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Abstract (200 words)

2 Osteoporosis is the most common bone disease. However, the mechanism of osteoporosis-induced alterations in bone is still unclear. The aim of this study was to investigate the effects of osteoporosis on the structural, densitometric and 5 mechanical properties of the whole tibia using *in vivo* uCT imaging, spatiotemporal 6 analysis and finite element modeling. Twelve C57BI/6 female mice were adopted. At 7 14 weeks of age, half of the mice were ovariectomized (OVX), and the other half 8 were SHAM-operated. The whole right tibia was scanned using an *in vivo* uCT imaging system at 14, 16, 17, 18, 19, 20, 21 and 22 weeks. The image datasets were registered in order to precisely quantify the bone properties. The results showed that OVX led to a significant increase in the endosteal area across the whole 12 tibia four weeks after OVX intervention but did not have a significant influence on the periosteal area. Additionally, the bone volume and mineral content significantly decreased only in the proximal regions, but these decreases did not have a significant influence on the stiffness and failure load of the tibia. This study demonstrated the application of a novel spatiotemporal approach in the comprehensive analysis of bone adaptations in the spatiotemporal space.

Keywords: Osteoporosis, mouse tibia, *in vivo* uCT, spatiotemporal analysis, finite 20 element modeling

1 **1. Introduction**

2 Osteoporotic fracture is one of the major health problems affecting the aging population.**¹** 3 Using human subjects to study osteoporosis is challenging because the 4 changes within human bone structures span a prolonged period (over years) and 5 vary substantially among individuals. The progression of osteoporosis in humans can 6 be efficiently simulated by conducting an ovariectomy (OVX) in rodents, and this has 7 become a well-established approach for investigating the mechanism of 8 osteoporosis.²⁻⁴ However, most of the previous studies are based on cross-sectional 9 analyses (i.e., sacrifice the animals at each time point of investigation) and only 10 **provide results from a portion** of the whole bone (e.g., the proximal region of the 11 mouse tibia or midshaft).²⁻⁶ These studies lack **information on following** adaptations 12 of the same bone over the whole bone space.

13 To address these issues, there is a need to develop spatiotemporal models 14 across the whole bone space, which can be realized by combining *in vivo* micro-15 computed tomography (μ CT) imaging and image registration. *In vivo* μ CT imaging is non-invasive and enables changes in the same bone to be monitored longitudinally.⁷⁻ 16 17 ⁹ Moreover, the measurement variability caused by the inter-subject differences 18 within a study cohort can be substantially reduced using *in vivo* longitudinal imaging 19 because each subject <mark>can serve as</mark> its own control using image registration.¹⁰ 20 Recently, *in vivo* μCT imaging has been used to study the effects of medical 21 **intervention** and mechanical loading on the morphometric and densitometric 22 properties of mouse bone.⁸⁻¹² However, only a portion of the bone (e.g., the proximal 23 region of the tibia or tibial midshaft) was used as the region of interest in these 24 studies. The longitudinal effect of OVX on the structural and densitometric properties 25 of the whole tibia, which has **commonly been used to study clinical bone fractures**, is unknown. This knowledge could provide additional important information on the mechanism of osteoporosis-induced bone changes in animal models. Furthermore, structural changes in areas such as the endosteal and periosteal bone areas in the spatiotemporal space could comprehensively unveil the mechanism of bone adaptation during osteoporosis.

6 Additionally, micro-finite element (μ FE) models reconstructed from μ CT images can be used to non-invasively investigate the longitudinal effect of medical 8 intervention on the mechanical **behavior** of the same bone. *In vivo* μ CT image-based 9 µFE models have been used to investigate the effect of **medical intervention** on the 10 mechanical behavior of bone¹¹ and the mechanism of bone mechano-regulation.¹³⁻¹⁶ However, no previous studies have monitored the longitudinal effect of OVX on the 12 mechanical **behavior** of bone across the whole tibia, and little is known about the relationship between the mechanical behavior of bone and the spatiotemporal changes in bone structural and densitometric properties. This knowledge could provide important information on the effect of changes (e.g., induced by OVX intervention) in bone structural and densitometric properties on the fracture resistance capability of the bone and thus could unveil the in-depth mechanism of osteoporosis.

