

Université  
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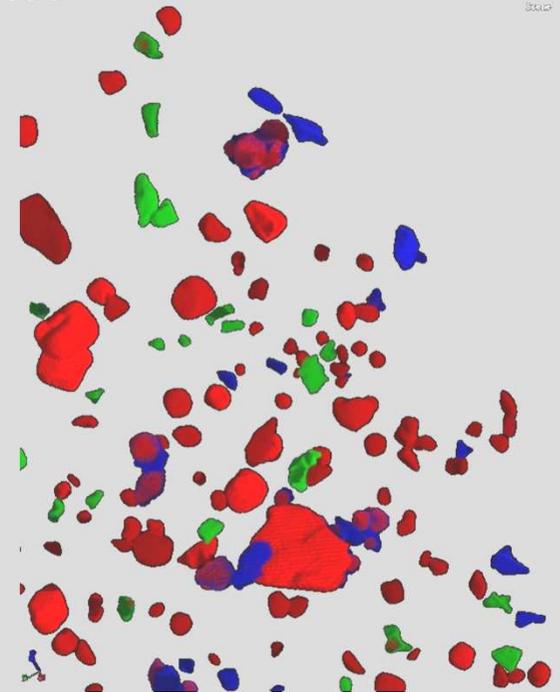
# TEXTURAL DESCRIPTORS *FOR MULTIPHASIC ORE PARTICLES*

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- **Introduction**
  - Complex ores
  - Liberation theory
  - Predicting Particle Behaviour
- **Methods**
  - Notations
  - Review of indices
  - Intercept distributions
- **Simulated Materials**
  - Rim/Emulsion
  - Veins
- **Results**
  - Performance evaluation
- **Perspectives**

# Introduction

- Complex Ores
- Liberation Theory
- Predicting Particle Behaviour



- Mineral Processing & Recycling
  - Aim : Separate valuable material from « gangue »
    - e.g. Copper ore
      - » Typically 1%-2% of Cu bearing minerals !



- e.g. Waste Electrical Electronic Equipment (WEEE)
  - » Cu wires in Printed Circuit Boards

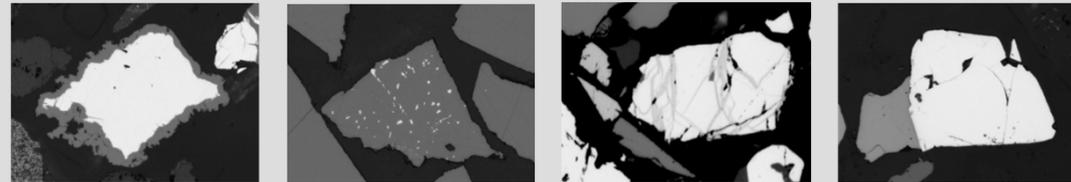


- Grinding

- Aim: Produce particles with a predictable behaviour



← ..... middlings ..... →



- Gravimetry

- » Separation based on DENSITY

- Flotation

- » Separation based on HYDROPHOBICITY

- Leaching

- » Selective dissolution based on ACCESSIBILITY

- Liberation Analysis

- Standard

- Area fraction of valuable phase ( $A_A$ )
- Systematic overestimation

$A_A = 0\%$



$A_A = 50\%$



$A_A = 100\%$



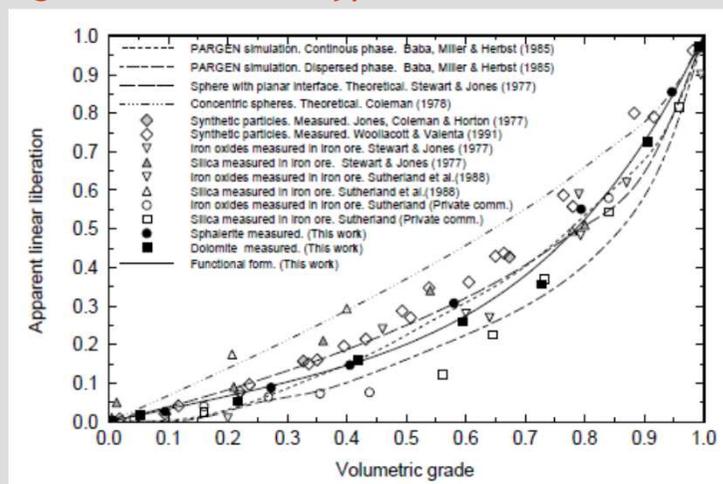
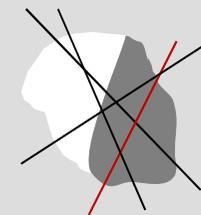
- Stereologic

