



## Variability of trabecular microstructure is age-, gender-, race- and anatomic site-dependent and affects stiffness and stress distribution properties of human vertebral cancellous bone<sup>☆</sup>

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### ABSTRACT

Cancellous bone microstructure is an important determinant of the mechanical integrity of vertebrae. The numerous microstructural parameters that have been studied extensively are generally represented as a single value obtained as an average over a sample. The range of the intra-sample variability of cancellous microstructure and its effect on the mechanical properties of bone are less well-understood. The objectives of this study were to investigate the extent to which human cancellous bone microstructure within a vertebra i) is related to bone modulus and stress distribution properties and ii) changes along with age, gender and locations thoracic 12 (T12) vs lumbar 1 (L1).

Vertebrae were collected from 15 male ( $66 \pm 15$  years) and 25 female ( $54 \pm 16$  years) cadavers. Three dimensional finite element models were constructed using microcomputed tomography images of cylindrical specimens. Linear finite element models were used to estimate apparent modulus and stress in the cylinders during uniaxial compression. The intra-specimen mean, standard deviation (SD) and coefficient of variation (CV) of microstructural variables were calculated.

Mixed model statistical analysis of the results demonstrated that increases in the intra-specimen variability of the microstructure contribute to increases in the variability of trabecular stresses and decreases in bone stiffness. These effects were independent from the contribution from intra-specimen average of the microstructure. Further, the effects of microstructural variability on bone stiffness and stress variability were not accounted for by connectivity and anisotropy. Microstructural variability properties (SD, CV) generally increased with age, were greater in females than in males and in T12 than in L1. Significant interactions were found between age, gender, vertebra and race. These interactions suggest that microstructural variability properties varied with age differently between genders, races and vertebral levels.

The current results collectively demonstrate that microstructural variability has a significant effect on mechanical properties and tissue stress of human vertebral cancellous bone. Considering microstructural variability could improve the understanding of bone fragility and improve assessment of vertebral fracture risk.

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### Introduction

Cancellous bone microstructure is considered important in determining bone strength and fracture risk. The numerous microstructural parameters that have been studied extensively over the years are generally represented as a single value obtained as an average over a sample. However, the variation of the microstructure within the bone and its potential role on bone mechanical properties received less attention.

Engineering theories predict that the intra-sample variability of microstructure should have an effect on the mechanical properties of a cellular material like cancellous bone [2,23,45,50]. Several previous studies did consider the intra-sample variability of cancellous microstructure and its effect on bone stiffness. However, each had features which limited their contributions to understanding. Some of

these studies were limited to theoretical analyses using generic or limited 2D bone geometries for mechanical analysis [46,55]. Some considered anatomic sites that are far apart from each other or from the sites of clinical interest [1,6]. In the latter case, small samples were obtained from whole bones, and the properties were assumed to be homogeneous within each bone sample. Studies that considered the intra-sample variability of cancellous microstructure in vertebral bone at a finer scale than the whole bone were generally of pilot nature [20,27,30,61] and used very few samples. Thus the association of intra-sample variability of microstructure with donor age, gender, anatomic site and bone mechanical properties in vertebral bone remains largely unknown.

Trabecular stress distribution parameters (trabecular shear stress per apparent uniaxial stress and coefficient of variation of trabecular shear stress) as estimated from large scale finite element (FE) analyses have been associated with age [59], bone strength [14] and with the amount of in vivo microdamage [56] in human vertebral cancellous bone. Similarly, measures of microstructural variability have been associated with structural mechanical properties of whole vertebral bodies [29,47,60]. Clinical data also indicate that measures of microstructural variability are associated with fracture risk in spine [31], hip [15] and the wrist [34] whether measured at, or remote from, the site of interest. The variability of stresses would be expected to be associated with variability of the microstructure for bone loaded predominantly in uniaxial compression. The relationship between stress distributions and the average properties of cancellous microstructure has been examined for vertebral bone [59] but not extended to the distribution properties of the microstructure.

The objectives of this study were to investigate the extent to which the spatial variation of human cancellous bone microstructure within a vertebra i) is related to bone modulus and stress distribution properties and ii) changes along with age, gender and locations thoracic 12 (T12) vs lumbar 1 (L1).

## Methods

The specimens and the  $\mu$ CT images were the same as in a previous study [59]. Briefly, cylindrical ( $\varnothing 8 \times 10$  mm) cancellous bone specimens from the anterior region of 40 pairs of fresh frozen T12 and L1 vertebrae were utilized. The specimens were from 14 black female (Age:  $56 \pm 18$  years), 7 black male (Age:  $70 \pm 16$  years), 11 white female (Age:  $50 \pm 14$  years) and 8 white male cadavers (Age:  $63 \pm 15$  years). The age difference between groups was not significant ( $p > 0.07$ ; ANOVA).