 The aim of this study is to investigate the longitudinal effect of OVX on the structural, densitometric and mechanical properties of bone across the whole mouse 21 tibia using a novel methodology combining *in vivo* µCT imaging, spatiotemporal analysis and finite element modeling.

2. Materials and Methods

2.1 *In vivo* **CT imaging**

1 Twelve female C57Bl/6 mice were used in this study. They were divided into 2 OVX ($N = 6$) and SHAM ($N = 6$) (control) groups and received **surgery at 14 weeks of** 3 age. The right lower limbs of the mice (including the whole tibia) were imaged at 14, 4 16, 17, 18, 19, 20, 21 and 22 weeks (eight times) using an *in vivo* uCT system 5 (vivaCT 80, Scanco Medical, Switzerland) with an isotropic image voxel size of 10.4 6 μ m, a voltage of 55 keV, a tube current of 145 μ A and an integration time of 200 ms. 7 All of the procedures complied with the UK Animals Act 1986 and were approved by 8 the University of Sheffield Research Ethics Committee.

 To evaluate the effect of ionizing radiation on the results, the twelve mice were 10 sacrificed at 24 weeks of age, and then both tibiae were scanned using the same imaging protocol as used for the *in vivo* imaging. The imaging of the left tibia after 12 sacrificing the mouse was to ensure that no radiation was induced on the left tibia. The results calculated from the *ex vivo* images (mice at 24 weeks of age) were compared between the irradiated (right) and non-irradiated (left) contralateral tibiae.

15 **2.2 Image processing**

16 The image datasets were processed based on the spatiotemporal quantification 17 method *developed previously* (Fig. 1).¹⁷ Briefly, one tibia from week 14 was used as 18 the reference. The long (proximal-distal) axis of this tibia was aligned along the z-19 axis (**Fig. 1b**). The follow-up scans of the same tibia were rigidly registered to the 20 reference tibia using Quasi-Newton optimizer and Euclidean distance as the 21 similarity measure (Amira 5.4.3, FEI Visualisation Sciences Group, France) in a 22 stepwise manner, e.g., the tibia scanned at time point $+i$ was registered to the same 23 tibia scanned at time point j (**Fig. 1b-d**). For the tibiae from other mice, first, the 24 week-14 datasets were rigidly registered to the reference tibia, and then follow-up 25 scans of these tibiae were rigidly registered in a stepwise manner (tibia scanned at

 time point j+1 were registered to the same tibia scanned at time point j). To evaluate 2 the effect of ionizing radiation on the results, the right tibiae were rigidly registered to the reference tibia using the same setting of image registration. Then, the left tibiae were mirrored and registered to the corresponding right tibiae. Following the registration, the images were transformed to the new positions and resampled using the Lanczos kernel. In the resampled images, the tibial length (L) was measured from the most distal pixel to the most proximal pixel of the mouse tibia. A region of 80% of the tibia starting from the area below the proximal growth plate was selected 9 as the volume of interest (VOI), which was then partitioned into 10 compartments, each with an equal length in the z-direction (**Fig. 1e**).

11 In each compartment, the structural and densitometric parameters of the mouse 12 tibia, quantified in the present study, included bone mineral content (BMC, units of 13 Img hydroxyapatite (HA)), tissue mineral density (TMD, units of mg HA/cm³), bone 14 volume (BV, units of mm³), tibial endosteal area (TEA, units of mm²) and tibial 15 periosteal area (TPA, units of mm²). In addition, the cortical and trabecular bones in 16 the most proximal compartment (C01 in **Fig. 1f**) were segmented using a well-17 developed automatic segmentation approach.¹⁸ BMC, TMD and BV in the cortical 18 part (C01Ct) were quantified. Because there are almost no trabecular bones in the 19 compartments from C02 to C10, no separation of cortical and trabecular parts was 20 performed for other compartments. When calculating these parameters, the 21 grayscale images were first smoothed using a Gaussian filter (convolution kernel [3 3 22 3], standard deviation $= 0.65$) in order to reduce the effect of image noise. Then, the 23 HA-equivalent bone mineral density (BMD) value in each image voxel was calculated 24 from the CT grayscale values using the calibration law provided by the manufacturer 25 and checked weekly using a five-rod densitometric calibration phantom. The grayscale images were binarized using a threshold, which was 25.5% of the maximal 2 grayscale value,¹⁹ and bone masks (regions occupied by bone) were defined using the binary images. Based on the image BMD, the BMC and TMD in each compartment were calculated as the total bone minerals over the masked bone regions and as the mean mineral density within the masked bone regions, respectively. TEA and TPA were calculated as the areas enclosed by the endosteal and periosteal surfaces of mouse tibiae, respectively. **²⁰** 7