- Apparent Lineal Liberation

» Nb fraction of fully liberated random intercepts

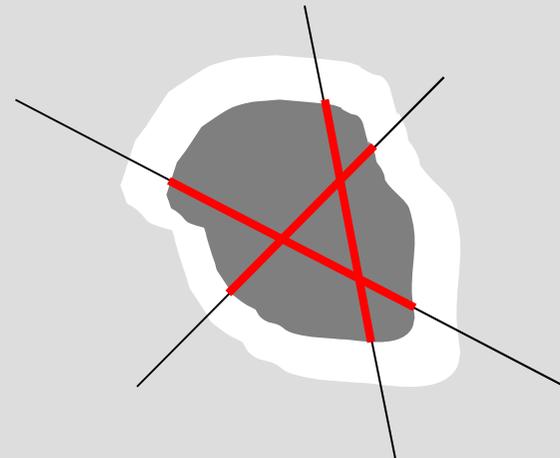
- Theory of Liberation (King, Schneider, Barbery,...)

» Homogeneous texture hypothesis



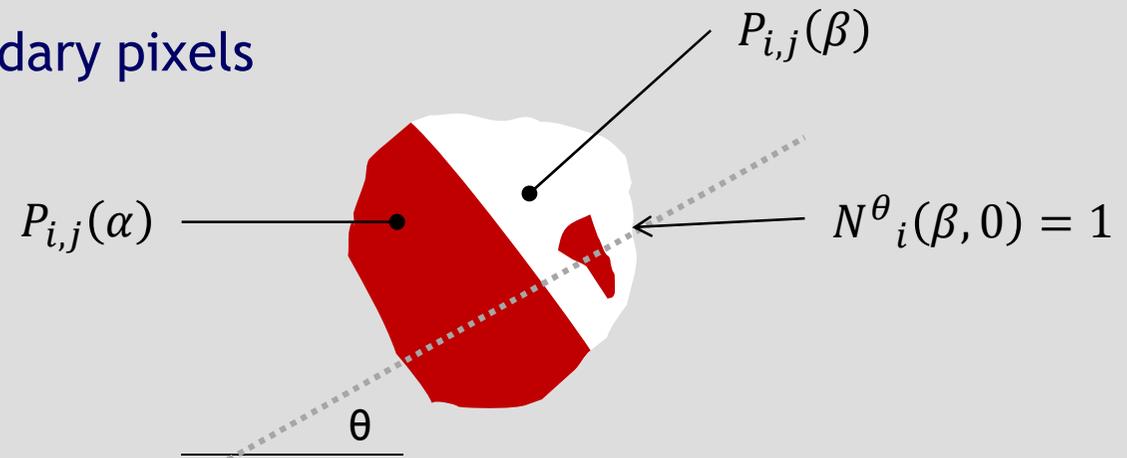
## Methods

- Notations
- Review of indices
- Intercept distributions



- Plain vs Boundary pixels

Phases  $\alpha, \beta, \gamma, \dots$   
 $\varphi$  : all phases  
 $0$  : background  
 $\cdot$  : phase or background



- Area Fraction of phase  $\alpha$ :

