

# Integral Geometry Descriptors for Characterizing Emphysema and Lung Fibrosis in HRCT Images

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## Abstract

Integral geometry descriptors (**Minkowski functionals**) are used to characterize local textural properties of lung parenchyma from HRCT images. They describe the **morphology & topology** of 2D and 3D binary structures, and have been shown to be effective in describing properties of complex and disordered media.

We propose their use for detecting and grading emphysema and fibrosis in HRCT images. We present some illustrative results and make proposals for their use in a larger validation study.

## Minkowski Functionals: Definition

Defined on sets in 3D space. They are proportional to [4]:

- **Volume**  $V$
- **Surface Area**  $S$
- **Mean Breadth**  $B$ : a measure of average width
- **Euler-Poincaré Characteristic**  $\chi$ : Connectivity number = # connected components - # tunnels + # cavities

## Minkowski Functionals: Properties

**Fundamental role** over certain functions of **binary images**

- **All** Real-valued, additive, isometry invariant, continuous functions on a compact 3D binary image  $A$  are of form

$$\sum_{i=0}^3 \alpha_i W_i(A)$$

where the  $\alpha_i$  are **constants** and the  $W_i$  are the **Minkowski functionals**.

- Are themselves **additive**: for  $K_1, K_2$  compact parts of a 3D image

$$W_i(K_1 \cup K_2) = W_i(K_1) + W_i(K_2) - W_i(K_1 \cap K_2). \quad (1)$$

- Are themselves **isometry invariant**: do not change their value under rotation or translation.
- Can be extended to the **interior** of compact set  $K$  by

$$W_i(K^\circ) = (-1)^{3+i+\dim K} W_i(W_i) \quad (2)$$

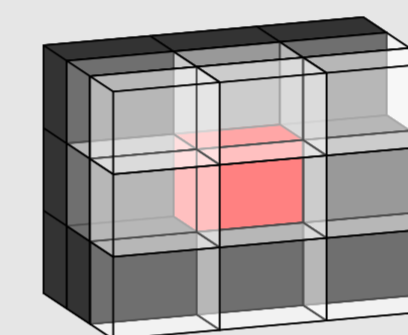
## Finding Functionals

Finding functionals reduces to **counting** cells, faces, edges and vertices of image seen as collection of cubic voxels.

- The Minkowski functionals for a cube, rectangle, line and vertex all **known analytically**.
- $\implies$  can use (1) and (2) repeatedly to find:

$$\begin{aligned} V &= n_3 & n_3: \# \text{ voxels} \\ S &= -6n_3 + 2n_2 & n_2: \# \text{ faces} \\ B &= 3n_3/2 - n_2 + n_1/2 & n_1: \# \text{ edges} \\ \chi &= -n_3 + n_2 - n_1 + n_0 & n_0: \# \text{ vertices} \end{aligned}$$

- To find  $n_i$  We use the **Algorithm of Equations** [1], where the faces, edges and vertices of the voxel (light red) counted assuming the 13 adjacent voxels (black) already counted.

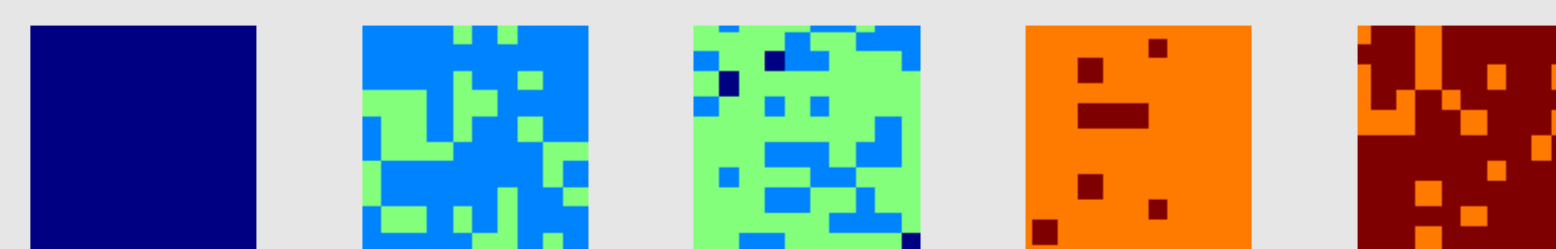


- To describe **heterogeneity** functionals are found on **windows** of fixed size over the 3D image

