

# Analysis of the spatial organisation of maize vascular bundles

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SSIAB 2012 - Avignon

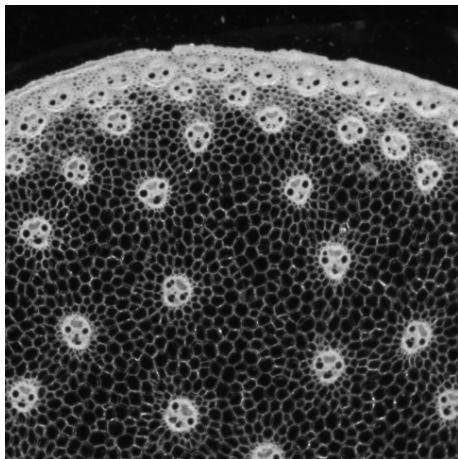


# Context: valorisation of agro-resources

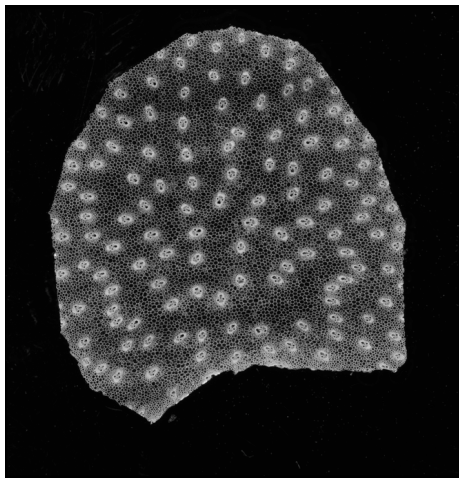


# Objectives

- Quantify relationships:
  - ▶ bio-chemical composition
  - ▶ cellular morphology & organisation
  - ▶ cell wall degradability
- Quantify histology

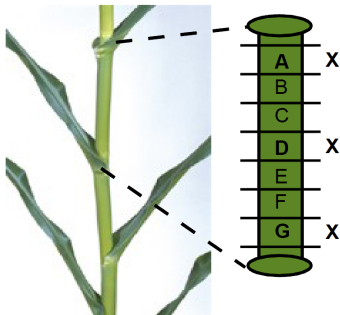


# Macroscopy imaging



- BlueBox imagery
  - ▶  $4000 \times 4000$  pixels<sup>2</sup>
  - ▶ Resolution  $\simeq 3.6$   $\mu\text{m}/\text{px}$
  - ▶ field of view:  $1.5 \times 1.5$  cm<sup>2</sup>
- Can observe
  - ▶ cells
  - ▶ vascular bundles
  - ▶ their relative position

# Maize sampling

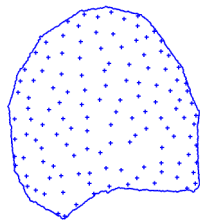
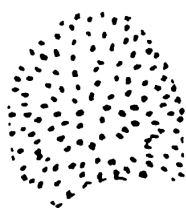
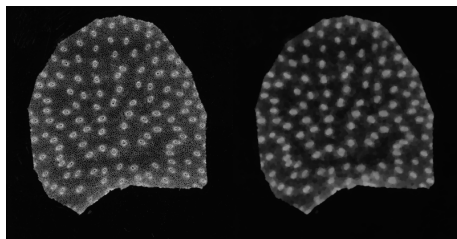


- Sampling:

- ▶ 2 genotypes
- ▶ 8 stems by genotype
- ▶ 3 slabs by stem

# Image Processing

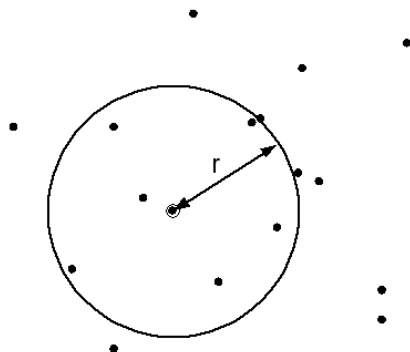
- Vascular bundles segmentation
- Contour segmentation and simplification
- Results in a bounded point pattern