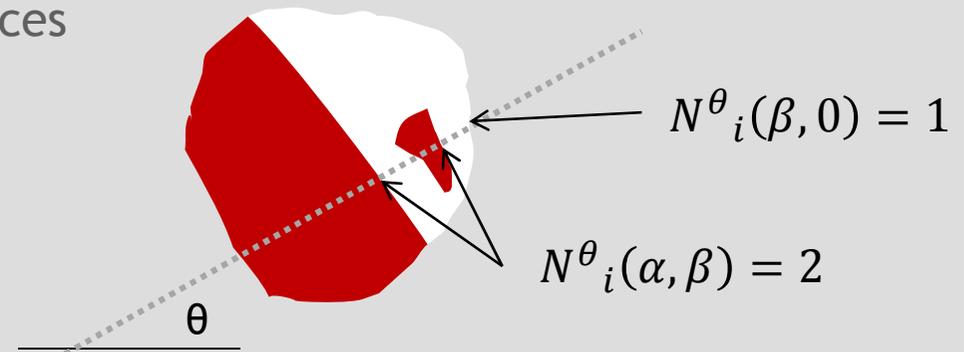
$$A_A^\alpha = A_A(\alpha) = \frac{\sum_i \sum_j P_{i,j}(\alpha)}{\sum_i \sum_j P_{i,j}(\varphi)}$$

- Boundary Ratio of phase  $\alpha$ :

$$B_B(\alpha) = \frac{\sum_j N_j^\theta(\alpha, 0)}{\sum_j N_j^\theta(\varphi, 0)}$$

- Contiguous pixels
  - Phase contact indices

Phases  $\alpha, \beta, \gamma, \dots$   
 $\varphi$  : all phases  
 $0$  : background  
 $\cdot$  : phase or background



- C1  
*a/B interface relative to boundary:*

$$I_{C1}(\alpha, \beta) = \frac{\sum_j N_j^{\theta}(\alpha, \beta)}{\sum_j N_j^{\theta}(\varphi, 0)}$$

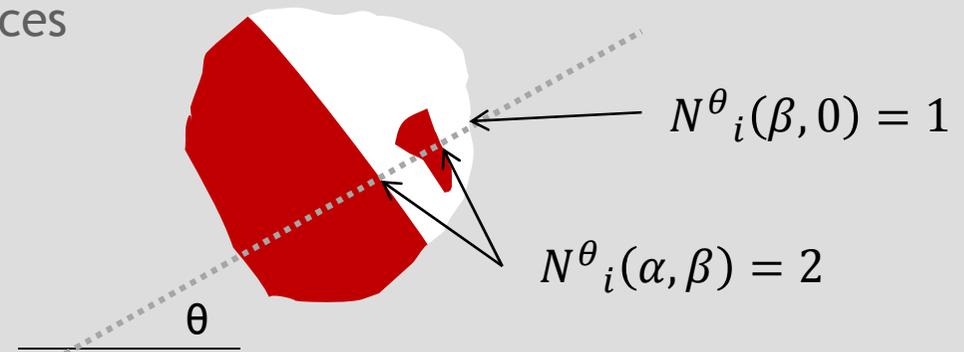


- C2  
*a/B interface relative to a-boundary:*

$$I_{C2}(\alpha, \beta) / \alpha = \frac{\sum_j N_j^{\theta}(\alpha, \beta)}{\sum_j N_j^{\theta}(\alpha, 0)}$$

- Contiguous pixels
  - Phase contact indices

Phases  $\alpha, \beta, \gamma, \dots$   
 $\varphi$  : all phases  
 $0$  : background  
 $\cdot$  : phase or background



- Amstutz-Giger:

$$I_{A-G}(\alpha, \beta) = \frac{\sum_j N_j^\theta(\alpha, \beta)}{\sum_j N_j^\theta(\varphi, \cdot)}$$

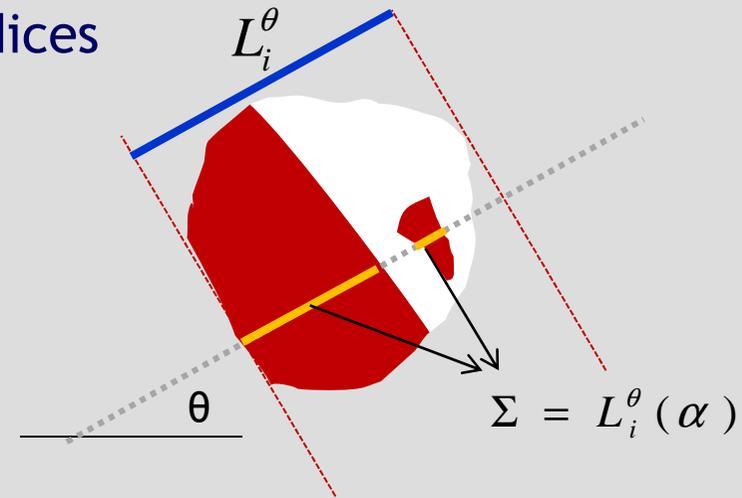
- Jeulin:

$$I_J(\alpha, \beta) = \frac{\sum_j N_j^\theta(\alpha, \beta) \times \sum_j N_j^\theta(\varphi, \cdot)}{\sum_j N_j^\theta(\alpha, \cdot) \times \sum_j N_j^\theta(\beta, \cdot)}$$

- NAB:

$$N_{\alpha\beta} = \frac{\sum_j N_j^\theta(\alpha\beta)}{N(I^\theta)_{\text{NonLiberated}}}$$

- Intercepts based indices



- $L_L$   
Mean of lineal liberation by number

$$\overline{L_L}(\alpha) = \frac{1}{N(I^\theta)} \sum_{\theta} L_{Li}^\theta(\alpha)$$

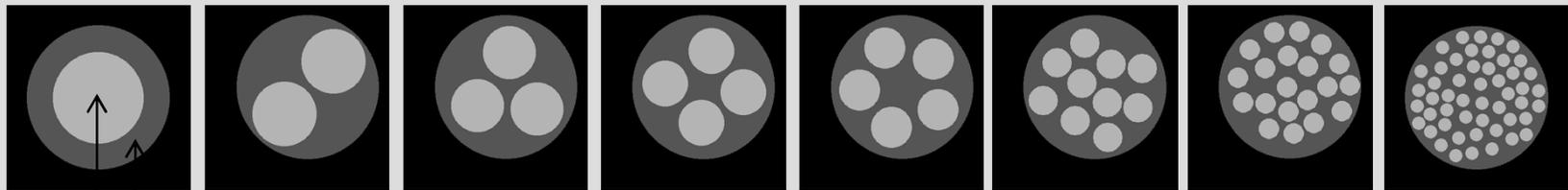
- $L_{LA}$   
Apparent liberation index by length

$$L_{LA}(\alpha) = \frac{\sum_i \sum_j P_{i,j}(\alpha)}{A} \text{ iff } L_{Li}^\theta(\alpha) = 100\%$$

- Simulated Particles

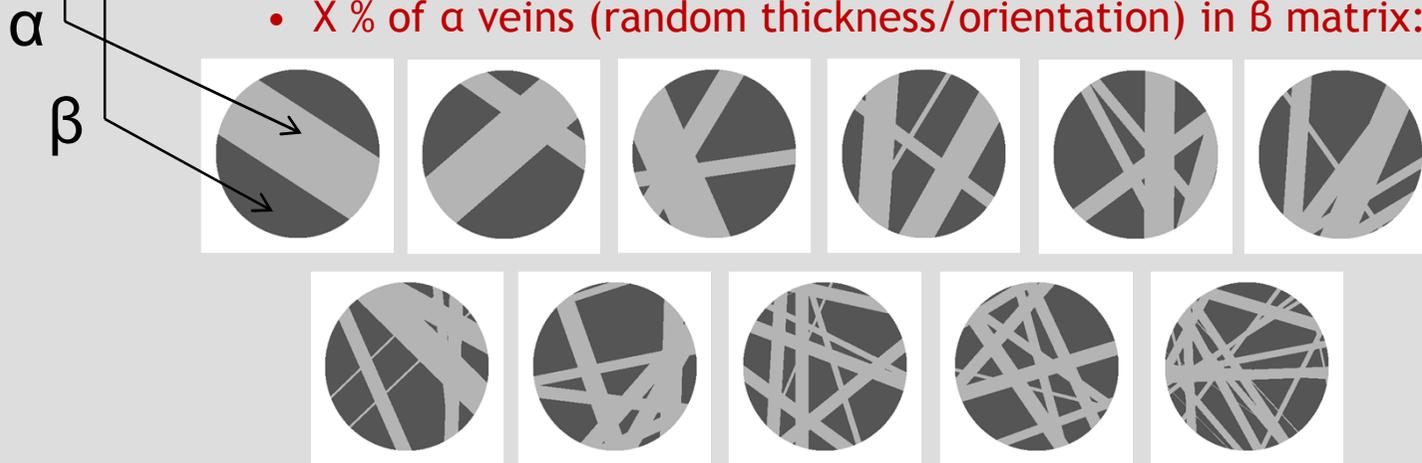
- Emulsion series

- X % of  $\alpha$  inclusions (hard balls) in  $\beta$  matrix:



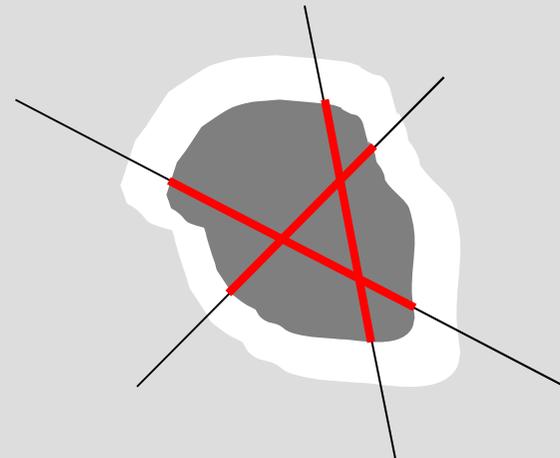
- Poisonian Veins series

- X % of  $\alpha$  veins (random thickness/orientation) in  $\beta$  matrix:



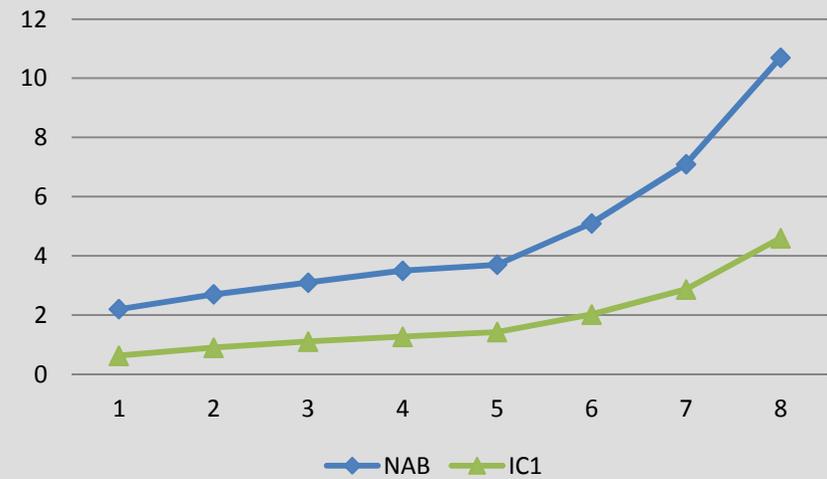
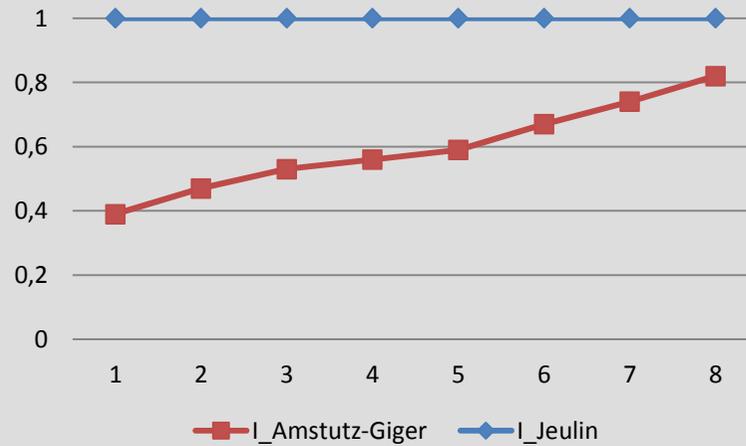
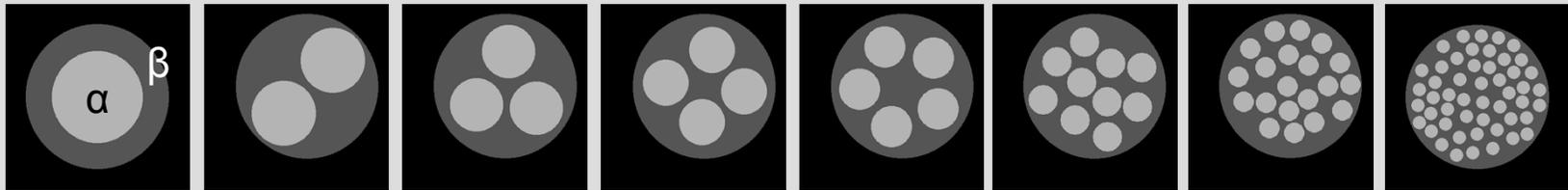
# Results