Details of specimen preparation,  $\mu$ CT scanning, reconstruction, linear FE models and calculation of apparent modulus ( $E_{FEM}$ ) and stress distribution properties were previously reported [59]. Two main trabecular stress distribution parameters, namely, coefficient of variation of trabecular von Mises stress distributions (VMCV) and average trabecular shear stress per apparent uniaxial stress ( $VMExp/\sigma_{app}$ ) were considered. The apparent modulus and stress distribution parameters used in the current study were the same as those in our previous study. Degree of anisotropy (DA) and connectivity density ( $-\#Euler/Vol$ ) were also calculated in previous work [59].

Trabecular microstructural parameters (BV/TV, Tb.Th, Tb.N and Tb.Sp) were calculated for each slice of the micro-CT image ( $\sim 200$  slices/specimen perpendicular to the supero-inferior direction; each 50  $\mu$ m thick) using 2D stereologic methods [17]. The intra-specimen mean (Av), standard deviation (SD) and coefficient of variation (CV) of each microstructural variable were calculated for each specimen. Multiple regression was used to assess the relationships between mechanical ( $E_{FEM}$ , VMCV and  $VMExp/\sigma_{app}$ ) and microstructure parameters. Specifically, multiple regression models containing both the average and standard deviation of a microstructural parameter were used to examine the effect of the SD of a parameter in the presence of its mean. Nonnormality in parameters and nonlinearity in relationships between some of the parameters were expected based on previous

work [58,59], therefore, multiple regressions were re-performed on Box-Cox-transformed variables [5]. The transformation was of the form  $X^{(\lambda)} = (x^\lambda - 1)/\lambda\gamma^{\lambda-1}$  ( $\lambda \neq 0$ ) or  $X^{(\lambda)} = \gamma \ln(x)$  ( $\lambda = 0$ ), where  $\gamma$  is the geometric mean of the untransformed variable  $x$ . An optimal value of the transform parameter ( $\lambda$ ) was determined for each variable so as to minimize sum of square of errors around the mean. All transformations are such that the transformed parameter increases with increasing untransformed parameter.

Stepwise regression models with DA,  $-\#Euler/Vol$ , BV/TV, Av, BV/TV, SD, Tb.N, Av, Tb.N, SD as predictors were considered to examine whether an SD parameter can contribute further to the prediction of a mechanical parameter in the presence of a set of conventional average properties. In these models, BV/TV, Av was introduced first and forced to remain in the model. The inclusion of Tb.N, Av in the predictor set caused substantial multicollinearity as indicated by a variance inflation factor (VIF) of 27.7 and 40.0 for the untransformed and transformed set of predictors, respectively. Subsequently, we removed Tb.N, Av from the predictor set which resulted in a maximum VIF of 2.25 and 2.82 for untransformed and transformed set of predictors, respectively.

Mixed model procedures were used to examine the effect of vertebra type, gender and age on the microstructure distribution properties. Because we had a mixed group of black and white donors, race was also included in the models (as identified in the medical record). Analysis started with examination of interactions between effects. The analysis proceeded in a backward stepwise fashion where nonsignificant terms were removed starting with higher order interactions followed by lower order interactions and main effects. When a significant interaction was present, the sample was separated according to the interacting terms and the sub-groups were analyzed separately. Final models were constructed by removing the nonsignificant effects and interactions from the initial model.

Statistical analysis was performed using JMP (Version 7.0.2, SAS Institute Inc., Cary, NC). Statistical significance was set as  $p < 0.05$ .  $p$ -values corresponding to an  $\alpha$  of 0.05 were indicated for multiple tests, using the D/AP procedure and taking into account the correlations between parameters [42].

