

OPEN The interplay between bone healing and remodeling around dental implants

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Long-term bone healing/adaptation after a dental implant treatment starts with diffusion of mesenchymal stem cells to the wounded region and their subsequent differentiation. The healing phase is followed by the bone-remodeling phase. In this work, a mechano-regulatory cellular differentiation model was used to simulate tissue healing around an immediately loaded dental implant. All tissue types were modeled as poroelastic in the healing phase. Material properties of the healing region were updated after each loading cycle for 30 cycles (days). The tissue distribution in the healed state was then used as the initial condition for the remodeling phase during which regions healed into bone adapt their apparent density with respect to a homeostatic remodeling stimulus. The short- (bone healing) and long-term (bone remodeling) effects of initial implant micromotion during the healing phase were studied. Development of soft tissue was observed both in the coronal region due to high fluid velocity, and on the vertical sides of the healing-gap due to high shear stress. In cases with small implant micromotion, tissue between the implant threads differentiated into bone during the healing phase but resorbed during remodeling. In cases with large implant micromotion, higher percentage of the healing region differentiated into soft tissue resulting in smaller volume of bone tissue available for remodeling. However, the remaining bone region developed higher density bone tissue. It was concluded that an optimal range of initial implant micromotion could be designed for a specific patient in order to achieve the desired long-term functional properties.

Dental implant fixtures have become an integral part of treatment for partially or fully edentulous patients¹ since Branemark introduced the two-stage treatment protocol². More recently, a single-stage protocol, where the implant is surgically inserted, the prosthetic tooth installed and the implant immediately loaded, is considered beneficial as it reduces the number of surgical interventions. Osseointegration of immediately loaded implants has been the subject of numerous clinical and animal studies. Provided that the primary stability of the implant can be ensured^{3,4}, immediate loading has been shown to be a reliable treatment^{1,5}, without disturbing the biological osseointegration process⁶ or affecting bone mineral apposition rate⁷. In general, the primary stability is ensured by splinting the new prosthetic tooth to a stable anchor point and/or by making sure that the implant threads engage with existing bone. Even under these conditions, high occlusal loading is considered as a risk factor for immediately loaded implants⁵.

Small holes drilled in bone heal by intramembranous ossification in the first few weeks after surgery8. Such bone formation starts with blood clot formation, vascularization within the healing gap, and proliferation and migration of mesenchymal stem cells (MSCs) from surrounding bone marrow9. Under favorable conditions and stable sites, MSCs differentiate into osteoblasts and woven bone forms through osteogenesis 10 followed by compaction of woven bone. After about a month^{9,11}, bone remodeling starts. In this phase, bone continuously adapts itself by adjusting its apparent mass density to mechanical loading and functionality^{12,13}. Similarly, dental implant surgery involves placement of an implant in a drilled hole (osteotomy). The healing mechanism of the tissue in the gap between the implant and the preexisting bone was shown to be intramembranous bone formation^{10,14}.

As stated above, in clinical treatments implants are assured to have initial contact with the surrounding bone to avoid excessive micromotion¹⁵. While the primary stability of the implant helps with the success of the treatment, it is still not clear how much micromotion can be tolerated without causing fibrous tissue encapsulation¹⁶ especially because each treatment scenario is patient specific. In order to address this question experimental studies were conducted, where the implant was inserted in an osteotomy wider than itself without any initial bone

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anchorage, while the implant micromotion was controlled during the experiment ^{14,17}. Such studies shed light on the interaction of micromotion and bone healing at a fundamental level. In this work, a mathematical model of a similar insertion site, where there is no initial bone-to-implant contact is created in order to understand the direct effects of implant micromotion on bone healing.

The independent variable to measure the effects of external loading on the healing tissue has historically been displacement, because it is easier to control micron-level displacements in experiments performed on soft tissue. In fact, studies of healing around immediately loaded implants typically use implant micromotion to assess healing pathway¹⁷. On the other hand, the independent variable to measure bone response and remodeling has historically been force, because bone can handle relatively large forces¹⁸. In the present work, the same practice is followed in order to be consistent with the experimental literature; during the healing phase, micromotion of the implant is used as the independent variable, whereas during the remodeling phase mastication force is used. It is of course interesting to note that in a micromotion-controlled environment the tissue properties change continuously and the load carrying capacity of the tissue adjusts accordingly.

Clinical and experimental examinations create the opportunity to observe biological processes of fracture healing^{9,19,20} and bone remodeling²¹; and, in-silico studies can represent how biological factors contribute to the outcome of a dental implant treatment²². Numerous computer simulations have been carried out to investigate effects of mechanical loading on bone healing and bone remodeling^{18,23–32}. In healing studies, long-term adaptation of the bone tissue is not investigated, and remodeling studies usually do not start from a realistic initial state. To the best of our knowledge, this is the first study modeling both biological processes consecutively.

Results

Transient change of elastic modulus during healing and remodeling for different ranges of initial implant micromotion (during the healing phase) is shown in Fig. 1. It is interesting to note that regardless of the micromotion range, the tissue between the implant threads develop into bone during the healing phase (days 1–30) but resorb during remodeling. The fate of the tissue on the vertical sides of the healing gap strongly depends on the micromotion amplitude.

