

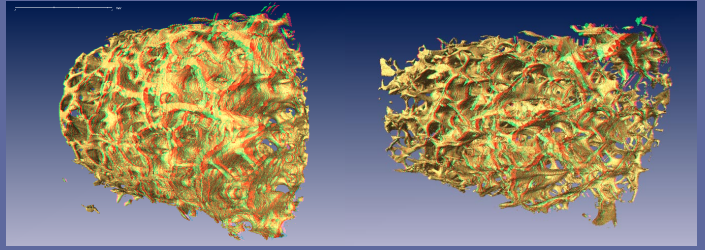
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For the assessment of bone stage (eg. regarding different osteoporotic stages), usually the bone mineral density (BMD) is measured. However, this measurement does not contain any information about the **structures** inside the bone. Recent work emphasized the importance of analyzing the structural changes of trabecular bone. Different approaches for the study of trabecular bone were successfully introduced

for **2D image analysis**, as measures of complexity based on symbolic dynamics. The new available 3D bone images (**μCT-data**) challenge the development of new 3D measures of complexity, which are able to assess structural changes in trabecular bone. We consider here new developments of **3D measures** that are based on lacunarity, Moran's index and geometrical properties.

Trabecular bone obtained from the human proximal tibia at different osteoporotic stages (stereoscopic images – red-cyan anaglyph glasses needed)



Trabecular bone with high bone volume (BV/TV=20%).

Osteoporotic trabecular bone with low bone volume (BV/TV=14%) and structural changes.

Lacunarity

Dougherty & Henebry (2001) suggested the lacunarity measure for the structural assessment of 2D bone images. This measure can be simply applied to 3D images and is defined as

$$\Lambda(r) = \frac{\mu_2}{\mu_1^2}$$

where

$$\mu_1 = \frac{1}{N} \sum s n(s, r),$$

$$\mu_2 = \frac{1}{N} \sum s^2 n(s, r),$$

are the first and second moments of the mass dis-

tributions $n(s, r)$ determined in equally spaced boxes of size r over the 3D image.

Using the lacunarity and the complementary lacunarity (ie. the lacunarity computed from the complementary objects, in our case marrow), we define the **normalized lacunarity** by

$$\Lambda^*(r) = 2 - \left(\frac{1}{\Lambda(r)} + \frac{1}{\Lambda(r)} \right),$$

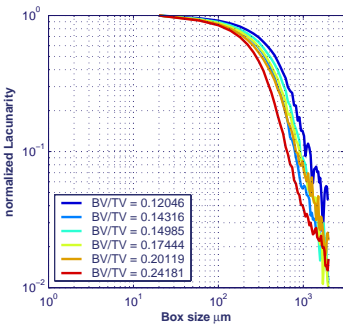
ensuring measures between zero and one (from less lacunarity to high lacunarity, or from high **translational invariance** to less translational invariance).

Moran's Index

The Moran's index I was introduced for measuring the two-dimensional **spatial autocorrelation** of a population in an eco-system, but was successfully applied to 2D image analysis (Chen et al., 2003). We extend this common measure to 3D as

$$I = \frac{N \sum_{j=1}^{d_1 \times d_2 \times d_3} \sum_{i=1}^{d_1 \times d_2 \times d_3} \delta_{ij} (x_i - \bar{x})(x_j - \bar{x})}{S_0 \sum_{i=1}^{d_1 \times d_2 \times d_3} (x_i - \bar{x})^2},$$

where d_i is the geometric size of the analyzed object, N is the total number of voxels and S_0 is the number of contiguous pairs. This measure ranges between -1 and $+1$ (from high autocorrelation to high anti-autocorrelation).



Shape Index

Here we introduce a new index, which measures the surface of the trabecular bone within small cubic boxes and normalizes this value by the minimal surface possible for this bone volume

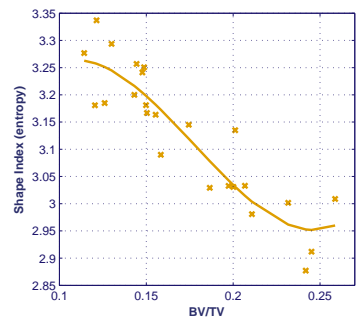
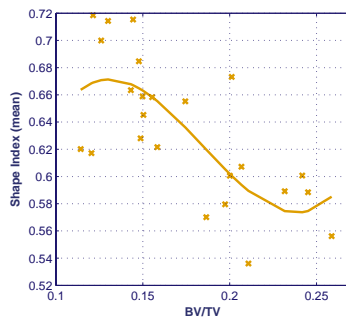
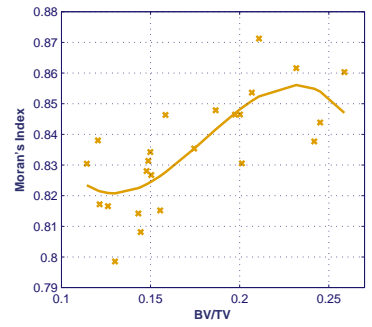
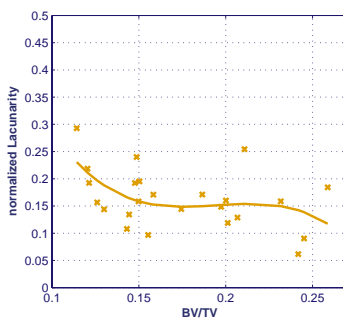
$$\Sigma = \frac{S}{\sqrt[3]{36\pi V^2}}$$

where S is bone surface and V is bone volume. The mean value and the entropy of this measure represent the shape of the bone structures – values of Σ smaller than one reveal **concave structures** (the smaller the value the higher the amount of concave structures).

Preliminary Results

The lacunarity shows only a small dependence on different osteoporotic stages (corresponds with a decrease of BV/TV), revealing small changes in the **translational invariance** during bone loss. However, this measure plotted as a function of the length scale provides some interesting features, which will be further investigated.

The Moran's index reveals an increase of autocorrelation for decreasing bone. This is a hint for a



loss of **plate-like structures** in the trabecular bone. The shape index is the most promising candidate for a future diagnostic measure. Its mean as well as its entropy reveal a significant dependence on different osteoporotic stages. Its increase during bone loss points to the decrease of **concave trabecular structures**. However, this measure is not yet finalized and needs further refinement.

References

- CHEN, T.-J., Chuang, K.-S., Wu, J., Chen, S. C., Hwang, I.-M., Jan, M.-L., A novel image quality index using Moran I statistics. Journal of Digital Imaging 16 (2), 2003b, 210-215.
- DOUGHERTY, G., Henebry, G. M., Fractal signature and lacunarity in the measurement of the texture of trabecular bone in clinical CT images. Medical Engineering & Physics 23 (6), 2001, 369-380.