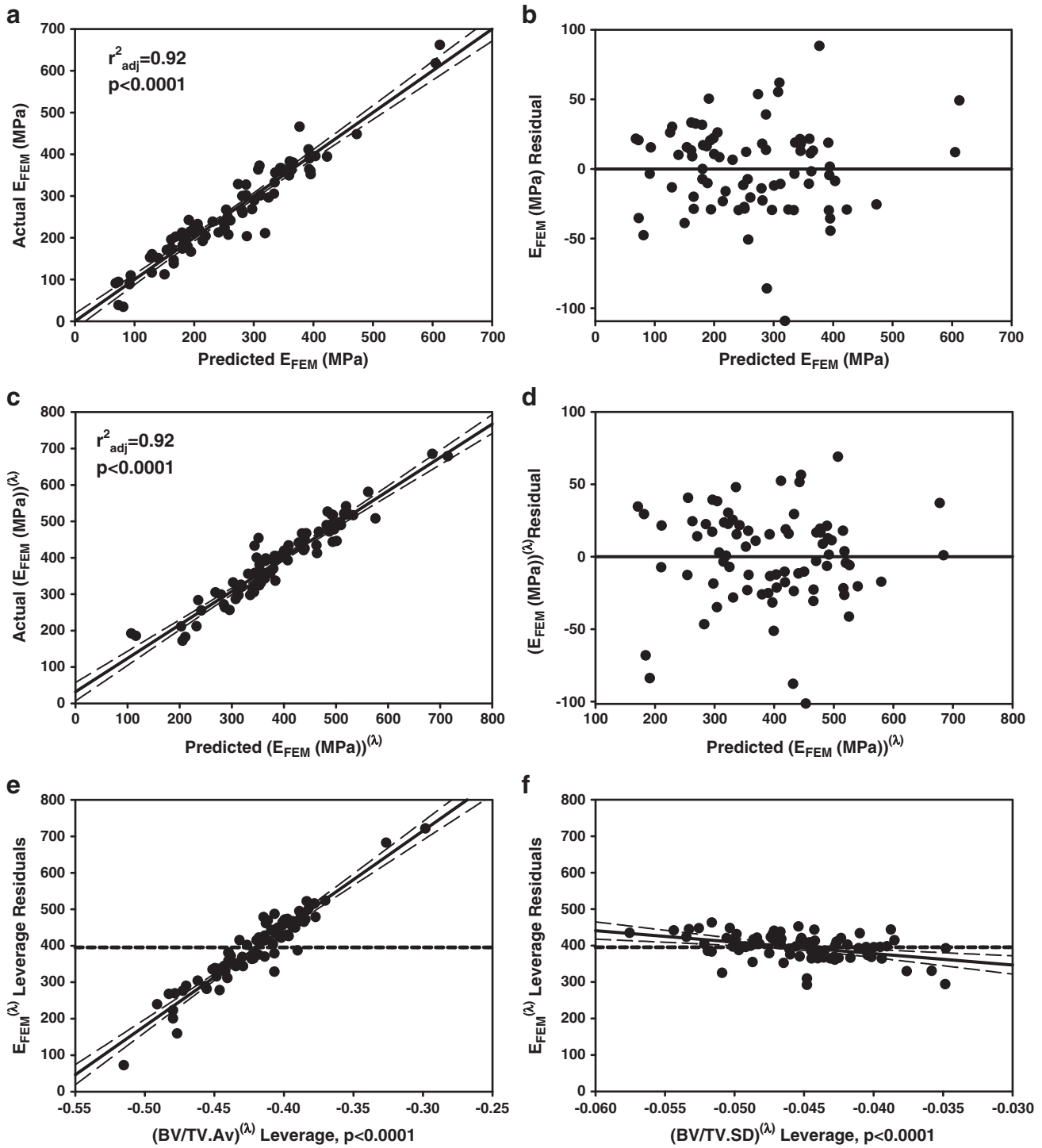
## Results

Transformation of the outcome variables was necessary and substantially improved the model fit in some instances (Figs. 1 and 2). The optimum  $\lambda$  was 0.6,  $-2$ ,  $-0.4$ ,  $0.4$ ,  $-0.2$ ,  $-1$ ,  $-0.2$ ,  $1.2$ ,  $0$ ,  $-0.6$ ,  $-0.6$ ,  $-0.4$  and  $0.4$  for  $E_{FEM}$ , VMCV,  $VMExp/\sigma_{app}$ , BV/TV, Av, BV/TV, SD, Tb.Th, Av, Tb.Th, SD, Tb.N, Av, Tb.N, SD, Tb.Sp, Av, Tb.Sp, SD, DA and  $-\#Euler/Vol$ , respectively. All transformed parameters were normally distributed ( $p > 0.19$  to  $p > 0.98$ ; Shapiro–Wilk  $W$  test) except for Tb.Sp, SD ( $p = 0.0427$ ), which was substantially nonnormal prior to the transformation ( $p < 0.0001$ ).

In multiple regression models that included both the average and standard deviation of microstructural parameters,  $E_{FEM}$  increased with increasing BV/TV, Av, Tb.Th, Av and Tb.N, Av, and decreased with increasing Tb.Sp, Av (Table 1; Fig. 1). Conversely, both VMCV and  $VMExp/\sigma_{app}$  decreased with increasing BV/TV, Av, Tb.Th, Av and Tb.N, Av, and increased with increasing Tb.Sp, Av ( $p < 0.0001$  for all) (Table 1; Fig. 2).

$E_{FEM}$  decreased with increasing BV/TV, SD and Tb.Th, SD independent of the effect of their mean values (Table 1; Fig. 1). Conversely, both VMCV and  $VMExp/\sigma_{app}$  increased with increasing BV/TV, SD and Tb.Th, SD independent of the effect of their mean values ( $p < 0.01$  for all) (Table 1; Fig. 2). Additionally, VMCV increased with increasing Tb.N, SD and Tb.Th, SD independent of the effect of their mean values ( $p < 0.02$ ).

Stepwise regression models selected at least one standard deviation parameter as a significant predictor in addition to the



