

Characterization of Two-Phase Flows Through Image Processing Methods and Stochastic Geometry





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Motivation

> **Industrial problematic:** need to control and optimize two-phase processes (liquid-liquid extraction, gaz-liquid reactor, etc.).

Objectives: Determine useful characteristics (particle size distribution, exchange surface, morphology) of the dispersed phase at high hold-up

> **Difficulty**: dense two-phase flows leads to overlaps of projected particles.



Gaz-liquid flow (air bubbles in water)

Experimental Setup

- A glass reactor (plane and sintered)
 - Gaz-liquid flow (e.g.: air+water)
- Collimated light source
- Rapid CMOS camera with high resolution (1MPixel, 12bits)





Methodology

1) Image processing method (de Langlard et al. (2016))

- Pre-processing to reduce noise and enhance the contrast of the image (median filtering, subtraction of the mean image, etc.),
- Edge detection of cluster of particles
- Segmentation (individualization) of particles within the clusters.



Limitations:

- Case with very high hold-up hardly handled (+60% of the image),
- Retrieval of 2D information only.
- Bad detections when the particle shape deviate from an ellipse,
- Complete superimposition of projections not processed,
- => Use of stochastic geometry

2) Modelling through stochastic geometry

The main idea: find a 3D model that replicates the geometry and spatial characteristics of the 2D observed data

Several steps

- Use a 3D finite Matèrn model
- > Make inference on the model either directly (trial-and-error estimation or method of moments) or through a 2D Quermass-interaction model ((Moller *et al.* (2010), Dereudre *et al.* (2014))
- > Evaluate the accuracy of the model on calibrated silica spheres images





Real binary image

Orthogonal projection of 3D Matern model $(W = 10 \times 10 \times 10, \lambda = 0.09, r \sim U([0.1, 0.45]))$

Finite Matèrn Model

Problem: how to define the projection of a point process?

Exploratory Analysis of the Projected Point Process

Comparison of some second-order characteristics function between the projected process

- > Stationary point process => Garcia (2000)
- Use a finite point process

Define a 3D marked point process of hardcore spheres with random radius in a bounded window following Matèrn thinning procedure

- Consistent with the application
- \succ Flexible for defining interaction (repulsion) with the boundary of the window (through a function *U*)

Retention probability of point located at x and with radius r

$$g(x,r) = \int_0^1 \exp\left(-\left(U(x,r,w) + \lambda(1-w)\int_0^{+\infty} v(B(x,r+y) \cap W)F(dy)\right)\right) dw$$

where U(x,r,w) (energy function) represents the (first-order) interaction between the point located at x with radius r and weight w.





and the point process of detected centers by the proposed algorithm



Conclusions & Outlook

- > First estimation achievement of the size distribution of overlapping elliptical particles (in 2D) using segmentation methods
- > Definition of a finite Matern model including first-order interaction with the boundary
- > Exploratory analysis brings confidence on using the proposed 3D model to characterize a two-phase flows

> Outlook:

- Propose an inference procedure to determine parameters of the 3D Matern model,
- Extension to ellipsoidal shape.

References

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