The distributions of the solid and fluid stimuli in the healing gap are shown in Fig. 2 for days-5 and -30. This reveals that the regions in between implant threads experience the lowest solid stimulus (lowest shear strain) and lowest fluid velocity compared to the other regions of the healing gap. The regions between the implant threads have smaller shares of transferring mechanical load to surrounding cancellous bone. This characteristic leads these regions to a faster healing during the healing phase, but to resorption later during remodeling phase. Resorption due to insufficient remodeling stimulus is known as stress shielding 33 . During the healing phase, large loading amplitude ($z_{\rm max}=20~\mu m$) causes soft tissue development on the vertical sides of the healing gap and in the coronal region (Fig. 1). This observation is correlated with the high solid and fluid stimuli in these regions (Fig. 2). Note that the high fluid velocity in the coronal region is due to the very low permeability of the adjacent cortical bone.

Two metrics are defined in order investigate tissue evolution during healing and remodeling phases. Tissue volume (TV) is the ratio of the volume of a specific tissue type to the volume of the healing region. Tissue-to-implant contact (TIC) shows how much of the implant surface is in contact with a specific tissue type. TV and TIC histories for soft tissue (E < 2 MPa), immature and trabecular bone (E < 3.5 GPa) are presented in Fig. 3 for a total of 15,000 days after start of treatment. Note that healing is simulated in the first 30 days (E < 3.5 GPa), after which the simulation algorithm is switched to remodeling (E > 3.5 GPa).

These results reveal interesting interplay between the different tissue types in the longitudinal simulations. The case subjected to 5 μm motion is predicted to develop negligible fibrous tissue (Fig. 3A, TV = 0%, TIC = 0%) and nearly 100% immature and trabecular bone (Fig. 3B) at the end of the healing period. During the remodeling phase, some of the woven and trabecular bone (Fig. 3B) resorb into soft tissue (Fig. 3A, TV = 35%, TIC = 50%) and some develop into cortical bone (Fig. 3C, TV = 7%, TIC = 10%). During this phase, resorption is attributed to stress shielding effect, while development of the cortical bone is attributed to the remodeling process seeking a higher bone density, in order to respond to the 100 N of mastication load. Similar predictions are made for the implant that was subjected to 10 μm motion during the healing phase. This treatment is also predicted to result in negligible fibrous tissue (Fig. 3A), slightly lower volume (95%) of immature and trabecular bone (Fig. 3B) at the end of the healing phase, and a similar trend and amount of bone resorption (Fig. 3A) and densification (Fig. 3C) in the long term (t >30).

Tissue around the implant that is subjected to 20 μm motion evolves differently, resulting in a weaker prognosis for the simulated treatment. This implant develops a relatively large amount of fibrous tissue (Fig. 3A, TV = 5%, TIC = 0.9%) and cartilaginous tissue (TV = 45.8%, TIC = 27.3%) and a relatively low amount of woven and trabecular bone (Fig. 3B, TV = 45%, TIC = 68%) at the end of the healing period. During the remodeling phase some of the woven and trabecular bone develops into cortical bone (Fig. 3C, TV = 15%, TIC = 8%). Some low stiffness fibrous tissue is also developed due to stress shielding (Fig. 3A, TV = 16%, TIC = 32%). A steady state for the cortical bone is not quite established at the end of the simulated remodeling phase.

The TV and TIC values at the end of the healing (t=30 days) and remodeling (t=15,000 days) periods are summarized in Table 1. A clear correlation between magnitude of the implant motion in the first 30 days and the amount of bone that is maintained very much longer after the initial healing period is predicted. This shows that after 15,000 days 65%, 63% and 33% of the TV consists of either trabecular or cortical bone, for implant motion values of 5, 10 and 20 μ m, respectively. For the lower two values of the micro-motion, the tissue is primarily trabecular bone, whereas for the 20 μ m motion, the distribution is 18% trabecular and 15% cortical bone. Thus it is seen that, in this case, the tissue is able to recover load carrying capacity by redistributing the bone quality from 46% woven and trabecular bone at the end of the healing period to 18% trabecular and 15% cortical bone.

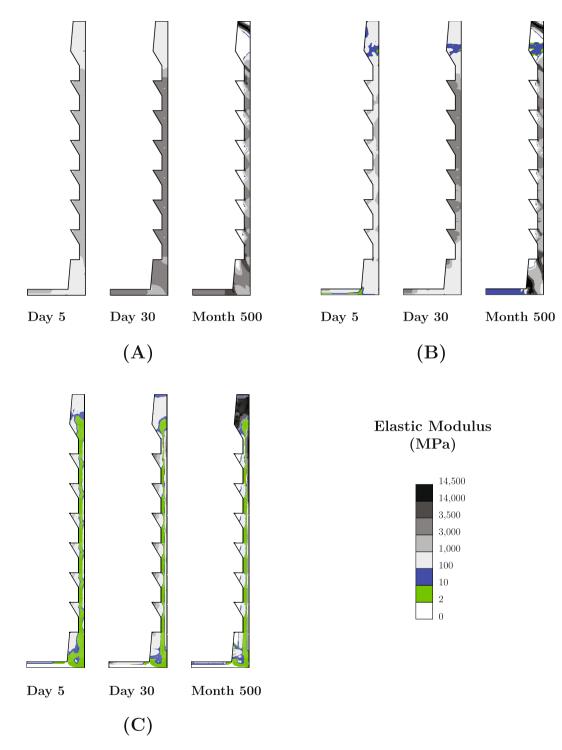


Figure 1. Transient change of local elastic modulus in the healing region, for (A) $z_{max} = 5 \mu m$, (B) $z_{max} = 10 \mu m$, and (C) $z_{max} = 20 \mu m$.