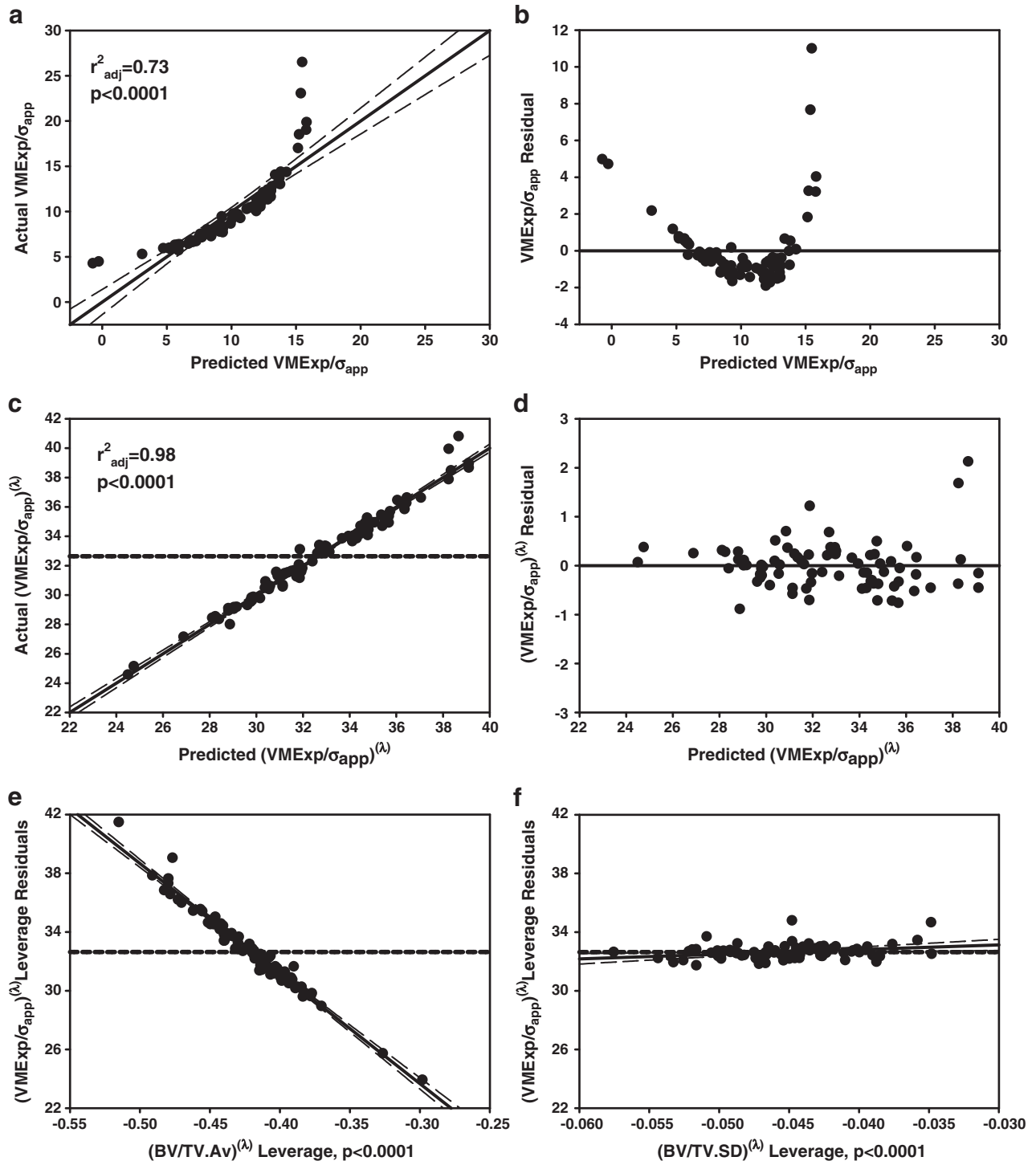
**Fig. 1.** a)  $E_{FEM}$  calculated from finite element models vs  $E_{FEM}$  predicted by the multiple regression model including BV/TV.AV and BV/TV.SD using nontransformed variables. b) The residuals for the model with nontransformed variables. c) As in 1a except using transformed variables. d) The residuals for the model with transformed variables. e) Leverage plot for BV/TV.AV and f) Leverage plot for BV/TV.SD. Solid, medium dashed and small dashed lines show linear fits, 95% confidence intervals and mean of the actual  $E_{FEM}$ , respectively. (95% confidence curve crossing the mean response line indicates a significant leverage for the effect.) The model with transformed variables and that with nontransformed variables were qualitatively similar.

mean of that parameter for  $E_{FEM}$  and VMCV but not for  $VMExp/\sigma_{app}$  (Tables 2a and 2b).

Average BV/TV and Tb.N decreased while Tb.Sp.AV increased with age ( $p < 0.0001$  for all) with no other significant effect in the model. Significant interaction of age and gender was found for Tb.Th.AV ( $p < 0.009$ ). Further analysis after separating the data between males and females indicated that Tb.Th.AV was smaller in T12 than in L1 ( $p < 0.03$ ) and decreased with age ( $p < 0.002$ ) in females (Table 3, Fig. 3).

Microstructural variability properties (SD, CV) generally increased with age, were greater in females than in males and in T12 than in L1 (Tables 3 and 4). A number of significant interactions found between age, gender, vertebra and race suggesting that microstructural variability properties varied with age differently between genders, races and vertebral levels.