8 To visualize the longitudinal changes in tibial TEA and TPA in both the OVX and 9 SHAM groups, for the data obtained at week j (j = 16, … , 22), the TEA and TPA in 10 each compartment were presented as the differences between the values in week 14 11 and week j, normalized with respect to the baseline (week 14) values in the OVX and 12 SHAM groups, respectively. Changes in tibial BV, TMD and BMC in each 13 compartment were represented as the mean relative percentage difference $(\delta D\%_i)$ 14 between the OVX and SHAM groups:

$$
15 \qquad \delta D\%_j = \frac{(\Delta B_j - \Delta A_j)}{REF_j} \times 100 \tag{1}
$$

16 where

$$
\Delta A_j = \frac{\sum_{i=1}^{n1} (BP_{i,j}^{Sham} - BP_{i,14}^{Sham})}{n1}
$$

$$
\Delta B_i = \frac{\sum_{i=1}^{n2} (BP_{i,j}^{Ovx} - BP_{i,14}^{Ovx})}{n1}
$$

$$
\Delta B_j = \frac{\sum_{i=1}^{n2} (BP_{i,j}^{Ovx} - BP_{i,14}^{Ovx})}{n2}
$$

$$
REF_j=\frac{\sum_{i=1}^{n1} BP_{i,j}^{Sham}}{n1}
$$

17 1 n1 and n2 are the numbers of mice in the SHAM and OVX groups, *j* represents the 18 week index $(j = 16, ..., 22)$, *i* represents the mouse number index, and **BP** 19 represents the bone parameter of BV, TMD or BMC.

1 **2.3 Measurement errors associated with the image processing pipeline**

2 In order to properly interpret the differences between groups, the measurement errors 3 associated with the image processing pipeline were quantified. To do this, the right tibiae of 4 eight 14-week-old C57Bl/6 female mice were measured four times each in the *in vivo* μ CT 5 scanner with repositioning of the tibiae between scans using the same scanning set-up. The 6 repeated scan image datasets were processed by following the procedures presented in a 7 previous reproducibility study.¹⁷ Precision errors (PEs) and intraclass correlation coefficients (ICCs) were calculated to characterize the measurement errors. **¹⁷** 8

9 **2.4 Finite element analysis**

10 FE analysis was performed to evaluate the longitudinal effect of OVX 11 intervention on the mechanical **behavior of mouse tibiae**. In brief, a connectivity filter 12 was first used to remove all unconnected bone islands in the transformed binary 13 images of tibial VOI, and then homogeneous μ FE models of mouse tibiae were 14 generated (**Fig. 1g**) by converting each bone voxel into an 8-node hexahedron 15 element using in-house-developed Matlab code (Matlab 2015a, The Mathworks, Inc. 16 USA). Each tibia was modeled as an isotropic, linear elastic material with a Young's 17 modulus of 14.8 GPa and Poisson's ratio of 0.3.²¹⁻²² The boundary condition applied 18 to the μ FE models was chosen to represent the loading condition commonly used in 19 the literature for investigating the mechanical behavior of mouse tibiae,^{14,23} e.g., the 20 uniaxial compression. In detail, the nodes in the most proximal four layers of tibial 21 VOI (approximately 0.25% of the tibial length) were constrained in all degrees of 22 freedom, and a displacement of 1.00 mm was applied on the nodes in the most distal 23 four layers of tibial VOI (**Fig. 1g**). The stiffness and failure load of mouse tibiae were 24 calculated from the FE analysis. The stiffness was calculated by dividing the reaction 25 forces (summed up over all the constrained nodes at the proximal site) by the