Discussion

In general, mechanical loading is in favor of formation of high-density bone during remodeling, but it is in favor of development of soft tissue during bone healing. The bone healing and remodeling theories, both of which are rooted in empirical observation, lead to this outcome. This work demonstrates the interplay between healing, remodeling and loading levels and shows that the point in time where bone quality is measured has a major role in the evaluation of the peri-implant osseointegration. This observation perhaps sheds light onto the seemingly contradictory results obtained in clinical and experimental studies involving animals.

There are numerous such studies which show that the long-term success of implant treatments depends on the mechanical conditions during the healing phase. Sagara *et al.* observe low levels of direct bone contact in

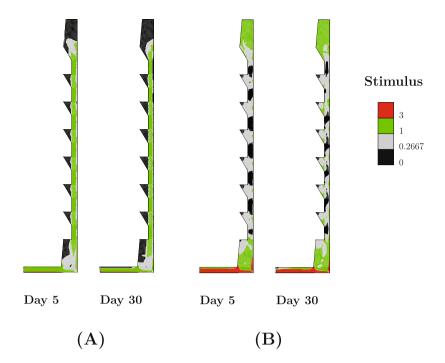


Figure 2. Distribution of (**A**) solid stimulus and (**B**) fluid stimulus in the healing region at day 5 and day 30 (healing phase) for $z_{max} = 20 \ \mu m$.

histological examination and attribute this to early loading and excessive micromotion³⁴. On the other hand, Piatelli *et al.* indicate immediate loading to be in favor of more bone implant contact (BIC)³⁵ and Henry *et al.* attribute more mature cortical bone around the implant to early loading³⁶ (Fig. 3C shows the same behavior). Presence and quality of bone surrounding an implant³⁷ and its initial stability^{3,4} have also been extensively mentioned as important determinants of outcome of dental implant treatments. Excessive loading and relative motion of the implant are mentioned as important factors in development of interfacial fibrous tissue^{37–39}, which can be seen in Fig. 1C as well. To the contrary, Duyck *et al.* found that low micromotion is less favorable than a high micromotion¹⁹. This appears to be in agreement with evolution of TV in Fig. 3A.

Primary stability of the implant depends also on the insertion torque (IT) and the extent of initial BIC. High IT is expected to result in less implant micromotion. Cha *et al.*²¹ showed that implants with high IT cause a wider dead zone of osteocytes at the implant interface. On the other hand, Grandi *et al.* showed that using high IT does not prevent osseointegration²⁰. The effect of the dead zone and simulation of the IT are beyond the scope of this work but should be included in future studies.

It is important to realize that for a given mastication force on an implant, there will be varying ranges of implant micromotion from patient to patient depending on the quality of the surrounding bone and the initial bone implant contact. While the current model does not start from a realistic implant insertion scenario in clinical treatment sense (no initial BIC), it sheds light onto the intricate dependence of the long-term bone maintenance on the earlier healing phase. Moreover, the micromotion threshold can be translated into tissue level variables. This work showed that for largest micromotion value during healing ($z_{max} = 20 \, \mu m$), octahedral shear strain values of %3.75 and higher cause soft tissue formation along the vertical sides of the healing gap; whereas in the coronal region of the gap and under the implant, combination of high shear strain (%3.75 and higher) and high fluid velocity (3 μ m/s and higher) are the reasons for soft tissue development. The fastest fluid velocity is observed under the implant with values exceeding 9 μ m/s.

Simulation of the entire treatment duration by using the existing bone healing and remodeling models in a sequential manner explains the apparent inconsistencies reported in clinical studies; and helps demonstrate how interrelated and complex this treatment modality can be. In particular, it is seen that reaching a bone mass distribution that appears favorable at the end of a three- or four-week long healing period may not be an indicator of the long-term bone maintenance. The entire healing and remodeling process should be considered to this end. On the other hand, as expected, this work confirms that a healing period that results in low quality/quantity is not indicative of long-term failure of the treatment.

Summary and Conclusion

Simulations of bone healing followed by bone remodeling were carried out in order to contribute to our understanding of long-term osseointegration and bone remodeling around dental implant systems. While the biology of wound healing and remodeling around oral implants is a complex phenomenon and it is still under investigation, in this study these processes are assumed to be the same as in long bone. The work shows that evolution of tissue type following an implant treatment does not have a linear correlation with mechanical usage (i.e. micromotion levels). Moreover, the end state of bone healing which transitions to remodeling plays a crucial role in

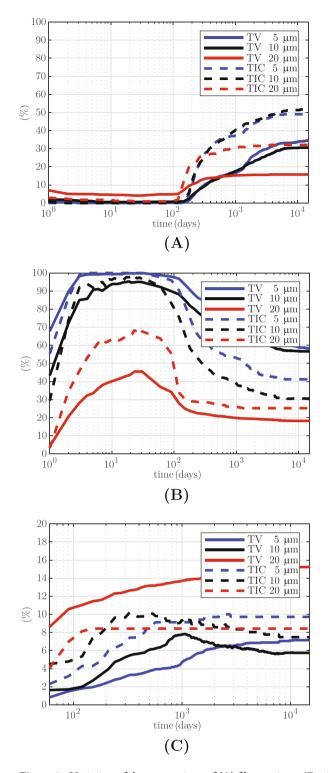


Figure 3. Variation of the proportions of **(A)** fibrous tissue (E <2 MPa), **(B)** woven and trabecular bone (100 MPa <E <3.5 GPa) and **(C)** cortical bone (E >3.5 GPa) during healing (t <30 days) and remodeling (t >30 days) as measured by TV and TIC. Results are given for z_{max} values of 5, 10 and 20 μ m.