# Descriptive functions

- Ripley's K-function

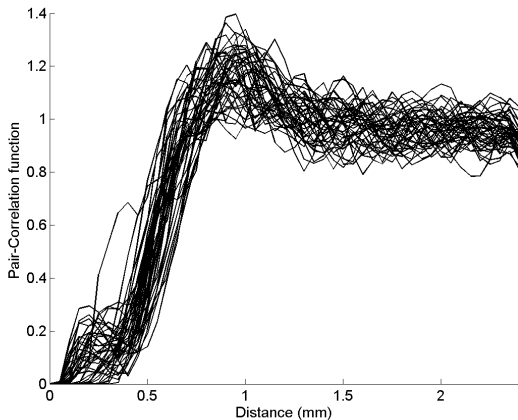
$$K(r) = \frac{\#\{X \setminus x \cap b(x, r)\}}{\lambda}$$



- Pair-correlation function (PCF)

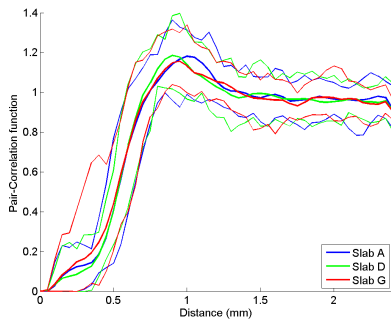
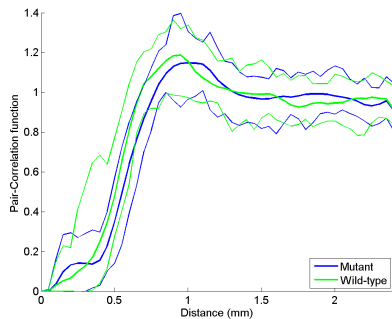
$$g(r) = \frac{K'(r)}{2\pi r}$$

# Group-wise analysis



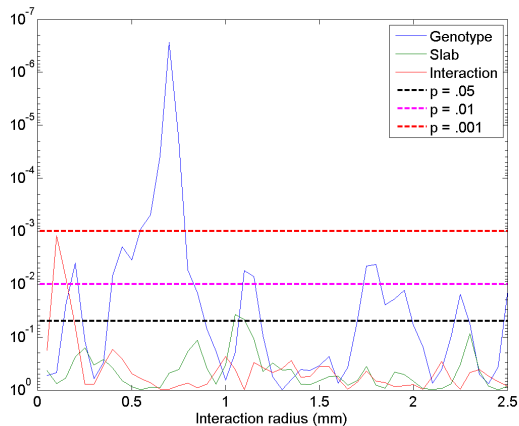


# Average by group



# Multivariate Analysis of Variance (MANOVA)

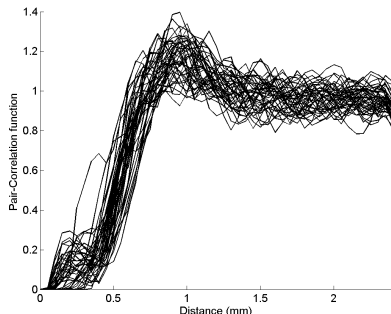
- computation of p-value for each distance, plot  $-\log(p)$
- model = genotype + slab + interaction



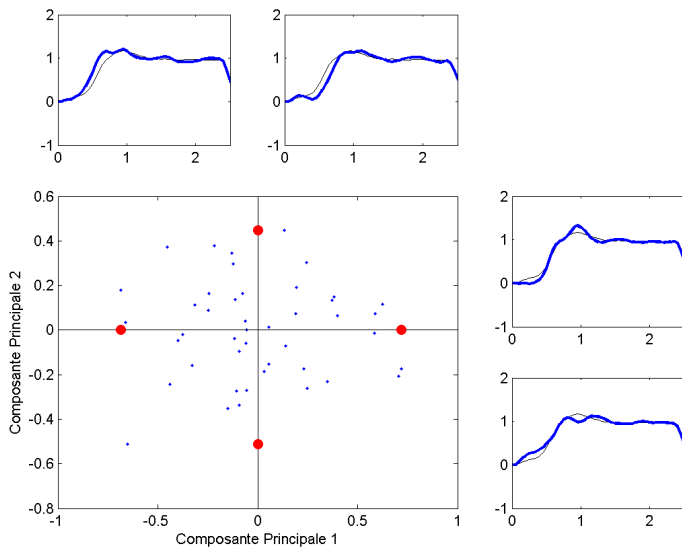
# Principal Components Analysis of functions