 displacement of 1.00 mm. The failure load of mouse tibiae was calculated using the maximum principal strain criterion, which has been validated *in vitro* **²⁴** and *in vivo* **²⁵** 3 in the continuum FE models. In short, the tibial failure load was determined from the 4 histogram plot of principal strains and was the value when 5% of bone tissues in the region of investigation were over the principal strain limits (7300 µε as the tensile 6 strain limit and 10300 με as the compressive strain limit).^{24,26} When calculating the 7 failure load, Saint Venant's principle was applied to **minimize** the influence of the boundary conditions on the results and thus the region of investigation was approximately 2.06 mm (approximately 14.25% of the tibial length) away from the proximal end of the VOI and 1.77 mm (approximately 12.24% of the tibial length) 11 away from the distal end of the VOI. The uFE models were solved using ANSYS (Version 15.0, ANSYS, Inc., Cannonsburg, PA, USA) on a workstation (Intel Xeon E- 5-2670, 2.60 GHz, 256 GB RAM). It took approximately 65 minutes for one FE simulation.

2.5Statistical analysis

 The effects of OVX intervention on the structural (TEA, TPA and BV), densitometric (BMC and TMD) and mechanical (stiffness and failure load) properties 18 of mouse tibiae were analyzed using **analysis of covariance** (ANCOVA) (adjusted for the baseline values at week 14). The effect of ionizing radiation on these parameters 20 was **analyzed using** paired t-tests by comparing the values between the irradiated and non-irradiated limbs at week 24. Linear regression equations and the 22 coefficients of determinations (R^2) were computed to determine the relationships between tibial BMC and stiffness and between tibial BMC and failure load. Data are 24 presented as the mean \pm standard deviation (SD) unless otherwise specified. Analysis was performed in R software [\(https://www.r-project.org/\)](https://www.r-project.org/). The probability of 1 type I error was set to α =0.05; i.e., *p* values < 0.05 are considered statistically significant.

3 Results

3.1. Effect of ionizing radiation on TEA, TPA, BV, TMD, BMC, stiffness and failure load

 Eight *in vivo* longitudinal scans led to a decrease in TEA and increases in TPA, BV, TMD and BMC in both the OVX and SHAM groups across the whole tibia with no regional dependence (**Table 1**). The radiation-induced differences, normalized 10 with respect to the values in the non-irradiated tibiae, were similar in both the OVX 11 and SHAM groups, for example, $-3.6 \pm 1.1\%$ (range from -5.3% to -1.6% ; OVX) vs - $3.4 \pm 1.3\%$ (range from -5.1% to -1.8%; SHAM) for the total TEA; $4.4 \pm 0.9\%$ (range from 3.1% to 5.8%; OVX) vs 4.8 ± 0.7% (range from 3.5% to 5.9%; SHAM) for the total BMC (all *p* > 0.05, **Table 1**).

 The *in vivo* scans led to increased stiffness and failure load in both the OVX and SHAM groups, as predicted by the FE models. However, the increases in these 17 parameters were similar between the OVX and SHAM groups, i.e., $4.6 \pm 1.1\%$ (range from 6.3% to 3.1%; OVX) vs 4.4 ± 1.3% (range from 6.1% to 2.8%; SHAM) 19 for the stiffness; $5.6 \pm 1.1\%$ (range from 7.3% to 3.6% ; OVX) vs $5.4 \pm 1.2\%$ (range from 7.1% to 3.8%; SHAM) for the failure load.

3.2. Measurement errors associated with the image processing pipeline

 The precision errors for the bone parameters were almost homogenous along the tibial length (**Table 2**). To be conservative, the precision errors for regional BMC, TMD, BV, TEA and TPA were chosen to be 2.5%, 2.0%, 2.5%, 1.5% and 1.0%, respectively, for subsequent analysis in the present study. Therefore, only 2 differences smaller than or larger than these values can be interpreted as between- group differences. Regional BMC, BV, TEA and TPA have large ICCs (0.86 to 0.99) (**Table 2**), which means that for these parameters, the inter-subject differences are larger than the repeated-scan differences. Regional TMD has small ICCs (0.26 to 0.84) (**Table 2**); the reason for this could be that the differences in TMD between 7 mice are small.