the distribution of different tissue types around the implant in the long term. Without considering the healing process, higher mechanical usage would guide the predictions toward a higher bone density and cannot predict development of soft tissue in the presence of excessive mechanical loading. On the other hand, studying only the healing phase does not provide any information about the long-term adaptation of internal apparent bone density and potential regions of bone resorption. This work shows that an optimal range for implant micromotion and for a given implant contour should be possible, particularly on a patient specific basis, in order to achieve the desired outcome and functionality for dental implant treatments.

	Fibrous tissue E < 2 MPa		Woven & tr bone 0.1 <	abecular E < 3.5 GPa	Cortical bone E>3.5 GPa					
	TV (%)	TIC (%)	TV (%)	TIC (%)	TV (%)	TIC (%)				
t = 30 days										
5 μm	0.0	0.0	100	100	0.0	0.0				
$10\mu m$	0.5	0.0	95	97.7	0.0	0.0				
$20\mu m$	4.1	0.9	45.7	67.8	0.0	0.0				
$t = 15 \times 10^3 days$										
5 μm	34.5	49.6	58.3	40.7	7.1	9.7				
10 μm	30.6	51.7	56.7	30.6	5.7	7.5				
20 μm	15.7	32.1	18.2	25.3	15.3	8.4				

Table 1. Predicted values of TV and TIC at the end of the healing and remodeling periods.

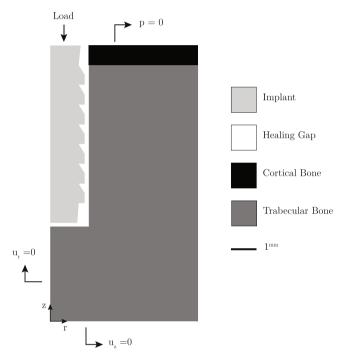


Figure 4. Cross-section depicting a dental implant with buttress type threads surrounded by cortical and cancellous bone types and the healing gap.

Materials and Methods

In order to study peri-implant bone healing and the subsequent bone remodeling, an axisymmetric model (Fig. 4) of the bone and the implant was developed. The model includes a dental implant with inner and outer radius of 1.75 and 1.95 mm and height of 9 mm, cortical and cancellous bone regions, and the healing gap. The healing gap is 200 μ m wide in which tissue properties evolve during healing and remodeling processes. In the healing phase, the bone and the tissue in the gap were modeled as poroelastic materials with the properties given in Table 2. Physics of a saturated porous medium such as the one present in the healing gap is governed by fluid mass conservation as well as equations of elastic equilibrium⁴⁰. In addition to the two material constants (elastic modulus and Poisson's ratio) defining the elastic behavior of the solid part of the healing region, four other material constants (dynamic permeability of the fluid, porosity, and solid and fluid bulk moduli) are required for the fluid mass conservation. The boundary conditions were defined to represent ambient pore pressure (p = 0) at the superior aspect of the cortical bone and the gap, and axisymmetry along the central axis of the system (Fig. 4). Cyclical, displacement-controlled loading was applied to the top of the implant along the implant (-z) axis. During the remodeling phase, all tissue types were assumed to behave in linear-elastic manner, where the physical deformation is governed solely by the equations of elastic equilibrium. The boundary conditions were kept the same as before. An axially oriented mastication load of 100 N was applied in the -z direction.

Bone healing. Bone healing is a physiologically complex process, which can go through various healing pathways based on mechanical and biological factors⁴¹. The initial response to fracture in bone starts with migration of MSCs to the healing gap⁴². Lacroix and Prendergast suggested a random movement of stem cells (SCs) from

	Elastic Modulus (GPa)	Poisson's Ratio	Porosity	K _s (GPa)	K _f (GPa)	Permeability (mm ⁴ /(N.s))
Granulation Tissue	0.002	0.17	0.8	2.3	2.3	0.01
Fibrous Tissue	0.002	0.17	0.8	2.3	2.3	0.01
Cartilage	0.01	0.17	0.8	3.4	2.3	0.005
Immature Woven Bone	1	0.30	0.8	13.92	2.3	0.1
Mature Trabecular Bone	3.5	0.30	0.8	13.92	2.3	0.37
Cortical Bone	14.5	0.30	0.04	13.92	2.3	10^{-5}

Table 2. Poroelastic properties of tissues from Lacroix and Prendergast²³.

a vascularized origin with maximum cell concentration toward the healing region²³, governed by the diffusion equation:

$$D\nabla^2 n_{sc} = \frac{dn_{sc}}{dt} \tag{1}$$

where D is the diffusion constant, n_{sc} is local percentage of available stem cells, and t is the time. Note that at the beginning of fracture there are no stem cells in the healing region (i.e. $n_{sc}=0$ at t=0). D is calibrated such that n_{sc} reaches its maximum ($n_{sc}^{(max)}=100$) in the entire healing region after 14 days^{43–45}. In this work $D=0.023 \frac{mm^2}{day}$ was used.