- Performance evaluation



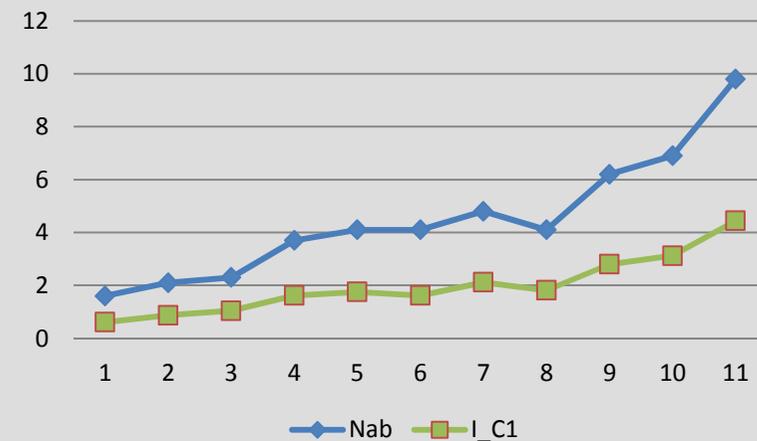
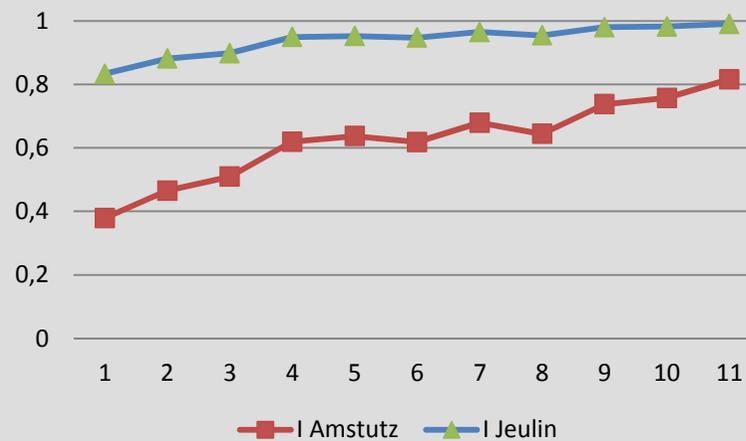
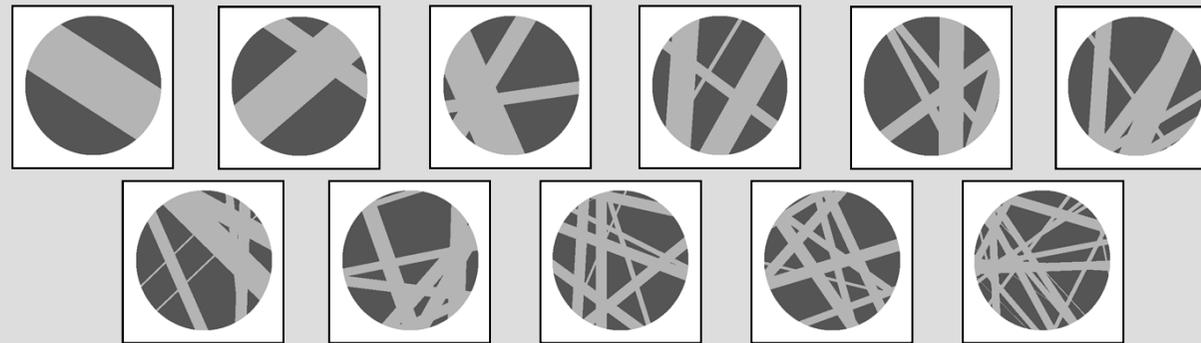
- Emulsion Series

