can be represented in the phased diagram
- Optimal operating profile both in the supersaturated and under saturated region
- Dissolution rate is also manipulated
- For poorly soluble compounds large under-saturation needed

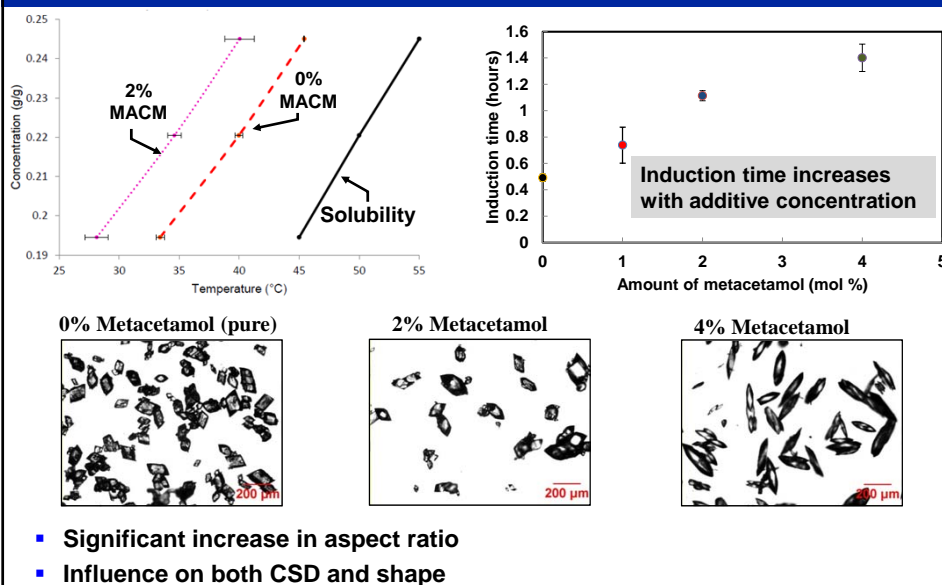
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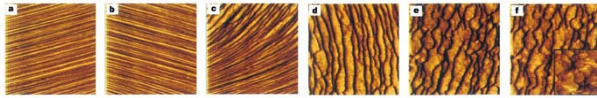
Effect of additives on nucleation and crystal shape of Paracetamol



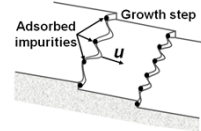
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Multi-dimensional PBM with the effect of impurities/additives (growth modifiers)

- Step velocity decreases with time leading to degradation of crystal surface



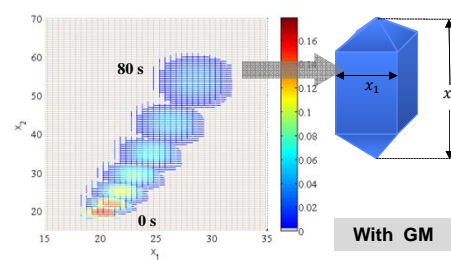
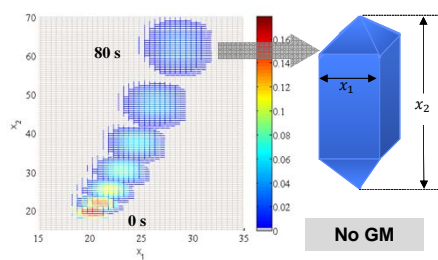
KDP grown in the presence of Fe^{3+} (Terry et al. Nature, 1999)



- "Poisoning effect" of impurities → growth reduction (unsteady-state adsorption)

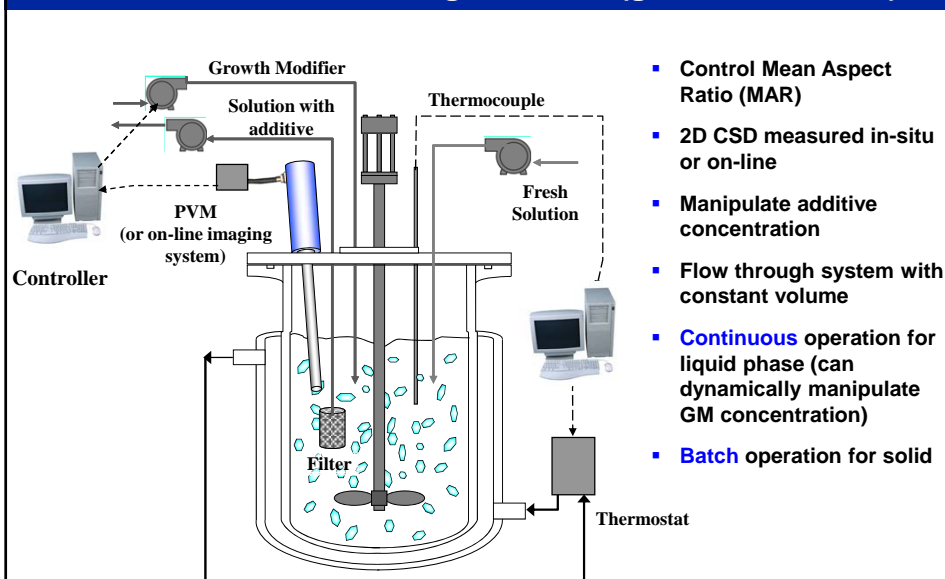
$$G(t) = G_0(t) \left(1 - \alpha \frac{KC_i}{1 + KC_i} \left(1 - \exp\left(-\frac{t}{\tau}\right) \right) \right)$$

Use additives to achieve & control product properties (shape, polymorph, etc.)



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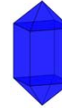
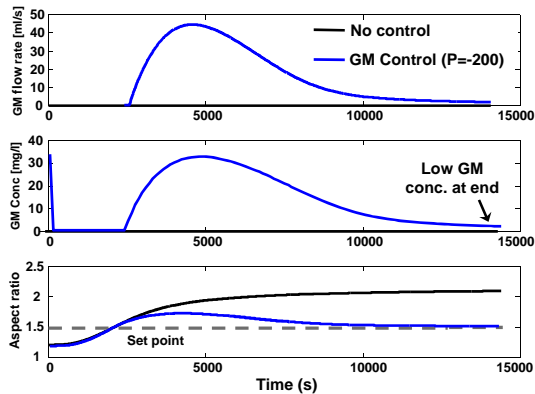
Hybrid Continuous-batch crystallisation setup for shape distribution control using additives (growth modifiers)



- Control Mean Aspect Ratio (MAR)
- 2D CSD measured in-situ or on-line
- Manipulate additive concentration
- Flow through system with constant volume
- Continuous operation for liquid phase (can dynamically manipulate GM concentration)
- Batch operation for solid

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Dynamic GM feedback control of mean aspect ratio



Mean aspect ratio=2.1
(No control)



Mean aspect ratio=1.5
(With GM control)

- Hybrid operation allows dynamic manipulation of GM concentration
- Mean aspect ratio significantly reduced (~30%)
- GM concentration high during middle of batch but very low at the end (no contamination of product)

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Summary

- Many economic drivers for better control of CSD and shape
- Concept of composite sensor array (CSA) and CryPRINS allow continuous and real-time full characterisation of the crystallisation
- Model based optimal control and design can significantly improve the pharmaceutical production process
- Novel control approach for continuous crystallisation with spatially distributed controlled dissolution for fine removal
- Shape distribution control using GM and hybrid continuous-batch crystallisation operation

Thank You

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