Two biophysical stimuli, octahedral shear strain (γ) and interstitial fluid velocity (v) are thought to regulate cellular differentiation pathway^{46,47}. The healing stimulus S is formulated as:

$$S = \frac{\gamma}{a} + \frac{v}{b} \tag{2}$$

where a=0.0375 and b=3 $\mu m/s$ are two constants determined empirically²³. Based on this regulatory model, higher values of S are described as the reason for fibrous tissue generation, while lower values of S predict bone tissue formation as follows:

$$\label{eq:mature waven bone} \begin{array}{ll} \text{Mature trabecular bone} & 0.0000 < S < 0.2667 \\ \text{Immature woven bone} & 0.2667 < S < 1.0000 \\ \text{Cartilaginous tissue} & 1.0000 < S < 3.0000 \\ \text{Fibrous tissue} & 3.0000 < S \end{array} \tag{3}$$

The corresponding material properties of these tissue types are given in Table 2. During healing, the local cell concentration depends on diffusion. An effective value for a given material property M_e in the healing region is found by using the rule of mixtures as follows:

$$M_{e}(t) = \frac{n_{sc}}{n_{sc}^{(max)}} M(t) + \left(1 - \frac{n_{sc}}{n_{sc}^{(max)}}\right) M_{g}$$
(4)

where M_e is one of the six material properties listed in Table 2, M(t) is the local poroelastic property that evolves as described by Eq. (3) and M_e is the property for the granulation tissue.

The evolution of material properties during healing depends on the concentration of available cells, the mechanical response of the poroelastic tissue and the stimulus described above. The time dependent nature of this coupled problem is solely due to the diffusion equation in this model. Equations (1–4) are solved through numerical iterations where each iteration is considered to be one day long. Due to the rapid changes in material properties during this pseudo-transient solution, numerical damping is introduced by using a moving average of the predicted quantities²³. Recently we used the following relaxation approach as an alternative to the moving average in order to dampen the abrupt changes in material properties:

$$M_e^{(i+1)} = M_e^{(i)} + \alpha (M_e(t) - M_e^{(i)}), \ \alpha = 0.2$$
 (5)

where i represents the solution iteration level (i.e., day). Effects of initial material properties of the granulation tissue, geometrical properties, and MSC diffusion constant, on the healing pathway have been studied by Ghiasi et al. Another parametric study performed by the authors shows that the D and α values used in the present work are effective in damping out the spurious fluctuations. In this work the material properties were updated in the healing gap for 30 iterations, and final values were used as the initial conditions at the start of bone remodeling phase.

During fracture healing, the implant was subjected to oscillatory displacement according to the haversine function:

$$z(t) = \frac{1}{2} z_{\text{max}} (1 - \cos 2\pi \nu t)$$
 (6)

where z_{max} is the range of the micromotion, with an amplitude of \pm $z_{max}/2$. The oscillation frequency ν was kept constant at 1 Hz. z_{max} values of 5, 10 and 20 μ m were used in this work. Numerical experiments showed that simulation duration of 4 seconds was sufficient to find the steady state conditions. Average of fluid velocity and shear strain during transient solution was used to calculate healing stimulus in Eq. (2). The effects of loading rate, abrupt changes in loading conditions and calculation of the accumulated healing stimulus on the prediction of fracture healing pathway will be discussed in separate articles.

Bone remodeling. Bone needs a certain level of mechanical stimulation to maintain an apparent density distribution that can withstand the daily loading cycles⁴⁹. The apparent density of bone does not change if the homeostatic stimulus level can be maintained. Loading levels that cause stimulus higher than the homeostatic level cause the apparent bone density to increase. At very high loading levels the bone can fracture. On the other hand, loading levels that result in stimulus lower than the homeostatic levels can cause the bone to resorb. These effects are carried out in two ways. Bone adapts both its shape (surface remodeling) and its internal material properties (internal remodeling) through cellular activities of osteoclasts removing dead bone cells and osteoblasts depositing new cells^{50,51}. In the present study internal changes in bone material properties in response to the mechanical environment is investigated. Although it has been shown that bone remodeling depends on the fluid velocity as well as the mechanical signals in the solid phase⁵², only the latter one was used in this work and bone and other tissue types were modeled as isotropic elastic materials. Using a poroelastic model during bone remodeling, where updating porosity affects the fluid flow in the trabecular bone and its mechanical behavior in general, should be considered in the future.

In nature and in this work, the end state of the healing phase serves as the initial condition of the remodeling phase. Assuming that soft tissue cannot remodel, only the healed regions with elastic modulus of 100 MPa and higher were allowed to remodel, or in other words, experience adaptation of the apparent density. This phase of adaptation was simulated by using Carter *et al.*'s model⁴⁹, which calculates the rate of change of the apparent bone density as follows:

$$\dot{\rho} = \dot{\mathbf{r}} \, \mathbf{S}_{\mathbf{v}} \, \rho^{(\text{max})} \tag{7}$$

where ρ is the apparent bone density, $\rho^{(max)} = 1.92 \text{ gr/cm}^3$ is the density of fully mineralized bone tissue with zero porosity and S_v is bone specific surface (BS/TV) calculated from:

$$S_{v} = 0.6255 \,\rho^{6} - 3.703 \,\rho^{5} + 7.0228 \,\rho^{4} - 4.8345 \,\rho^{3} - 1.928 \,\rho^{2} + 6.745 \,\rho \tag{8}$$