- each curve is seen as a point in  $\mathbb{R}^p$
- analysis of variations around the mean curve
- interpret loadings as curve tendencies

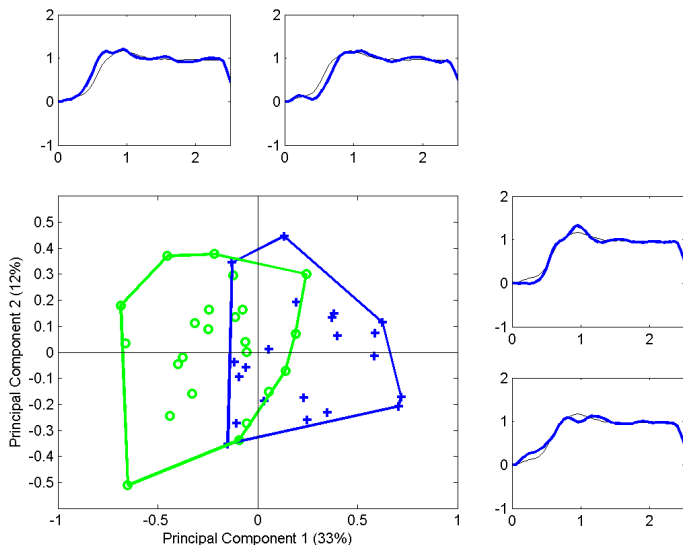
$$\begin{aligned}f_i(r) &= f_0(r) \\ &+ c_{i,1} \cdot v_1(r) \\ &+ c_{i,2} \cdot v_2(r) \\ &+ \dots\end{aligned}$$



# Interpretation of eigen vectors

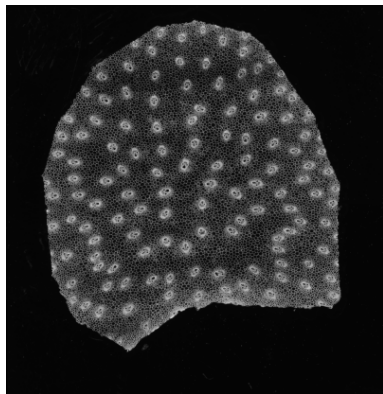


# Testing hypotheses

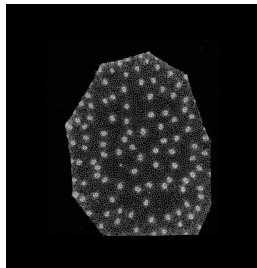
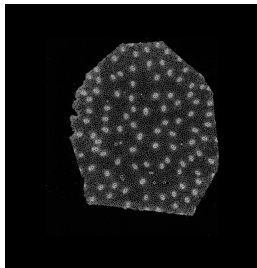
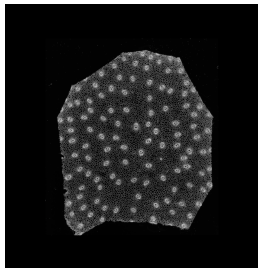
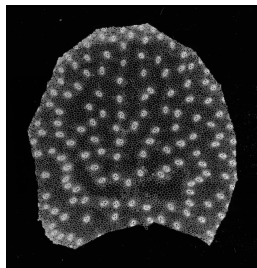
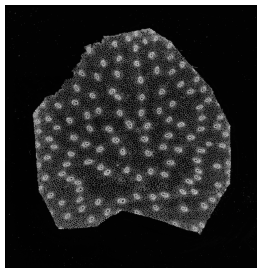
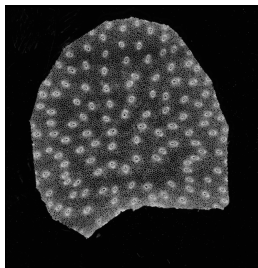