Absolute variability of microstructural properties (SD) generally increased with age, was greater in females than in males and in T12



**Fig. 2.** The plots of a)  $VMExp/\sigma_{app}$  calculated from finite element models vs  $VMExp/\sigma_{app}$  predicted by the multiple regression model including  $BV/TV.Av$  and  $BV/TV.SD$  and b) the residuals indicated that the linear model fit was not appropriate. The transformation of variables resulted in an improved fit as indicated by the plots of c) calculated  $(VMExp/\sigma_{app})^{(\lambda)}$  vs predicted  $(VMExp/\sigma_{app})^{(\lambda)}$  and d) the residuals from the model with transformed variables. e) Leverage plot for  $BV/TV.Av^{(\lambda)}$  and f) leverage plot for  $BV/TV.SD^{(\lambda)}$  in the transformed model. The model with transformed variables, unlike that with nontransformed variables, indicates a significant, albeit small, effect of  $BV/TV.SD$  on  $VMExp/\sigma_{app}$ .

than in L1:  $BV/TV.SD$  ( $p < 0.009$ ) and  $Tb.Th.SD$  ( $p < 0.01$ ) were greater in females than in males with no other significant effect in the models. A significant main effect of vertebral level was found ( $p < 0.02$ ) for the  $Tb.N.SD$  model indicating greater  $Tb.N.SD$  in T12 than in L1. A four-way interaction was noted for  $Tb.N.SD$  ( $p < 0.05$ ) warranting separate analysis of subgroups (Table 3).  $Tb.N.SD$  decreased with age in the T12 vertebrae of white females and black males ( $p < 0.03$ ) while it increased with age in L1 vertebrae of black females ( $p < 0.05$ ).  $Tb.Sp.$

$SD$  was greater in T12 than in L1 ( $p < 0.04$ ) and increased with age ( $p < 0.0003$ ) (Table 3).

Relative variability of microstructural properties ( $CV$ ) generally increased with age, was greater in females than in males and in T12 than in L1, similar to  $SD$  results:  $BV/TV.CV$  was greater in females than in males ( $p < 0.04$ ) and increased with age ( $p < 0.004$ ) (Table 3). A significant three-way interaction was noted between age, gender and race ( $p < 0.02$ ). Further analysis of separated groups revealed that the

**Table 1**  
Multiple regression models examining the effect of the mean and variability of each microstructural parameter on  $E_{FEM}$ , VMCV and  $VMExp/\sigma_{app}$ . The estimate for each term in the model is given with the associated p-value in parenthesis.

Response	Term	BV/TV <sup>(λ)</sup>	Tb.Th (mm) <sup>(λ)</sup>	Tb.N (mm <sup>-1</sup> ) <sup>(λ)</sup>	Tb.Sp (mm) <sup>(λ)</sup>
$(E_{FEM} \text{ (MPa)})^{(λ)}$	Av	2675 (<.0001)	8606 (<.0001)	326.9 (<.0001)	-474.0 (<.0001)
	SD	-3148 (<.0001)	-15983 (<.0001)	<i>NS</i> ( $p>0.23$ )	<i>NS</i> ( $p>0.39$ )
	Int	1374 (<.0001)	901.9 (<.0001)	206.0 (<.006)	242.5 (<.0001)
Model	$r_{adj}^2$	0.92	0.51	0.78	0.82
	p<	0.0001	0.0001	0.0001	0.0001
$(VMCV \text{ (%)})^{(λ)}$	Av	-1.969 (<.0001)	-5.883 (.0001)	-0.2142 (<.0001)	0.1526 (<.04)
	SD	7.124 (<.0001)	20.17 (<.0001)	0.7951 (=0.0192)	1.222 (=0.0106)
	Int	-0.6918 (<.0001)	-0.3309 (<.0001)	<i>NS</i> ( $p>0.39$ )	<i>NS</i> ( $p>0.22$ )
Model	$r_{adj}^2$	0.64	0.42	0.50	0.53
	p<	0.0001	0.0001	0.0001	0.0001
$(VMExp/\sigma_{app})^{(λ)}$	Av	-74.95 (<.0001)	-229.8 (<.0001)	-9.672 (<.0001)	15.79 (<.0001)
	SD	31.64 (<.01)	343.2 (<.006)	<i>NS</i> ( $p>0.72$ )	<i>NS</i> ( $p>0.79$ )
	Int	2.634 (<.0001)	17.26 (<.0001)	36.39 (<.0001)	36.54 (<.0001)
Model	$r_{adj}^2$	0.98	0.46	0.86	0.90
	p<	0.0001	0.0001	0.0001	0.0001

Int: intercept.

An adjustment for multiple tests, taking into account the correlations between all parameters, suggested that a p-value of 0.0170 be considered as significant for an  $\alpha$  of 0.05. The italic entries are statistically nonsignificant (NS).

gender effect was significant within the black race ( $p<0.04$ ) and the increase with age was significant within black females ( $p<0.003$ ) and pooled black males and females ( $p<0.003$ ). As in the case of SD, Tb.Th. CV was greater in females than in males with no other significant effect in the model ( $p<0.02$ ). Significant main effects of age ( $p<0.008$ ) and vertebral level ( $p<0.02$ ) were found for the Tb.N.CV model indicating an increase in Tb.N.CV with age and a greater Tb.N.CV in T12 than in L1. As in the case of SD, a four-way interaction was noted for Tb.N.CV ( $p<0.04$ ). Further analysis in separate subgroups revealed that Tb.N.CV increased with age in the T12 and L1 vertebrae of black females ( $p<0.04$  and  $p<0.008$ , respectively). Tb.Sp.CV was greater in T12 than in L1 ( $p<0.007$ ) and increased with age ( $p<0.03$ ). Significant interaction of age, gender and race was found for Tb.Sp.CV ( $p<0.007$ ). Further analysis of separate subgroups revealed that Tb.Sp.CV increased with age in black females ( $p<0.002$ ).