In Eq. (7), \dot{r} is the linear rate of bone apposition or resorption^{49,53} that is represented as follows:

$$\dot{\mathbf{r}} = \begin{cases} c_{r} (\psi - \psi_{AS}) + c_{r} w & \psi - \psi_{AS} < -w \\ 0 & -w < \psi - \psi_{AS} < w \\ c_{f} (\psi - \psi_{AS}) - c_{f} w & w < \psi - \psi_{AS} \end{cases}$$
(9)

where $c_r=2\times 10^{-5}$ and $c_f=2\times 10^{-4}$ are the rates of bone resorption and bone apposition with respect to daily stimulus ψ . $\psi_{AS}=15$ MPa/day is defined as attractor (or homeostatic) stress stimulus for 112 number of daily load cycles⁴⁹. $w=0.25\psi_{AS}$ is half width of the dead zone in which bone maintains its density ($\dot{r}=0$). The daily stress stimulus is defined by using a tissue-level measure as follows:

$$\psi = (N\sigma_T^{m})^{1/m} \tag{10}$$

where N is number of cycles of loading and in this work a value of m=4 was used based on experimental data for cortical and cancellous bone⁵⁴. The tissue level stress σ_T is related to the continuum level stress σ_c as follows:

$$\sigma_{\rm T} = \left(\frac{\rho^{\rm (max)}}{\rho}\right)^2 \sigma_{\rm c} \tag{11}$$

The continuum level stress can be represented by using the elastic modulus E and strain energy density u of the material as follows:

$$\sigma_{c} = \sqrt{2 \text{ Eu}} \tag{12}$$

Bone elastic modulus is related to its apparent density⁴⁹ by the following empirical relationship:

$$E = \begin{cases} 2042.82 \, \rho^{2.5}, \ \rho < 1.2 \\ 1798.06 \, \rho^{3.2}, \ \rho > 1.2 \end{cases} \tag{13}$$

Equations (7–13) are solved numerically. In particular, Eq. (7) is discretized by using the forward time integration scheme. Each time step represents 30 days of bone loading and Eq. (10) is adjusted accordingly. The daily remodeling stimulus was determined by using N=112 for a load value of 100 N on the tooth as the typical daily mastication regime.