# Summary

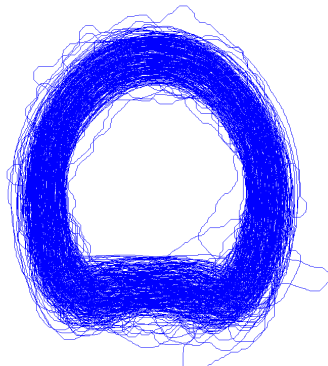
- PCA on PCF
  - ▶ allows groupwise analysis
  - ▶ synthetic curves
  - ▶ detection of differences
- Limits
  - ▶ loadings interpretation
  - ▶ non homogeneity



# Density Estimation

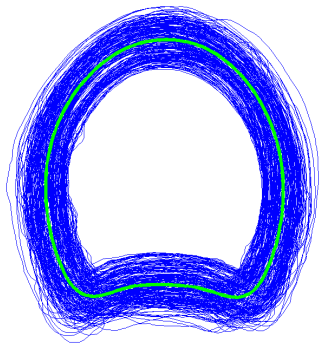


# Slab imagery and segmentation



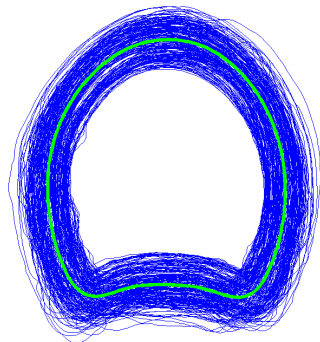


# Slab imagery and segmentation

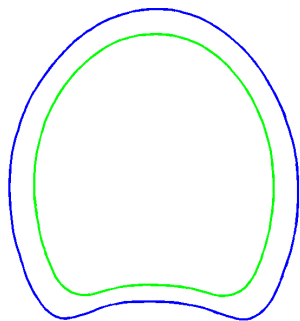


# Shape analysis on contours

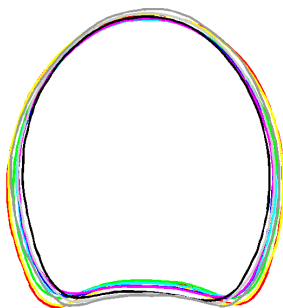
- Apply PCA on contours
- Reference contour + effects:
  - ▶ genotype
  - ▶ slab
  - ▶ stem