- Area fraction ( $A_A(\alpha)=0,4$ )
- Boundary ratio ( $B_B(\alpha)=0$ )



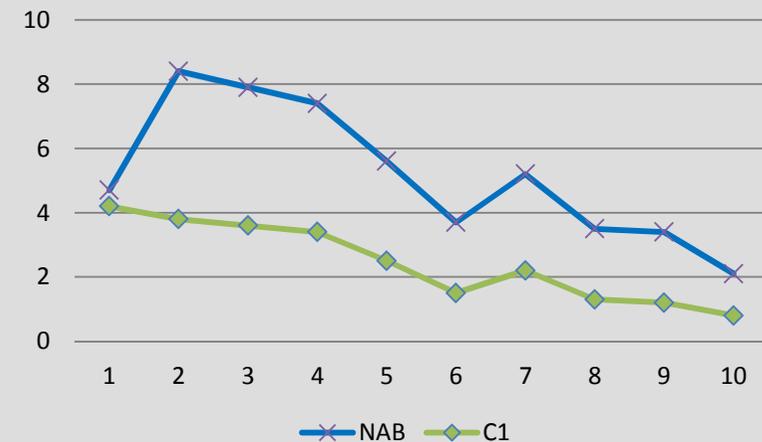
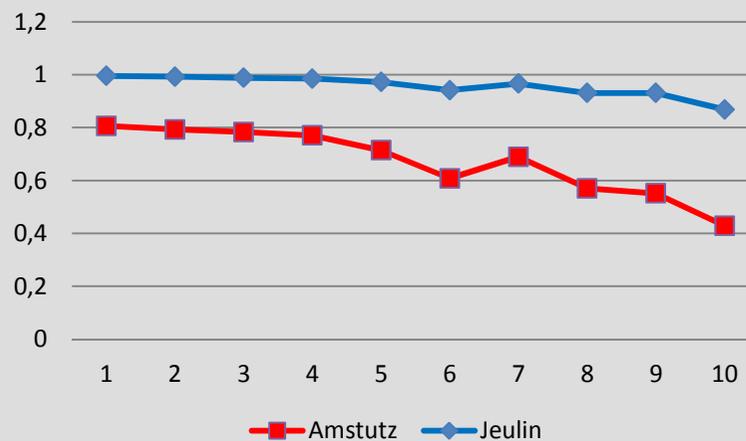
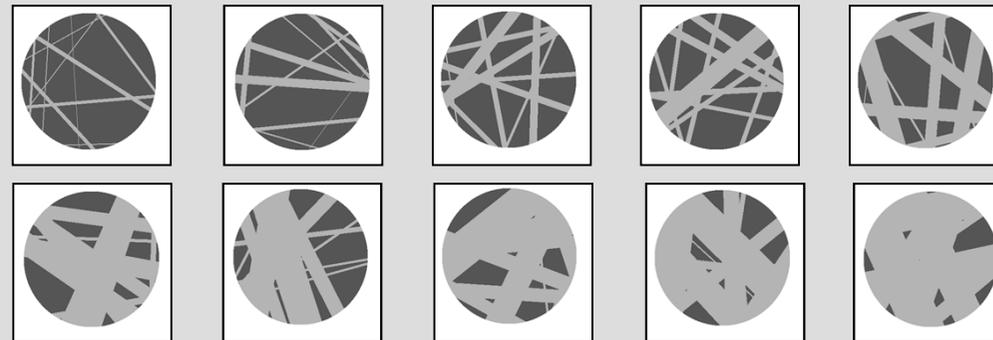
- Poisson Veins Particles

- Area fraction ( $A_A(\alpha) = 0,5$ )
- Boundary ratio ( $B_B(\alpha) = 0,27$  to  $0,42$ )