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References

- 1. Jaffin, R. A., Kumar, A. & Berman, C. L. Immediate loading of implants in partially and fully edentulous jaws: a series of 27 case reports. *Journal of periodontology* 71, 833–838, https://doi.org/10.1902/jop.2000.71.5.833 (2000).
- Branemark, P.-I. Osseointegration and its experimental background. Journal of Prosthetic Dentistry 50, 399–410, https://doi. org/10.1016/S0022-3913(83)80101-2 (1983).
- 3. Romanos, G. et al. Peri-implant bone reactions to immediately loaded implants. An experimental study in monkeys. Journal of periodontology 72, 506-511, https://doi.org/10.1902/jop.2001.72.4.506 (2001).
- Lioubavina-Hack, N., Lang, N. P. & Karring, T. Significance of primary stability for osseointegration of dental implants. Clinical oral implants research 17, 244–250, https://doi.org/10.1111/j.1600-0501.2005.01201.x (2006).
- 5. Glauser, R. et al. Immediate Occlusal Loading of Brånemark Implants Applied in Various Jawbone Regions: A Prospective, 1-Year Clinical Study. Clinical implant dentistry and related research 3, 204–213, https://doi.org/10.1111/j.1708-8208.2001.tb00142.x (2001).
- 6. Meyer, U. et al. Ultrastructural characterization of the implant/bone interface of immediately loaded dental implants. Biomaterials 25, 1959–1967, https://doi.org/10.1016/j.biomaterials.2003.08.070 (2004).
- Nkenke, E. et al. Bone contact, growth, and density around immediately loaded implants in the mandible of mini pigs. Clinical oral implants research 14, 312–321, https://doi.org/10.1034/j.1600-0501.2003.120906.x (2003).
- 8. Schenk, R. K., Buser, D., Hardwick, R. & Dahlin, C. Healing Pattern of Bone Regeneration in Membrane-Protected Defects: A Histologic Study in the Canine Mandible. *Int J Oral Maxillofac Implants* 9, 13–29 (1994).
- 9. Brunski, J. B. *In vivo* bone response to biomechanical loading at the bone/dental-implant interface. *Advances in dental research* 13, 99–119, https://doi.org/10.1177/08959374990130012301 (1999).
- 10. Prendergast, P. & Van der Meulen, M. In Bone Mechanics Handbook (ed. Stephen C. Cowin) Ch. 32, 1-11 (2001).
- 11. Marsell, R. & Einhorn, T. A. The biology of fracture healing. Injury 42, 551-555, https://doi.org/10.1016/j.injury.2011.03.031 (2011).
- 12. Frost, H. Bone "mass" and the "mechanostat": a proposal. The Anatomical Record 219, 1–9, https://doi.org/10.1002/ar.1092190104 (1987).
- 13. Hart, R. In Bone Mechanics Handbook (ed. Stephen C. Cowin) Ch. 31, 1-42 (2001).
- Leucht, P. et al. Effect of mechanical stimuli on skeletal regeneration around implants. Bone 40, 919–930, https://doi.org/10.1016/j. bone.2006.10.027 (2007).
- 15. Berglundh, T., Ingemar, A., Lang, N. P. & Lindhe, J. De novo alveolar bone formation adjacent to endosseous implants. A model study in the dog. Clinical oral implants research 14, 251–262, https://doi.org/10.1034/j.1600-0501.2003.00972.x (2003).
- Szmukler-Moncler, S., Salama, H., Reingewirtz, Y. R. & Dubruille, J. H. Timing of loading and effect of micromotion on bone-dental implant interface. *Journal of biomedical materials research* 43, 192–203, doi:10.1002/(SICI)1097-4636(199822)43:2<192::AID-IBM14>3.0.CO:2-K (1998).
- 17. Wazen, R. M. *et al.* Micromotion-induced strain fields influence early stages of repair at bone-implant interfaces. *Acta biomaterialia* **9**, 6663–6674, https://doi.org/10.1016/j.actbio.2013.01.014 (2013).
- 18. Lin, D., Li, Q., Li, W. & Swain, M. Dental implant induced bone remodeling and associated algorithms. *Journal of the mechanical behavior of biomedical materials* 2, 410–432, https://doi.org/10.1016/j.jmbbm.2008.11.007 (2009).
- 19. Duyck, J. et al. The influence of micro-motion on the tissue differentiation around immediately loaded cylindrical turned titanium implants. Archives of oral biology 51, 1–9, https://doi.org/10.1016/j.archoralbio.2005.04.003 (2006).
- 20. Grandi, T., Guazzi, P., Samarani, R. & Grandi, G. Clinical outcome and bone healing of implants placed with high insertion torque: 12-month results from a multicenter controlled cohort study. *International journal of oral and maxillofacial surgery* 42, 516–520, https://doi.org/10.1016/j.ijom.2012.10.013 (2013).
- 21. Cha, J. Y. et al. Multiscale analyses of the bone-implant interface. Journal of Dental Research 94, 482-490, https://doi.org/10.1177/0022034514566029 (2015).
- Vanegas-Acosta, J. & Garzón-Alvarado, D. A finite element method approach for the mechanobiological modeling of the
 osseointegration of a dental implant. Computer Methods and Programs in Biomedicine 101, 297–314, https://doi.org/10.1016/j.
 cmpb.2010.11.007 (2011).
- 23. Lacroix, D. & Prendergast, P. A mechano-regulation model for tissue differentiation during fracture healing: analysis of gap size and loading. *Journal of biomechanics* 35, 1163–1171, https://doi.org/10.1016/S0021-9290(02)00086-6 (2002).
- 24. Crupi, V., Guglielmino, E., La Rosa, G., Vander Sloten, J. & Van Oosterwyck, H. Numerical analysis of bone adaptation around an oral implant due to overload stress. *Proceedings of the Institution of Mechanical Engineers, Part H: Journal of Engineering in Medicine* 218, 407–415, https://doi.org/10.1243/0954411042632171 (2004).
- Shefelbine, S. J., Augat, P., Claes, L. & Simon, U. Trabecular bone fracture healing simulation with finite element analysis and fuzzy logic. *Journal of biomechanics* 38, 2440–2450, https://doi.org/10.1016/j.jbiomech.2004.10.019 (2005).
- Li, J. et al. A mathematical model for simulating the bone remodeling process under mechanical stimulus. Dental Materials 23, 1073–1078, https://doi.org/10.1016/j.dental.2006.10.004 (2007).
- 27. Chou, H. Y., Jagodnik, J. J. & Muftu, S. Predictions of bone remodeling around dental implant systems. *Journal of biomechanics* 41, 1365–1373, https://doi.org/10.1016/j.jbiomech.2008.01.032 (2008).
- 28. Chou, H.-Y., Romanos, G., Müftü, A. & Müftü, S. Peri-implant bone remodeling around an extraction socket: predictions of bone maintenance by finite element method. *The International Journal of Oral & Maxillofacial Implants* 27, e39–48 (2012).
- Chou, H. Y. & Muftu, S. Simulation of peri-implant bone healing due to immediate loading in dental implant treatments. *Journal of biomechanics* 46, 871–878, https://doi.org/10.1016/j.jbiomech.2012.12.023 (2013).
- 30. Irandoust, S. & Muftu, S. In Northeast Bioengineering Conference (NEBEC), 2014 40th Annual. 1-2 (IEEE, 2014).
- 31. Irandoust, S. & Muftu, S. In Biomedical Engineering Conference (NEBEC), 2015 41st Annual Northeast. 1-2 (IEEE).
- 32. Chou, H.-Y. & Müftü, S. Corrigendum to a Simulation of peri-implant bone healing due to immediate loading in dental implant treatments" [J. Biomech. 46/5 (2013) 871–878]. *Journal of biomechanics* 49, 2000–2005, https://doi.org/10.1016/j.jbiomech.2016.04.014 (2016).
- Limbert, G. et al. Trabecular bone strains around a dental implant and associated micromotions–a micro-CT-based threedimensional finite element study. *Journal of biomechanics* 43, 1251–1261, https://doi.org/10.1016/j.jbiomech.2010.01.003 (2010).
- Sagara, M., Akagawa, Y., Nikai, H. & Tsuru, H. The effects of early occlusal loading on one-stage titanium alloy implants in beagle dogs: a pilot study. The Journal of Prosthetic Dentistry 69, 281–288, https://doi.org/10.1016/0022-3913(93)90107-Y (1993).
- 35. Piattelli, A., Corigliano, M., Scarano, A., Costigliola, G. & Paolantonio, M. Immediate loading of titanium plasma-sprayed implants: an histologic analysis in monkeys. *Journal of periodontology* **69**, 321–327, https://doi.org/10.1902/jop.1998.69.3.321 (1998).
- 36. Henry, P. J., Tan, A., Leavy, J., Johansson, C. B. & Albrektsson, T. Tissue regeneration in bony defects adjacent to immediately loaded titanium implants placed into extraction sockets: a study in dogs. *The International Journal of Oral & Maxillofacial Implants* 12, 758–766 (1996).
- 37. Meyer, U., Vollmer, D., Runte, C., Bourauel, C. & Joos, U. Bone loading pattern around implants in average and atrophic edentulous maxillae: a finite-element analysis. *Journal of Cranio-Maxillofacial Surgery* 29, 100–105, https://doi.org/10.1054/jcms.2001.0198 (2001).
- 38. Brunski, J. B. The influence of force, motion and related quantities on the response of bone to implants. *Non-Cemented Total Hip Arthroplasty* **43** (1988).