## Discussion

We demonstrated, using 3D specimen-specific geometry and a large sample, that the variability of microstructural properties within a bone is different between female and male vertebral cancellous bone, between white and black races and between T12 and L1 vertebrae in the same individual. We also found that the variability of microstructural properties within a bone changes differently with age between genders, races and vertebrae. Consistent with previous predictions [55], we demonstrate that increases in microstructural variability contribute

**Table 2a**

Multiple regression models for  $E_{FEM}$ , VMCV and  $VMExp/\sigma_{app}$ . For comparison with previous work [59], models were constructed using a stepwise regression that included BV/TV, Av, BV/TV, SD, Tb.N, Av, Tb.N, SD, -#Euler/Vol and DA as explanatory variables. BV/TV, Av was forced to stay in the model in order to determine contributions from other variables that are independent of BV/TV.

Response	Term	Estimate	t ratio	p<
$E_{FEM}$ ( $r_{adj}^2=0.93$ ; $p<0.0001$ )	BV/TV, Av	2650.5	28.07	0.0001
	BV/TV, SD	-1962.5	-2.79	0.007
	DA	52.73	2.47	0.02
	Intercept	-190.3	-4.71	0.0001
VMCV ( $r_{adj}^2=0.68$ ; $p<0.0001$ )	BV/TV, Av	-1.865	-10.95	0.0001
	BV/TV, SD	3.611	2.84	0.006
	DA	-0.2347	-6.10	0.0001
	Intercept	1.312	18.01	0.0001
$VMExp/\sigma_{app}$ ( $r_{adj}^2=0.78$ ; $p<0.0001$ )	BV/TV, Av	-40.99	-2.94	0.005
	Tb.N, Av	-5.764	-2.89	0.005
	DA	-2.992	-2.38	0.02
	Intercept	28.63	12.75	0.0001

to increases in stress variability and decreases in bone stiffness independent from the contribution from intra-specimen average of the same microstructural parameter. Further, microstructural variability had a significant effect on bone stiffness and stress variability which was not accounted for by average microstructural measures including bone quantity, connectivity and anisotropy.

There are large differences in vertebral fracture risk between men and women. However, the exact sources of this difference are unclear. Very few studies noted gender-specific differences in vertebral cancellous bone microstructure [36]. No difference was noted between men and women in vertebral cancellous bone strength, bone volume fraction or ash density, or in their respective relationship with age [12,35,36,51] when bone samples of similar size and anatomic location were examined. Differences in the anisotropy, bone loss patterns and transverse strength have been observed between male and female vertebral cancellous bone in some age groups after age-stratification. However, the microstructural changes were not consistent from age group to age group so as to explain the strength changes. For example, a greater distance between horizontal trabeculae was noted in females from above 75 years of age compared to females in the 50–75 years of age group. This difference suggests a greater susceptibility to fracture in the former, especially when loaded in the horizontal direction. However, when the samples were tested by loading horizontally, their strength was not different ( $0.31 \pm 0.12$  MPa to  $0.30 \pm 0.18$  MPa) (others found similar results [36]), despite predictions to the contrary [21,52]. Therefore, *differences in uniaxial strength and average*

**Table 2b**

Multiple regression models for  $E_{FEM}^{(λ)}$ , VMCV<sup>(λ)</sup> and  $(VMExp/\sigma_{app})^{(λ)}$  after elimination of Tb.N, Av. Models were constructed using a stepwise regression that included BV/TV, Av<sup>(λ)</sup>, BV/TV, SD<sup>(λ)</sup>, Tb.N, SD<sup>(λ)</sup>, -#Euler/Vol<sup>(λ)</sup> and DA<sup>(λ)</sup> as explanatory variables. BV/TV, Av<sup>(λ)</sup> was forced to stay in the model in order to determine contributions from other variables that are independent of BV/TV.

Response	Term	Estimate	t ratio	p<
$E_{FEM}^{(λ)}$ ( $r_{adj}^2=0.93$ ; $p<0.0001$ )	BV/TV, Av <sup>(λ)</sup>	2852.5	24.03	0.0001
	BV/TV, SD <sup>(λ)</sup>	-1915.0	-2.39	0.02
	DA <sup>(λ)</sup>	59.27	2.76	0.008
	-#Euler/Vol <sup>(λ)</sup>	-99.56	-3.15	0.003
	Intercept	-1915.0	-2.39	0.0001
VMCV <sup>(λ)</sup> ( $r_{adj}^2=0.74$ ; $p<0.0001$ )	BV/TV, Av <sup>(λ)</sup>	-1.837	-12.95	0.0001
	BV/TV, SD <sup>(λ)</sup>	4.209	3.55	0.0007
	DA <sup>(λ)</sup>	-0.1781	-5.59	0.0001
	Intercept	-0.6122	11.89	0.0001
$(VMExp/\sigma_{app})^{(λ)}$ ( $r_{adj}^2=0.98$ ; $p<0.0001$ )	BV/TV, Av <sup>(λ)</sup>	-75.75	-45.62	0.0001
	DA <sup>(λ)</sup>	-1.138	-3.83	0.0003
	-#Euler/Vol <sup>(λ)</sup>	1.094	2.26	0.03
	Intercept	28.63	12.75	0.0001