3.3. Effect of OVX on tibial length, TEA, TPA, BV, TMD and BMC

 OVX did not have a significant influence on the tibial length from week 16 to week 22 (all *p* > 0.05, **Fig. 2**). Tibial length continuously increased from week 14 to 11 week 22, but the magnitude of the increase was small in both groups. Using the values at week 14 as the baseline, tibial length at week 22 increased by 3.74% and 2.53% in the OVX and SHAM groups, respectively (**Fig. 2**).

 OVX led to significantly increased TEA in most tibial compartments four weeks after intervention (week 18) (**Fig. 3a and 3b**, and **Fig. 4a,** most *p* < 0.05) but did not significantly alter TPA (**Fig. 3c and 3d**, and **Fig. 4b,** all *p* > 0.05). From week 14 to week 22, TEA decreased in the SHAM group (**Fig. 3a**). After OVX, the rate of TEA 18 decreased slowed, and TEA increased in some tibial compartments (e.g., C07 to C10 compartments), e.g., at week 22 in compartment C07, with respect to the 20 baseline (week 14) values, TEA decreased by 6% in the SHAM group and increased by 7% in the OVX group (**Fig. 3a and 3b**). From week 14 to week 22, TPA increased in most compartments in both the SHAM (**Fig. 3c**) and OVX groups, e.g., at week 22 in compartment C07, with respect to the baseline values, TPA increased by 14% and 17% in the SHAM and OVX groups, respectively (**Fig. 3c and 3d**).

1 Two weeks after OVX (week 17), BV and BMC significantly decreased only in the proximal compartments (C01Ct, C01 and C02) (**Fig. 4c and 4d,** all *p* < 0.05), but TMD was not significantly changed in any of the compartments (**Fig. 4e,** all *p* > 0.05). For example, at week 22 in C01 (tibial proximal region), with respect to the values in the SHAM group, OVX intervention led to a 9% decrease in BV (*p* < 0.05), a 14% 6 decrease in BMC ($p < 0.01$) and a 4% decrease in TMD ($p > 0.05$); at week 22 in C04 (tibial midshaft), with respect to the values in the SHAM group, OVX intervention led to a 4% increase in BV, a 2% increase in BMC and a 2% decrease in TMD (all *p* > 0.05).

3.4. Effect of OVX on total tibial BMC, stiffness, failure load and correlation analysis

 OVX did not have a significant influence on tibial BMC, stiffness and failure load from week 16 to week 22 (all *p* > 0.05, **Fig. 5**). The tibial BMC, stiffness and failure load continuously increased from week 14 to week 22 (**Fig. 5**). Eight weeks after 15 OVX (week 22), the values, normalized with respect to the baseline values, in the OVX and SHAM groups were 22.01 ± 4.07% (OVX) vs 25.95 ± 4.27% (SHAM) for 17 the total BMC, 11.54 \pm 2.96% vs 12.13 \pm 2.08% for the stiffness and 14.50 \pm 3.25% vs 16.16 ± 2.76% for the failure load (all *p* > 0.05, **Fig. 5**).

 Both the tibial stiffness and failure load were highly linearly correlated with the 20 total BMC for both the pooled data (stiffness: $R^2 = 0.83$; failure load: $R^2 = 0.73$) and 21 the data separated between the OVX (stiffness: $R^2 = 0.82$; failure load: $R^2 = 0.74$) 22 and SHAM groups (stiffness: $R^2 = 0.86$; failure load: $R^2 = 0.81$) (**Fig. 6**).

 Neither the OVX nor the age (from 14 to 22 weeks old) had a significant 24 influence on the pattern of the distribution of the $1st$ and $3rd$ principal strains over the

- 1 whole mouse tibia (**Fig. 7**). All failures occurred in the compressive loading mode 2 and in the same location of mouse tibia (**Fig. 7**).
- 3

4 **4 Discussion**

 In the present study, the longitudinal effect of OVX intervention on the structural, densitometric and mechanical properties of bone across the whole mouse tibia was 7 investigated using a novel approach combining *in vivo* μ CT imaging, spatiotemporal analysis and finite element modeling.