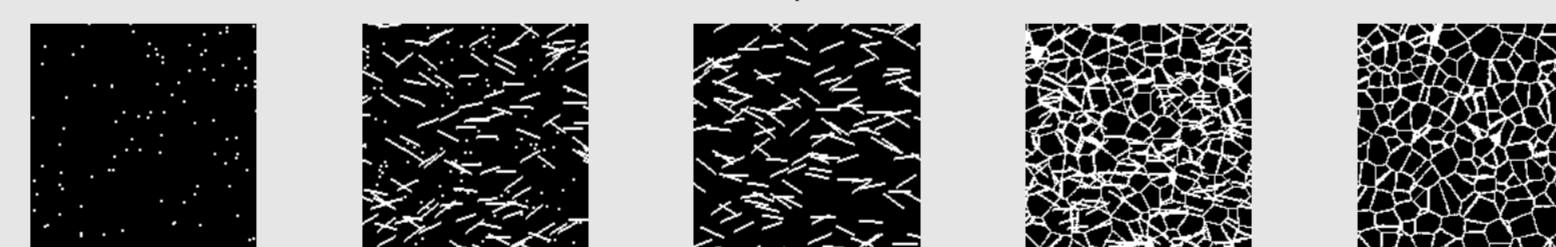
## Results: Synthetic Model

Models, left-to-right: healthy, fibrotic and honeycomb.

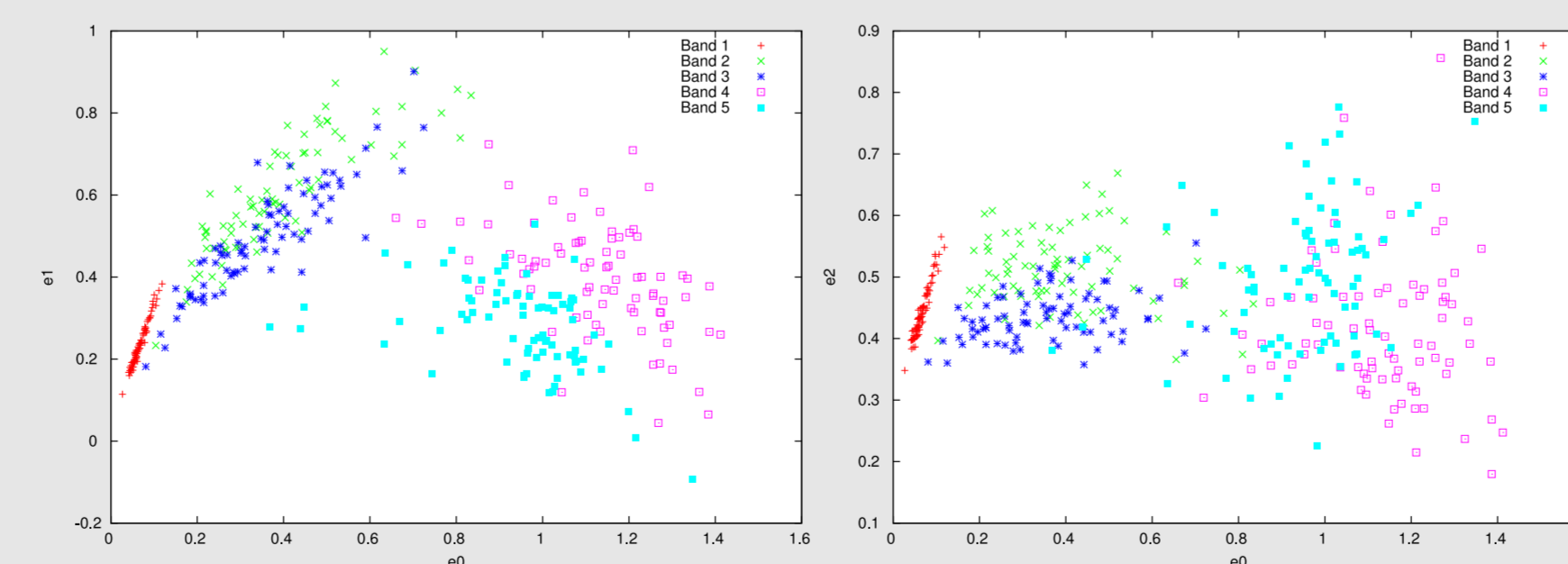
- Based on **Boolean model** and **Voronoi tessellation**. [4]