- 39. Søballe, K., Hansen, E. S., B-Rasmussen, H., Jørgensen, P. H. & Bünger, C. Tissue ingrowth into titanium and hydroxyapatite-coated implants during stable and unstable mechanical conditions. *Journal of Orthopaedic Research* 10, 285–299, https://doi.org/10.1002/jor.1100100216 (1992).
- 40. Wang, H. F. Theory of linear poroelasticity with applications to geomechanics and hydrogeology. (Princeton University Press, 2017).
- 41. Ghiasi, M. S., Chen, J., Vaziri, A., Rodriguez, E. K. & Nazarian, A. Bone fracture healing in mechanobiological modeling: A review of principles and methods. *Bone Reports* 6, 87–100, https://doi.org/10.1016/j.bonr.2017.03.002 (2017).
- 42. Shabbir, A., Cox, A., Rodriguez-Menocal, L., Salgado, M. & Badiavas, E. V. Mesenchymal Stem Cell Exosomes Induce Proliferation and Migration of Normal and Chronic Wound Fibroblasts, and Enhance Angiogenesis *In Vitro. Stem Cells and Development.* https://doi.org/10.1089/scd.2014.0316 (2015).
- 43. Einhorn, T. A. The cell and molecular biology of fracture healing. Clinical Orthopaedics and Related Research 355, S7-S21 (1998).
- 44. Dimitriou, R., Tsiridis, E. & Giannoudis, P. V. Current concepts of molecular aspects of bone healing. *Injury* 36, 1392–1404, https://doi.org/10.1016/j.injury.2005.07.019 (2005).
- 45. Nakamizo, A. et al. Human bone marrow-derived mesenchymal stem cells in the treatment of gliomas. Cancer Research 65, 3307-3318, https://doi.org/10.1158/0008-5472.CAN-04-1874 (2005).
- 46. Huiskes, R., Van Driel, W., Prendergast, P. & Søballe, K. A biomechanical regulatory model for periprosthetic fibrous-tissue differentiation. *Journal of Materials Science: Materials in Medicine* 8, 785–788, https://doi.org/10.1023/A:1018520914512 (1997).
- Prendergast, P., Huiskes, R. & Søballe, K. Biophysical stimuli on cells during tissue differentiation at implant interfaces. *Journal of biomechanics* 30, 539–548, https://doi.org/10.1016/S0021-9290(96)00140-6 (1997).
- 48. Ghiasi, M. S., Chen, J. E., Rodriguez, E. K., Vaziri, A. & Nazarian, A. Computational Modeling of the Effects of Inflammatory Response and Granulation Tissue Properties on Human Bone Fracture Healing, arXiv preprint arXiv:1808.04458 (2018).
- 49. Carter, D. R. & Beaupré, G. S. In Skeletal function and form: mechanobiology of skeletal development, aging, and regeneration 138-160 (Cambridge University Press, 2007).
- 50. Cowin, S. C. & Van Buskirk, W. Surface bone remodeling induced by a medullary pin. *Journal of biomechanics* 12, 269–276, https://doi.org/10.1016/0021-9290(79)90069-1 (1979).
- 51. Cowin, S. & Van Buskirk, W. Internal bone remodeling induced by a medullary pin. *Journal of biomechanics* 11, 269–275, https://doi.org/10.1016/0021-9290(78)90053-2 (1978).
- 52. Pereira, A. F., Javaheri, B., Pitsillides, A. & Shefelbine, S. Predicting cortical bone adaptation to axial loading in the mouse tibia. *Journal of the Royal Society Interface* 12, 20150590, https://doi.org/10.1098/rsif.2015.0590 (2015).
- 53. Beaupré, G., Orr, T. & Carter, D. An approach for time-dependent bone modeling and remodeling—theoretical development. *Journal of Orthopaedic Research* 8, 651–661, https://doi.org/10.1002/jor.1100080506 (1990).
- 54. Whalen, R. T., Carter, D. R. & Steele, C. R. Influence of physical activity on the regulation of bone density. *Journal of biomechanics* 21, 825–837 (1988).

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Author contributions

Both authors conceived of the study and contributed to the writing. SI developed the computational algorithms and produced the results.

Competing interests

The authors declare no competing interests.

Additional information

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