9 It should be noted in the present study that the spatiotemporal analysis 10 approach allows more precise quantification of bone changes than the standard 3D 11 morphological analysis²⁷ and a comprehensive investigation of not only the regional 12 effect but also the temporal effect (**Fig. 4**). It also should be noted that the present 13 study is the first application of longitudinal μ CT imaging in characterizing the 14 behavior of whole bone (tibia). This is necessary for two main reasons: first, it allows 15 analysis of the mechanical behavior of the whole tibia, e.g., the stiffness and failure 16 properties, which are fundamental for determining whether the pre-clinically tested 17 intervention would be effective in improving the bone competence for resisting 18 fractures (the final clinical goal of anti-osteoporosis treatments); second, it allows 19 correlation analysis between the local bone adaptations and the changes in global 20 behaviors and thus could provide a comprehensive analysis of the mechanism of 21 bone adaptation induced by osteoporosis.

 The data in the present study revealed that OVX significantly led to bone loss at the endosteal surface in most compartments after five weeks of intervention but induced no significant changes on the tibial periosteal surface, which is in good 25 agreement with the literature.^{2,6} However, the present study is the first to extend the

1 data to the spatiotemporal space across the whole tibia. It should be noted that 2 compared with the periosteal surface, the endosteal surface could be subjected to 3 more fluid flows, but the relationship between fluid flow and the **decrease in TEA** 4 requires further investigation. Second, the data revealed that OVX led to significant 5 reductions in tibial BV and BMC only in the proximal regions rather than across the 6 whole tibial region. This finding agrees with the literature data that OVX-induced 7 alifferences were more pronounced at trabecular sites than at cortical sites,⁶ and no 8 significant effects induced by OVX were detected at the femur midshaft of C57BL/6J mice**²** 9 **.** One reason for the decreases in BMC in the proximal regions is the loss of 10 trabecular bone in these regions. However, for the first time, it was revealed in the 11 present study that the cortical BV and BMC in the proximal regions (C01Ct) were 12 also reduced. One possible explanation for the decreases only in the proximal 13 regions is that there are many young, growing and porous bones in the proximal 14 regions (close to the growth plate), which make the response to OVX intervention in 15 the proximal regions much more pronounced than that in other regions (e.g., 16 midshaft). The finding that OVX intervention has no significant effect on TMD agrees 17 well with Easley et al.'s study, in which the bone tissue mineralization was found to 18 have a minimal contribution to the intervention-induced bone changes.²⁸ Third, the 19 data in the present study revealed that OVX led to significantly reduced BV and BMC 20 only in the proximal regions (C01 and C02) of the tibia, and these reductions were 21 not sufficient to significantly reduce the total tibial BMC, the stiffness and failure load 22 predicted by the FE analysis, at least in the simulated compression scenario. This 23 implies that the current animal model of osteoporosis may not be able to simulate the 24 reduced bone competence for resisting fractures in osteoporotic bones. Because of 25 the high correlations between the tibial failure load and total BMC, reduction of the 1 total BMC of the bone may be a future direction for developing appropriate animal models of osteoporosis.

3 Because *in vivo* μ CT imaging is based on ionizing radiation, the damage to bone tissues caused by the radiation could affect the outcomes of this study. It was found that eight *in vivo* scans led to altered bone properties. This is in agreement with previous studies in which it was found that irradiation resulted in an increase in 7 cortical bone density²⁹ and a substantial loss of trabecular bone.³⁰ However, the magnitudes of the radiation-induced increases in the TPA, BV, TMD, BMC, stiffness 9 and failure load, and the decrease in TEA were similar in both the OVX and SHAM groups. Therefore, the method in the present study is valid for evaluating the OVX-induced changes.

 It should be noted that, in the present study, the period of OVX is eight weeks, while this period is **approximately** five weeks ^{2,6} or up to 12 weeks in other studies.⁹ 14 In principle, a longer OVX period is better for detecting the effect of the intervention 15 but will involve more radiation and cause more pain for the mouse. It should also be 16 noted that the standardized method (i.e., selecting the four most proximal and distal layers for applying the boundary conditions and a region 2.06 mm away from the proximal end and 1.77 mm way from the distal end for calculating the failure load) was used in the µFE models. However, because of the small inter-sample variations 20 and the small longitudinal increase in tibial length from 14 to 22 weeks of age, this method will result in almost the same areas for boundary conditions and the same regions of investigation for calculating the failure load.