**Table 4**  
The mean (standard deviation) of the measured microstructural variability parameters from thoracic 12 and lumbar 1 vertebrae. Percent difference in means, significance of these differences and correlations between vertebrae are indicated. The percent differences between T12 and L1 were calculated with reference to T12. Results for average microstructural parameters were previously reported [59].

Parameter	Thoracic 12		Lumbar 1		Difference%	Difference (p)	Correlation (r)	Correlation (p)
BV/TV.SD	0.01781	(0.00717)	0.01657	(0.00558)	−7.0%	0.2114	0.554	0.0002
Tb.N.SD	0.1130	(0.0224)	0.1035	(0.0226)	−8.4%	0.0202	0.387	0.0137
Tb.Sp.SD	0.07810	(0.04318)	0.071632	(0.039431)	−8.3%	0.0320	0.905	<.0001
Tb.Th.SD	0.007661	(0.003370)	0.007475	(0.002812)	−2.4%	0.7148	0.483	0.0016
BV/TV.CV	0.1217	(0.4155)	11.151	(3.23247)	−8.4%	0.0881	0.527	0.0005
Tb.N.CV	0.8849	(0.2447)	8.16003	(2.49851)	−7.8%	0.0240	0.719	<.0001
Tb.Sp.CV	0.1084	(0.2641)	9.8949	(2.53306)	−8.7%	0.0143	0.598	<.0001
Tb.Th.CV	0.6754	(0.2463)	6.52107	(2.21202)	−3.4%	0.5475	0.465	0.0025

An adjustment for multiple tests, taking into account the correlations between all parameters, suggested that a p-value of 0.0174 be considered as significant for an  $\alpha$  of 0.05.

men and women [37]. Nonetheless, a greater loss of whole vertebral bone mass with age in females than in males, together with identical rate of age-related bone mass loss in the central anterior region in Mosekilde studies, suggests that the loss of bone mass in women is more regional than in men. Such a bone loss pattern would result in an increased heterogeneity of bone mass in women compared to men. Together, these results suggest that the differences in microstructural heterogeneity observed between men and women in the current study might exist at the whole bone level as well.

There are differences in vertebral fracture risk between black and white races as well; blacks have a lower incidence of fractures (e.g. [49]). Blacks are generally reported to have higher bone mass than whites, which is generally attributed to different rates of bone mass accumulation during growth [16]. However, the differences in vertebral cancellous bone architecture between blacks and whites are less well understood. BV/TV, trabecular thickness and turnover rates were generally evaluated from iliac crest bone and the differences between blacks and whites are largely dependent upon gender and geographic origin. Higher Tb.Th has been reported for African blacks than for whites in the iliac crest bone [44]. BV/TV has also been reported to be higher in African blacks than in whites but for men only [44]. While turnover rate has been reported to be higher in African blacks than in whites [43], it has been reported to be lower in American blacks than in whites [18,53]. The relationship of microstructural parameters with age was also both gender- and race-dependent for African blacks: Trabecular thickness decreased in all groups except black males, trabecular number decreased in all groups except black females and, analogously with changes in trabecular number, trabecular separation increased in all groups except black females [44]. It is difficult to know to what extent the previous findings from iliac crest can be extrapolated to vertebra due to substantial differences between iliac crest and vertebral cancellous bone properties within an individual [38,48]. Nevertheless, given these previous results, it is not surprising that we have found high order interactions of race with age and gender for our parameters. To our knowledge, age-related changes in cancellous bone heterogeneity, moreover, differences by race and gender have not been documented previously. Further understanding of these differences may provide insight into the role of genetic and environmental factors in regulation of bone microstructure.

The significant differences observed in the variability of cancellous microstructure between T12 and L1 were less than 10% but were greater than were observed for the average microstructure (Table 4) [59]. The variability parameters were also less well-correlated between the T12 and L1 of the same individual than were the average parameters (Table 4) [59]. These results suggest that while variations in average bone microstructure can be explained by factors common to the T12–L1 segment of the spine, the organization of this microstructure as measured by the variability of trabecular morphology is more dependent on local factors. The differences in microstructural variability between vertebrae that are far apart are

expected to be greater than between the T12 and L1 [58]. As such, variability of trabecular microstructure within a vertebra may be a sufficiently sensitive parameter to detect small differences between vertebrae that are similar in their average microstructure.

