



# Sensitivity of particle size & shape parameters with respect to digitization

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Godefroid DISLAIRE

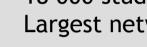


# Liège University (ULg)

# A prominent research partner in Belgium







18 000 students - 2000 PhD students Largest network of spin-off companies in Belgium (>70)







GeMMe – Minerals Engineering, Materials & Environment







- Importance of size & shape indices
- Emerging ISO Standards for IA
- Exner « quality criteria »

#### Material & Methods

- Sub-pixel digitization
- Simulated particles
- Real particles
- Area-Perimeter-Elongation-Bluntness

#### Results

- Accuracy of size/shape estimators
- Practical implications

#### Perspectives













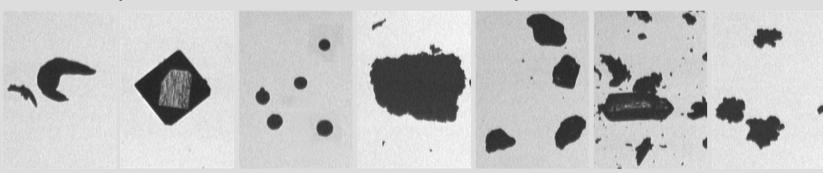
## Introduction

- Importance of size & shape indices
- Emerging ISO Standards for IA
- Exner « quality criteria »





Importance of Particle Size and Shape



- Non imaging methods (indirect)
  - Sieving
    - » Weight of particles passing through a square mesh
  - Laser Diffraction
    - » Inversion of a cumulated diffraction pattern as a distribution of spheres
  - ...
- Imaging methods (direct)
  - Image Analysis
    - » Individual pictures of particles
    - » No hypothesis on particle shape
    - » Distributions in « volume » or number





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#### Maturity of Image Analysis based technologies

- **Dedicated instruments** 
  - Coarse (50  $\mu m$  5 mm) / Fine (500 nm 200  $\mu m$ ) powders
  - Wet / Dry powders





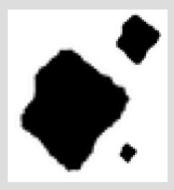
de Liège



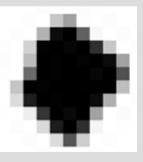


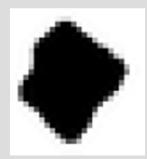
#### ISO Standards

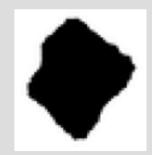
- ISO 13322-1 Particle size analysis Image analysis methods
- ISO 9276-6 Descriptive and quantitative representation of particle shape and morphology
  - ISO parameters are
    - » A trade-off between manufacturers
    - » Ease of computation
    - » Simple definition
  - No recommendations on
    - » Image acquisition (magnification, resolution)
    - » Image segmentation (thresholding).



















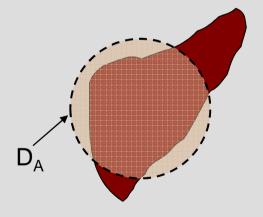
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Quality of shape parameters
 <sub>Exner (1987)</sub>

- Relevance
- Robustness
- Independence
- Sensitivity
- Additivity
- Accessibility

ISO Equiv. Area Disk Diameter:

$$D_A = 2.\sqrt{\frac{A}{\pi}}$$



Not a physical dimension of the particle

A lot of decimals... but no precision!











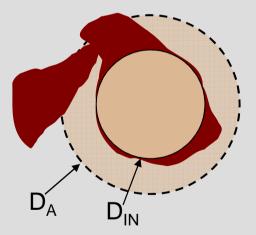
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## Quality of shape parameters

Exner (1987)

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Robustness with respect to touching particles



 $D_A$  is twice as large as  $D_{IN}$ !













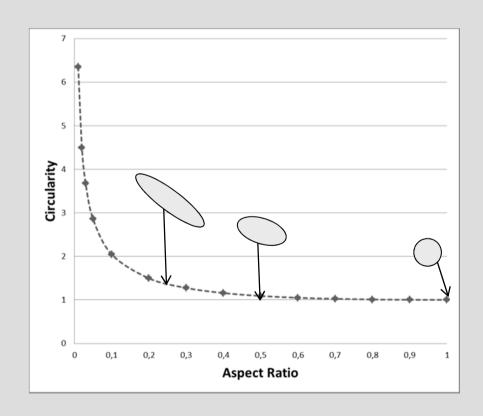
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$$F = \frac{4.\pi.A}{P^2}$$