 There are several limitations related to the experimental work performed in the present study. First, rigid registration was used to align the image datasets. To eliminate the effect of skeletal growth on the results, the technique of full elastic

registration **³¹** 1 should be used. However, the precision and accuracy of the elastic 2 registration need to be investigated first to assure that the image interpolation used 3 in the elastic registration does not induce larger errors than those obtained from the 4 current approach. On the other hand, in the present study, the mice aged from 14 to 5 22 weeks old were chosen for investigation in order to minimize the effect of tibial 6 growth on the results. Indeed, the tibial length was found to be stabilized during this 7 period, which is in accordance with literature data.^{32,33} However, the present study 8 offers more details **owing** to its weekly investigation compared with the monthly 9 interval in other studies.^{32,33} Furthermore, in the present study, the rigid registration 10 was performed in a stepwise manner, which justified the method. Second, a 11 relatively small number of animals ($N = 6$) was used in this study, which may prevent 12 the detection of significant differences between the OVX and SHAM groups. 13 However, the mice came from the same strain and were housed and raised in the 14 same conditions. The inter-sample differences are believed to be much smaller than 15 the differences caused by the medical intervention. Finally, the tibia was chosen as 16 the bone for the investigation of osteoporosis, but the tibia is not generally a bone 17 that suffers osteoporotic fractures in humans. However, mouse bones have a very 18 different loading mechanism compared to human bones, and even mouse femur 19 cannot be used to properly simulate the osteoporotic fractures in humans. On the 20 other hand, the main aim of the present study was to demonstrate the application of 21 a novel spatiotemporal approach in the comprehensive analysis of bone adaptations 22 in the spatiotemporal space. Once the data for other sites and species are available, 23 the approach can be easily transferred to provide more clinically meaningful values. 24 With regard to the FE analysis, first, although bone is intrinsically anisotropic

25 and heterogeneous, 34 linear elastic and subject-specific homogenous μ FE models

1 were used to predict the stiffness and failure load of mouse tibiae in the loading 2 scenario of uniaxial compression in the present study. The main reasons for using 3 homogeneous instead of heterogeneous models are that the local value of bone 4 mineral density at the image voxel level may be easily affected by image noise and 5 is not reproducible¹⁷ and that the density-modulus relationship for mouse tibiae at the $6 - \mu$ CT image voxel level is still unclear. The reason for using voxel meshes instead of 7 smooth tetrahedral meshes is to avoid the modification of the actual geometry of 8 mouse tibiae in the image smoothing process. Recent studies using bovine and 9 human bone samples ^{35,36} have shown that the distribution of local displacement and 10 the stiffness of bone can be accurately predicted using linear elastic and 11 **homogenous** μ **FE models.** To the authors' knowledge, direct validation of the μ FE 12 models for different failure criteria has not been performed so far. However, in the 13 present study, the same failure criterion for each model (across mice, groups and 14 age) was applied in order to compare the predicted failure load among mice. In the 15 present study, the uniaxial compression scenario of the bone was simulated. It 16 should be noted that in reality, the loading scenario for the osteoporotic fracture of 17 mouse tibiae is much more complex. However, because osteoporosis is a systematic 18 disease that increases bone weakness, the decrease in the mechanical properties of 19 whole bone should occur not only in the fracture loading case but also in the uniaxial 20 **compression case.** In addition, the uniaxial compression loading scenario is widely 21 used in the literature and thus facilitates comparisons with other studies.^{14,23,37} 22 Additionally, other loading scenarios such as three-point bending tests are scarcely 23 informative of the changes in bone strength induced by the changes in some local 24 regions of the bone. For example, if the local bone adaptations lead to a failure in the 25 midshaft (position of loading in three-point bending test) of mouse tibiae, failure load 1 of the tibia cannot be properly predicted by the FE models because of the removal of the region of interest close to the boundary conditions (Saint Venant's principle). It should be noted that the midshaft of mouse tibiae has the highest principal strains 4 during locomotion,³⁸ and thus, this region is at high risk of fracture compared to other 5 regions. Finally, the intra-cortical porosity was not measured in the μ CT images and 6 not incorporated into the FE model. The reason for this is that the *in vivo* uCT image 7 resolution of 10.4 um is not sufficient to make accurate measurements of intra-8 cortical porosity in mouse tibiae. However, it should be noted that the large pores 9 within the cortex were segmented and considered in the FE models.