Supervised kNN classification of MFs

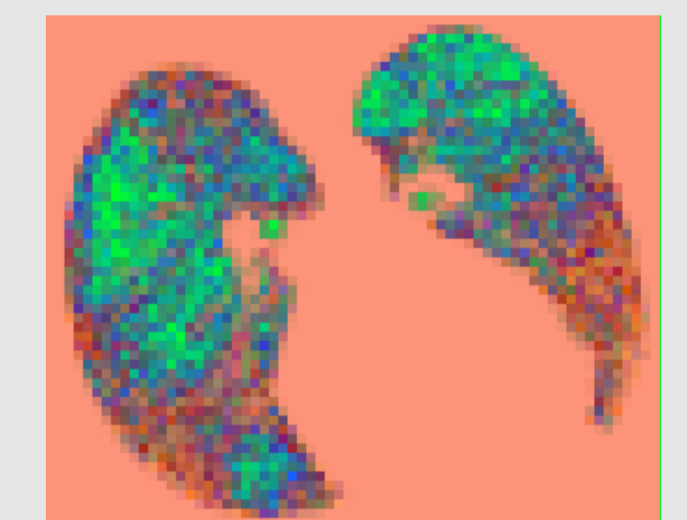


Projection of MFs onto first PCA modes

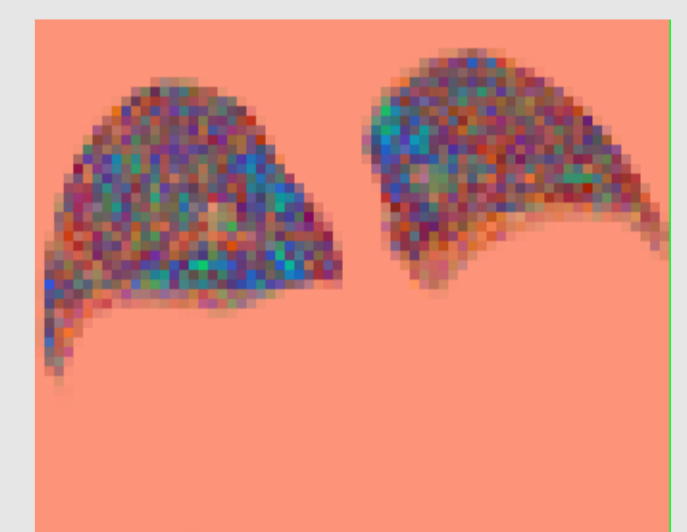
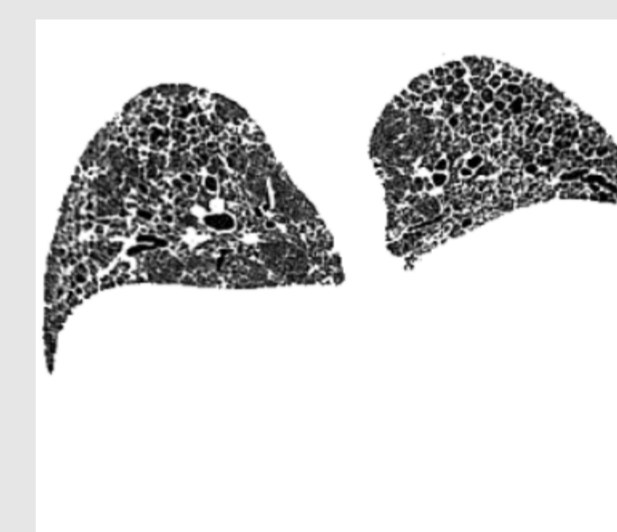


## Results: Lung Data

Functionals found on **thresholded in-vivo** lung HRCT scan.



Projection of 4 MFs onto 3 PCA principal modes



## Conclusion

Promising results: Minkowski functionals do appear to **separate tissue types**.

- Larger validation study required.
- More advanced probabilistic model development needed.
- Work concurrent to, but independent from, Boehm et al. [2, 3].

[1] I. Blasquez and J.-F. Poiradeau. Efficient processing of Minkowski functionals on a 3D binary image using binary decision diagrams. *Journal of MSCG*, 11(1), 2003.

[2] H. Boehm, C. Fink, U. Attenberger, C. Becker, J. Behr, and M. Reiser. Automated Classification of Normal and Pathologic Pulmonary Tissue by Topological Texture Features Extracted from Multi-detector CT in 3D. *European Radiology*, 18, 2008. DOI: 10.1007/s00330-008-1082-y.

[3] H. Boehm, C. Fink, C. Becker, and M. Reiser. Automated Characterization of Normal and Pathologic Lung Tissue by Topological Texture Analysis of Multi-Detector CT. In Giger and Karssemeijer, editors, *Medical Imaging 2007: Computer-Aided Diagnosis, Proceedings of SPIE Vol 6514*, page DOI: 10.1117/12.702697, 2007.

[4] D. Stoyan, W. Kendall, and J. Mecke. *Stochastic Geometry and its Application*. Probability and Statistics. John Wiley & Sons, New York, 1995.