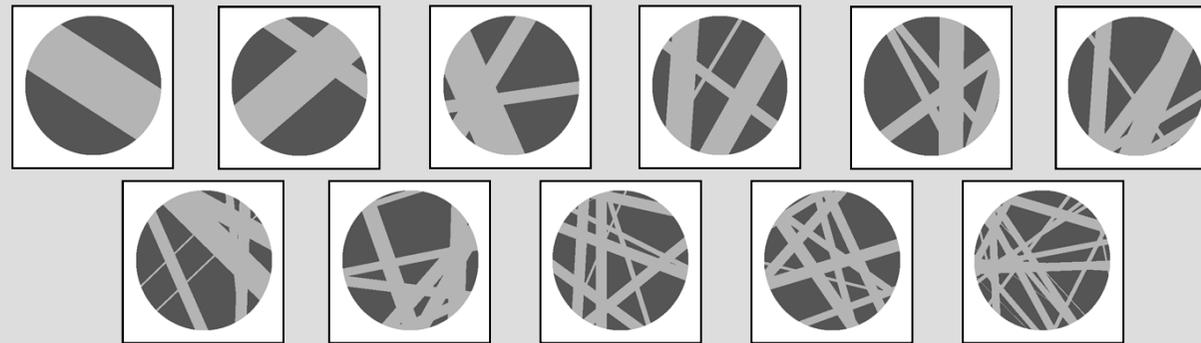
- Poisson Veins Particles

- Area fraction ( $A_A(\alpha) = 0,14$  to  $0,9$ )
- Boundary ratio ( $B_B(\alpha) = 0,12$  to  $0,72$ )

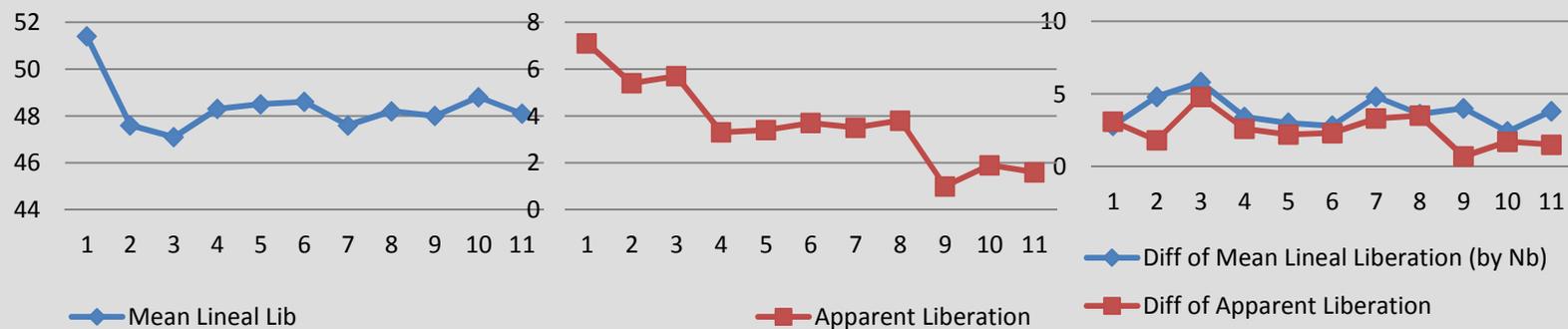


- Poisson Veins Particles

- Area fraction ( $A_A(\alpha) = 0,5$ )
- Boundary ratio ( $B_B(\alpha) = 0,27$  to  $0,42$ )



» Mean and apparent liberation indices (for matrix)



- From Indicator to Predictor
  - What is pertinent for Flotation ? etc.
  - Multivariate problem ( $A_A, B_B, N_{\alpha\beta}, \dots$ )
- Performance Evaluation of Indices
  - Sensitivity ( $N_{\alpha\beta}, IC1$ )
  - Non-normalized indices  $[0,1]$
  - Threshold value ?
- Statistics on distributions of intercepts
  - Length-weighted intercepts
  - Percentiles of intercept length:  $P_{95} (L_L(\alpha))$
- Work on real particles
  - Binary mix
  - Multiple phases ( $\alpha, \beta, \gamma, \dots, \varphi$ )