 In summary, this study demonstrated the application of a novel spatiotemporal approach in the investigation of the longitudinal effect of OVX on bone properties. 12 Using this approach, several additional and important findings were revealed. For 13 example, OVX induced bone loss only at the tibial endosteal surface and not at the periosteal surface; OVX led to significantly reduced bone volume and BMC only in the proximal regions, but these reductions did not have a significant influence on the total tibial BMC, stiffness and failure load. The spatiotemporal approach can be used to conduct comprehensive analyses of the changes in bone properties in other scenarios in preclinical animal studies.

Conflict of interest statement

 The authors declare that there are no financial or personal relationships with other persons or organizations that might inappropriately influence this work.

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1 **Table 1.** Relative differences between the irradiated and non-irradiated tibiae in 2 terms of the structural (TEA, TPA and BV) and densitometric (TMD and BMC) 3 properties of mouse tibiae in the OVX and SHAM groups across the whole tibia (N = 4 6 per group). Data are presented as the radiation-induced differences normalized 5 with respect to the values in the non-irradiated tibiae at 24 weeks of age.

1 **Table 2**. Reproducibility of BV, TMD, BMC, TEA and TPA expressed as mean 2 precision errors (PEs) as coefficients of variation (the 95% confidence intervals are 3 shown in square brackets) and intraclass correlation coefficients (ICC) (8 mice and 4

- 4 scans per mouse) (C01 C10 correspond to tibial proximal to distal sides; see
- 5 **Figure 1f).**

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2 **Figure 1.** Schematic representation of the quantification of tibial parameters in the 3 spatiotemporal space. (a) The baseline/reference data (one tibia from a 14-week-old 4 mouse); (b) the aligned baseline data; (c) the follow-up data of the same tibia (tibia 5 from the same mouse but at 16 weeks of age); (d) the registered tibial data using 6 rigid registration; (e) the volume of interest (VOI) for investigation; (f) the spatial 7 partition of tibial VOI and the quantification of tibial structural and densitometric 8 parameters and (g) the setup of finite element models for the quantification of tibial 9 mechanical parameters.

Figure 2. The longitudinal adaptations of tibial length in both the OVX and SHAM

3 groups. Data are presented as the mean ± standard deviation of tibial length in the

4 OVX and SHAM groups $(N = 6$ per group).

Normalised TEA in the SHAM group

Figure 3. The longitudinal adaptations of the endosteal and periosteal areas (TEA

3 and TPA) of mouse tibiae in the spatiotemporal space in both the OVX and SHAM

groups. Data (units in percentages) are presented as the mean changes normalized

- 5 with respect to the baseline values at week 14 (C01 to C10 represent compartment
- 01 to compartment 10 in **Fig. 1f**).

Effect of OVX on TEA

Effect of OVX on TPA

 Figure 4. Longitudinal effect of OVX intervention on the structural (TEA, TPA and BV) and densitometric (TMD and BMC) properties of mouse tibiae in the spatiotemporal 4 space. Data are presented as the mean relative percentage difference between the

OVX and SHAM groups (**Equation 1**) for the 10 compartments along the tibial

- 1 proximal-distal axis ($p < 0.05$, \rightarrow $p < 0.01$) (The cortical and trabecular parts were 2 separated in C01, and C01Ct represents the cortical part in C01). Table color code: 3 the gray areas are values within the ranges of measurement error; the red and blue 4 areas represent an anabolic and a catabolic effect, respectively.
- 5

7 **Figure 5.** Longitudinal effect of OVX intervention on the total BMC, the FE predicted 8 stiffness and failure load of mouse tibia. Data are presented as the mean ± standard 9 deviation of the values, normalized with respect to baseline.

 Figure 6. Linear regression analysis for FE predicted stiffness vs BMC and failure load vs BMC. (a) and (c): Analysis for the pooled data for both the OVX and SHAM groups; (b) and (d) analysis for the OVX and SHAM groups, respectively (N = 6 per group).

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Figure 7. Distribution of the 1st and 3rd principal strains over mouse tibiae. All the

3 images of mouse tibiae were plotted with the same view angle. The *images for*

4 weeks 14 and 22 came from the same mouse in the OVX and SHAM groups.