The increase in VMCV and  $VMExp/\sigma_{app}$  with increasing variability of the microstructure is consistent with previous findings that cancellous bone strength decreases with increasing VMCV [14] and vertebral strength decreases with increasing heterogeneity of bone mass [8,29]. Together with the observation that increased micro-damage content is associated with increased VMCV and  $VMExp/\sigma_{app}$  in vertebral bone, the current results suggest that microstructural heterogeneity is a measure of stress concentration in cancellous bone. The effect of microstructural variability on VMCV seems more prominent than on  $VMExp/\sigma_{app}$ , possibly due to the fact that  $VMExp/\sigma_{app}$  is a ratio of volume averages whereas the stress variability is directly incorporated in VMCV. The results of our multiple regression analyses indicate that microstructural heterogeneity contributes to trabecular stress variability independently from the average of the same parameter and independently from a set of conventionally measured microstructural parameters. These results suggest that vertebral strength prediction would be improved when microstructural heterogeneity information is available.

Consideration must be given to qualities of bone other than uniaxial strength, however. The existing data indicate that bone heterogeneity can reflect additional aspects of vertebral failure such as structural ductility [60] and fatigue resistance [33]. Further, cellular materials with irregularly shaped and distributed cells like cancellous bone have higher creep rates than those with regular cells even if they are stiffer [2]. Similarly, analysis of the effect of random removal of struts within a foam on the creep rate indicates that removal of only a few percent of the struts can dramatically increase the creep rate by one to two orders of magnitude whereas the effect of uniform thinning is not as dramatic [23]. The differences we found in microstructural variability between genders, race and anatomic sites may manifest differences in the fatigue and/or creep behavior of bone between these populations. Nonetheless, due to the complex nature of in vivo fractures, it is important that clinical data are obtained to ultimately test the utility of bone heterogeneity in predicting fracture.

Some limitations outlined in our previous study also apply to the current study [59]. Briefly, voxel size used in the reconstruction of image volumes, homogeneous element properties used in the FE analyses, exclusion of vertebral regions other than the central anterior portion of the vertebral bodies and use of stereologic methods in calculation of microstructural parameters were identified as limitations. Slice-by-slice stereologic calculation of trabecular microstructure is subject to errors and will provide values that are different from those calculated by direct methods [9,19]. However, dividing the sample volume in smaller regions of interest was necessary and the slice-by-slice approach provided a large number of data points from which distribution parameters could be calculated. It should be noted that BV/TV calculated from the slice-by-slice approach and that

directly calculated by voxel counting had over 99% correlation (data not shown) in the current sample. This is consistent with a previous report that microstructural parameters calculated using direct methods are highly correlated to those calculated using a model-based method [9]. While microstructural heterogeneity has information content distinct from the average as well as from connectivity and anisotropy, its relationship with other microstructural properties such as plate- vs rod-likeness of trabeculae remains to be elucidated. Also, consideration of the spatial distribution in addition to the statistical distribution properties of microstructure could provide further information on the nature of the heterogeneity [61]. This study was also limited to an investigation of the cancellous tissue from the anterior region. It is desirable to ultimately extend the results to the whole vertebrae. However, it is important to note that cancellous bone properties from the anterior region are strongly associated with whole vertebral strength [8,28]. Thus, our study, while limited, is still very relevant to overall vertebral bone quality. The effect of modulus heterogeneity on finite element calculations of cancellous bone stiffness and stress distributions has been reported to be 6–20% [3,40,41]. However, the determination of mineralization distributions and modulus assignment based on micro-CT gray levels can be problematic due to artifacts inherent in the micro-CT scans [25] or due to lack of established relationships to accurately convert these values to modulus. Anatomic site, species and tissue processing differences could also result in a difference in the magnitude of this effect. It should also be pointed out that elastic moduli directly measured by nanoindentation had less variability than estimated by micro-CT gray levels and had little to no effect in FE calculation of apparent modulus of human vertebral bone in recent studies [7,54]. Thus, these limitations are expected to have minor effects on our results but not affect our conclusions about cancellous tissue. In the end, the use of these conditions allows for direct comparisons between the current study and the previous ones that focused on average microstructural properties and trabecular stress variability [14,22,56,57,59].

The current study did not focus on the biological factors underlying microstructural heterogeneity, although mechanical loading might be expected to play a role. For example, it has been reported that low magnitude vibrations caused changes in the microstructure of trabecular bone which were associated with a reduced skewness of trabecular stresses and strains [24]. Previous work also suggested that status of the intervertebral disc and the end plate is associated with the regional microstructural and mechanical properties of cancellous bone [26], stress distributions within a vertebra [13,32,39] and the whole vertebral mechanical properties [39]. The causal nature of these associations currently needs further research.

A notable observation was the considerable degree of high order interaction in the data set. We consider the results that were significant only within a sub-group of interacting parameters to be of secondary nature since high order interactions result in a reduced sample size. These findings should be confirmed by larger scale studies.

In conclusion, microstructural variability contributes to trabecular stress distribution and cancellous bone stiffness independent from average microstructure in human vertebral bone. Microstructural variability is anatomic site-, age-, gender- and race-dependent. Consideration of microstructural variability may provide insight into the understanding of bone fragility and improve assessment of vertebral fracture risk.

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