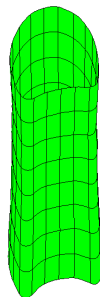
# Contour modelling



by genotype

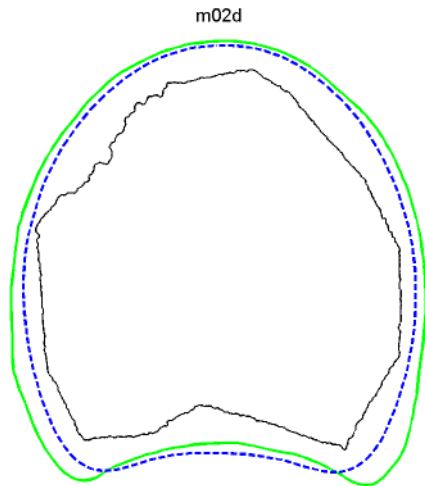


by slab

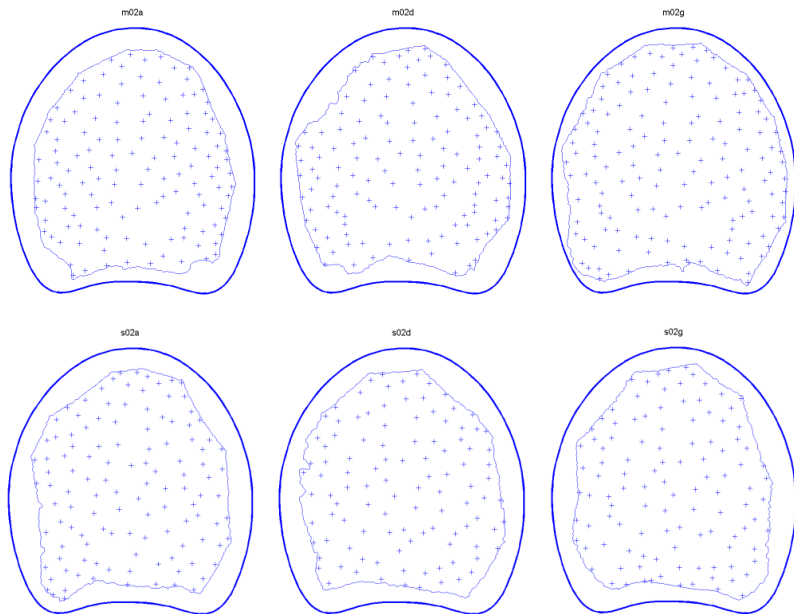


sample stem

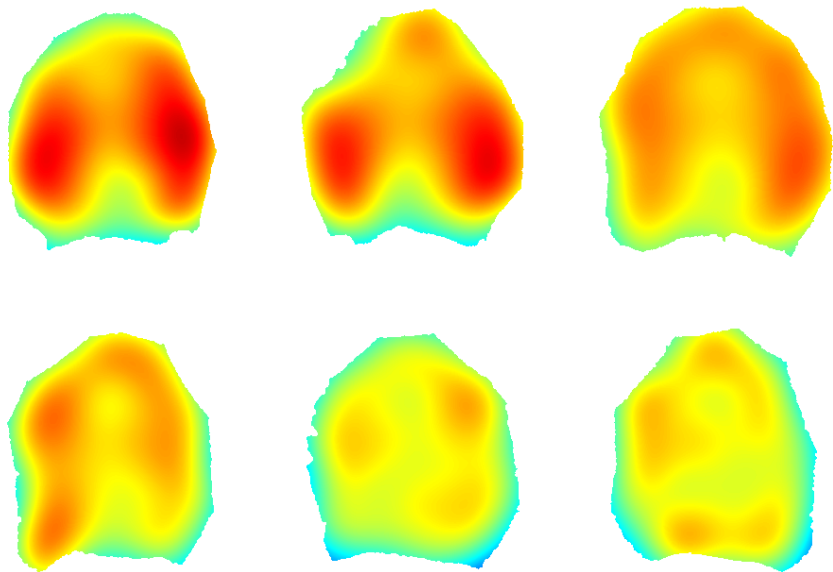
# Spatial normalisation



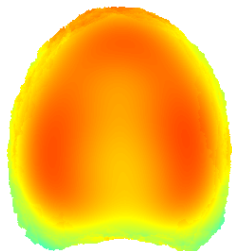
# Projection onto reference slab



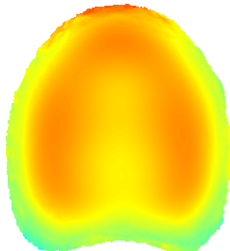
## Computation of density maps



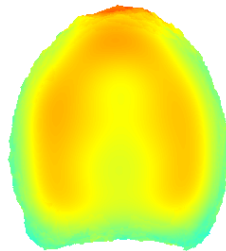
## Average densities



Mutant



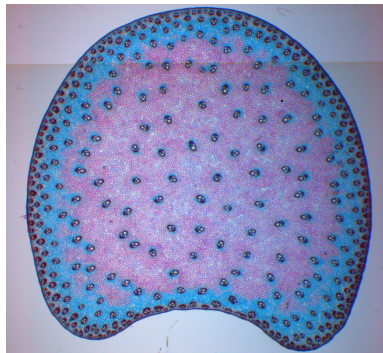
All



WildType

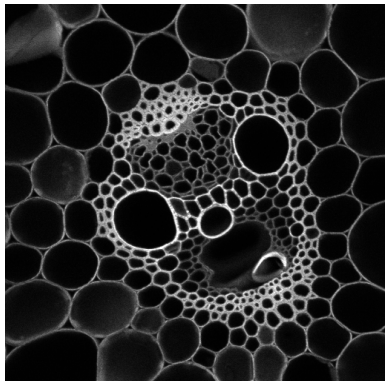
# Perspectives

- non-inhomogeneous estimation of K and PCF
- localisation of functions
- fusion with other acquisitions
- towards stem modelling...





Any questions ?



# Synopsis

