High-Resolution CT Images Yield Accurate Microstructural Information if Processed by 3D Extensions of Standard Histomorphometric Analysis of Fuzzy Segmentation Approaches

Introduction

Monitoring of osteoporosis therapy based solely on bone densitometry is insufficient to assess anti-fracture efficacy. Microstructure of trabecular bone represents The *fuzzy distance transformation* (FDT) assigns to every potential bone voxel an additional aspect of bone quality that affects bone strength indepent of BMD. (membership value > 0) the shortest weighted distance to the mark background Bone biopsies, high-resolution MRI, or dedicated (pQCT) imaging systems for (membership value = 0) (cf. [SW04]). The skeletonization of the bone phase measurement in peripheral regions of the skeleton such as forearm or tibia provide based on the *fuzzy distance transformation* permits the direct measurements of an insight into the microstructure and show trabecular distances varying between trabecular thickness Tb.Th^F and separation Tb.Sp^F comparable to the directly 500–2000 μ m. As can be expected because of the different loading conditions, distance measured variables Tb.Th^{*} and Tb.Sp^{*} proposed in [LR99]). structural measures from biopsies and peripheral sites show limited correlations Measurements: 16 vertebral biopsies of 8 mm diameter and 9 mm height with the clinically important fracture sites proximal femur and vertebrae.

(Set 1) were measured by HRCT (Siemens Somatom 16, 120 kV, 360 mAs, pixel In vivo assessment of trabecular bone microstructure is bounded by image qualsize $156 \times 156 \ \mu m^2$, slice thickness 400 μm) inside a CIRS abdomen phantom ity and radiation exposure. We investigate whether microstructural information with tissue equivalent lumbar section to emulate in vivo conditions. Additionally, can be accurately extracted from high-resolution CT (HRCT) images of human using the same HRCT protocol, 15 whole vertebrae embedded in PMMA (Set 2) vertebrae. were measured inside the phantom surrounded by an additional attenuator ring to simulate obese patients (see Fig. 2).

Methods

The microstructural variables *BV/TV* (bone volume / total volume), for Set 2. *Tb.Th* (trabecular thickness), and *Tb.Sp* (trabecular separation) can be defined by 3-D adaptation of 2-D stereological methods used in histomorphometry. A. LAIB All image processing was performed using the software StructuralInsight and P. RÜEGSEGGER introduced comparable measures $Tb.Th^*$ and $Tb.Sp^*$ which V1.48 and its FDT Add-on developed in-house. For the biopsies of Set 1, volassess metric distances in 3D space directly. When moving from μ CT measureume of interest was determined by applying a cylindrical mask containing the biopsy completely. μ CT data was accepted as calibrated to [mg HA/cm³] acments with cubic voxels of 28 μ m sidelength to HRCT measurements with cubic cording to machine output, HRCT data was calibrated with respect to a reference voxels with sidelength 165 μ m these distance based measures showed higher correconstruction of the scan containing the calibration phantom (cf. Fig. 2 (left)). relations than the stereologically motivated measures (cf. [LR99, Table 3]).

The bottom and middle plots of Fig. 1 show what happens to the histograms For the vertebrae of Set 2, the complete trabecular bone volume was segmented excluding hyperdense degenerative calcifications and the thin cortical rim of the of vertebra images when moving from μ CT to HRCT measurements: Due to partial volume effects and noise the bone peak melts into the mark peak and the vertebral body. The masking was based on polygons manually defined by the bone/mark binarization becomes an issue. user in multiple, nonadjecent slices). The reference measurements were adjusted to [mg HA/cm³] by the XCT calibration procedure, HRCT data with reference to Fuzzy segmentation approaches may overcome these limitations. the calibration phantom.

A sigmoidal *membership function* maps the voxel's gray value onto the [0; 1] interval (cf. top plot of Fig. 1). The assigned value represents the probability of the voxel to be bone. The concept of *fuzzy distance* allows probability weighted



Figure 1: Histograms of three vertebra images from Set 1, namely of the vertebrae with maximal, minimal, and medial BV/TV. The discrimination bone versus mark becomes unclear when moving from μ CT images (bottom) to HRCT images (middle). The membership function (top) assigns a probability value from [0, 1]to each voxel according to its BMD value.

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> measurement of distances: A 2 mm long line of voxels with a membership value 1 leads to a fuzzy distance of 2 mm. If the same line consists of voxels with a membership value 0.3, this yields a fuzzy distance of $0.3 \cdot 2 \text{ mm} = 0.6 \text{ mm}$.

Reference measurements on micro-CT systems were obtained on a Scanco μ CT40 (voxel size $24^3 \,\mu m^3$) for Set 1 and a Scanco Xtreme CT (XCT) (voxel size $82^3 \,\mu m^3$)

Results

Fig. 3 displays a detail of an unfiltered sagital cut through a vertebra of Set 2, the same detail after a sampling to HRCT resolution $156 \times 156 \times 400 \mu m^3(b)$, and the FDT of the sampled image (c).