Circularity (= shape factor F) is a function of elongation AND roughness





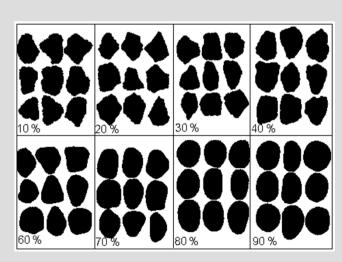


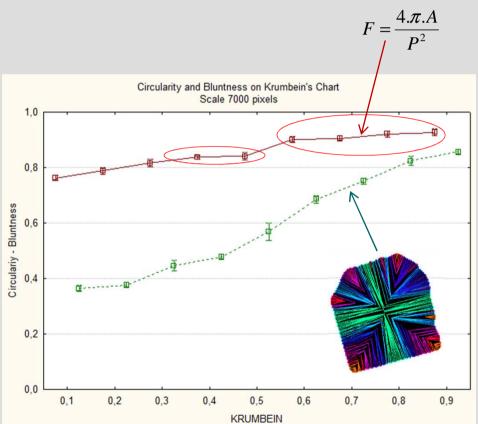


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## Quality of shape parameters

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Exner (1987)







#### Material & Methods

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# Material & Methods









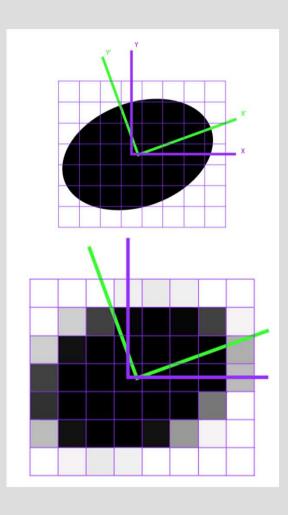




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#### • Simulation of particles

- Geometric shapes
  - Grid density (resolution)
  - Translation
  - Rotation
    - » 16 x 16 subsampling grid
    - » Grey level = Area coverage
  - Threshold





# Material & Methods





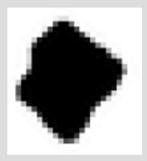


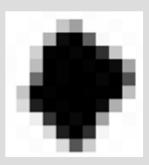




- Simulation of particles
  - Real shapes
    - Imaging at high resolution
      - » 10 000 pixels/particle
    - Subsampling
      - » 16 x 16 subsampling grid
      - » Grey level = area coverage
      - » down to 100 pixels/particle





















## Results

- Evolution of parameter with
  - pixel density
  - Rotation/translation
  - thresholding

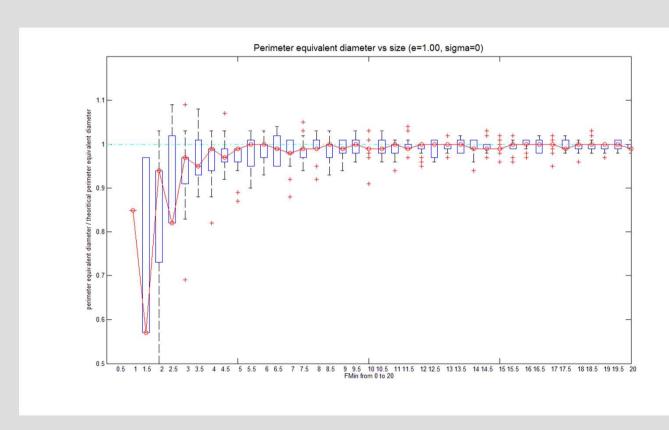






#### • Perimeter vs Resolution





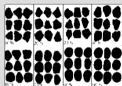
Crofton's perimeter equivalent diameter vs. theoretical diameter as a function of pixel density (from 1 to 20 pixels)



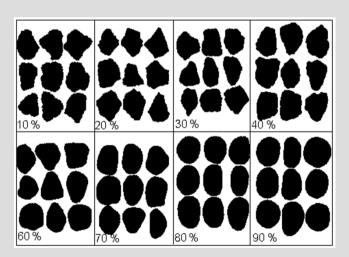




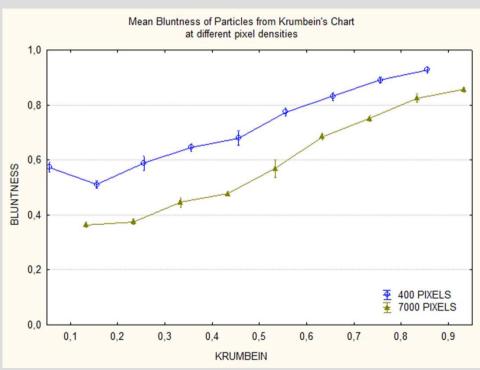
**Bluntness vs Resolution** 













# Perspectives



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#### Practical Conclusions

- Pertinence of Exner's criteria
  - » Independence, Sensitivity,...
- Recommendations of min. resolution for ISO standards
  - » 10 pixels for size
  - » 200 pixels for aspect ratios
  - » 2000 pixels for « roughness »
- Comparison of shape within narrow size ranges
  - » Be aware of pseudo-correlations the « fine is smooth » effect
- More systematic work on analytical errors in Image Analysis