Figure 2: Left: PMMA embedded vertebra in CIRS model 235 abdominal phantom (brown) with the attenuator ring to simulate obese patients. Five rods of reference material embedded in the CT calibration phantom (white) permit the conversion of the image's grayvalues to BMD in [mg HA/cm³]. Right: HRCT reconstruction. The trabecular bone was segmented based on manually defined polygons (red) excluding cortical rim.









2200 2400 Tb.Sp^F determined by FDT applied to HRCT scan [µm] Tb.Sp^F determined by FDT applied to HRCT scan [um]

Figure 4: Tb.Sp^{*} versus Tb.Sp^F correlations for PMMA embedded vertebrae of Set 2. Left: The reference (mean \pm SD = 1069 \pm 19%) can be predicted by $\text{Tb.Sp}^* = 1.096 \cdot \text{Tb.Sp}^F - 20 \,\mu\text{m}$ with a root mean square error (RMSE) of 40 μm (3.7% of the mean of response), $R^2 = 0.96$, and $p < 10^{-9}$ for the original images. For the lower resolution images the prediction follows Tb.Sp^{*} = $0.732 \cdot Tb.Sp^F - 96 \,\mu m$ with RMSE = 26 μ m (2.4%), R² = 0.98, and p < 10⁻¹². Middle: Using HRCT images scanned without the CIRS abdominal phantom (see Fig. 2) yields the displayed results. Right: Results for the scans taken *with* the abdominal phantom.

Validation: The FDT based analogon $\text{Tb.Sp}^{F'}$ of Tb.Sp^* was calculated for the 15 vertebra images of Set 2 scanned by XCT. Additionally, Tb.Sp^{F'} was calculated for 15 images yielded by sampling the XCT im-HRCT resolution 156×156 ages to $\times 400 \mu m^3$. The results for both resolutions are plotted in Fig. 4 (left). Using best line regression, the reference values Tb.Sp* can be predicted as given in the figure's caption. For the original images, the deviation $Tb.Sp^*$ - $Tb.Sp^F$ can be explained by the different determination of the volume of interest: XCT uses semi-automatic masking, Structural Insight demands manual masking by polygons (see above).

Application to HRCT images: The middle and right plot of Fig. 4 show higly significant regression results for Tb.Sp¹ from HRCT images taken without and with the body phantom, respectively. Table 1 lists the linear regression results for the variables BV/TV, Tb.Th*, and Tb.Sp* versus the respective stereologic variables (cf. $[GTN^+07]$) and those using the FDT. Comparison of the results for both sets show lower correlations for Set 1, but identical results for the more meaningful RMSE.

Ref. results		BV/TV		Tb.Th*		Tb.Sp*	
mean \pm SD (%)		$0.08\pm 0.02\;(26\%)$		$122\mu\mathrm{m}\pm21\mu\mathrm{m}~(17\%)$		944 μ m \pm 133 μ m (14%)	
		RMSE in %	\mathbf{R}^2	RMSE in %	\mathbf{R}^2	RMSE in %	\mathbf{R}^2
Set 1	Stereol.	19	0.49 **	16	0.19 0	12	0.25 *
	Fuzzy	eq. to s	tereol.	12	0.56 ***	10	0.51 **
Ref. results		BV/TV		Tb.Th*		Tb.Sp*	
mean \pm SD (%)		$0.19\pm 0.06~(32\%)$		324 μ m \pm 59 μ m (18%)		1069 μ m \pm 205 μ m (19%)	
		RMSE in %	\mathbf{R}^2	RMSE in %	\mathbf{R}^2	RMSE in %	\mathbf{R}^2
Set 2	Stereol.	20	0.67 ***	17	0.19 0	11	0.72 ***
	Fuzzy	eq. to stereol.		13	0.52 **	10	0.76 ***
Levels of significance: $\circ: p < 0.1, *: p < 0.05, **: p < 10^{-2}, ***: p < 10^{-3}$							

Table 1: Linear regression results for variables BV/TV, Tb.Th^{*}, and Tb.Sp^{*}.

Conclusions

Stereological and fuzzy methods, both estimate Tb.Sp^{*} with RMS-errors substantially smaller than the sample SD. The fuzzy approach yields better estimates for Tb.Th^{*}. This demonstrates that microstructural information can be extracted from the HRCT images under in vivo conditions with acceptable residual accuracy errors. Experiments with different membership functions give evidence that Tb.Th^{*} estimation can be improved in future. Measurements with and without the abdominal phantom suggest that the slope of regression lines depend on image noise.

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