scientific reports

Check for updates

OPEN A numerical investigation of changes in lens shape during accommodation

I. Cabeza-Gil¹, J. Grasa^{1,2} & B. Calvo^{1,2}

The purpose of this study was to investigate how the mechanical properties and geometry of the lens influence the changes in lens shape during accommodation. To do so, ex vivo stretching tests of the isolated lens were simulated via finite element analysis. In these tests, the lens is stretched from the accommodated state to the non-accommodated state. Several key characteristics of the lens were studied: the stiffness gradient of the lens material, the distribution of the capsule thickness, the mechanical properties of the capsule and the material comprising the lens, nucleus and cortex, and the influence of two different age-related lens geometries (17 and 29 y/o subjects). To determine the effects on the changes in lens shape during accommodation, changes in the anterior and posterior radius, the lens and nucleus thicknesses and the equatorial lens diameter were analysed. The results suggest that multiple factors exert statistically significant influences on how the lens changes its shape, but two factors predominate over the rest: the stiffness ratio between the nucleus and cortex and the stiffness of the capsule, specifically the posterior surface.

The restoration of dynamic accommodation in presbyopic eyes and in the context of cataracts has not yet been successfully achieved¹. So far, the most widespread solution has been the use of accommodating intraocular lenses; however, their development remains in progress as the restoration of dynamic accommodation is not yet fully achieved^{2,3}. One of the main difficulties in the development of novel ophthalmologic solutions to restore dynamic accommodation is the absence of quality explanations of the biomechanical process of accommodation. On this basis, we hypothesise that numerical methods could help the research community and manufacturers to find better solutions by providing fundamental knowledge of this phenomena.

To the best of our knowledge, several authors have designed finite element (FE) models to explain and understand some aspects of the accommodation process following Helmholtz's accommodation theory. Burd et al.⁴ designed an axisymmetric model for different ages in an attempt to observe some of the features of presbyopia. Other authors followed the same criteria, using 3D modelling to measure the forces applied by the zonules and the focal changes of the lens⁵⁻⁷. Lanchares et al.⁸ reproduced the compliance of the materials by a hyperelastic model, and recently, Wang et al.⁹⁻¹¹ studied both the focal changes of the lens for different age-related properties and the effects of zonular union.

In more detail, those FE models tried to replicate isolated ex vivo stretching tests of the crystalline lens¹²⁻¹⁶. These experimental protocol tests were performed on post-mortem human and monkey lenses and reported the dynamic optical and biometric changes of the lenses.

The dynamic changes in the anterior and posterior radii of curvature, lens thickness and lens diameter vary slightly upon accommodation depending on the type of hominid and the age of the subject^{13,14,17,18}. Therefore, our hypothesis is that the main dynamic biometric changes in hominids depend on lens material properties and geometry, both of which in turn depend on age.

For this reason, to achieve a better understanding of the focal change of the lens during accommodation, the purpose of this study is to shed light on how the lens changes its shape depending on the lens mechanical properties and lens geometry for young subjects using finite element analysis (FEA). To do so, the effects of the mechanical properties of the capsule and the material comprising the lens, nucleus and cortex, on the changes in lens shape were evaluated together with two age-related geometries. Contrary to other FE studies, we attempted to completely describe the changes in lens shape by measuring the changes in anterior and posterior radii, lens and nucleus thicknesses and the equatorial lens diameter.

¹Aragón Institute of Engineering Research (i3A), University of Zaragoza, Mariano Esquillor s/n, Zaragoza 50018, Spain. ²Centro de Investigación Biomédica en Red en Bioingenieria, Biomateriales y Nanomedicina (CIBER-BBN), Zaragoza, Spain. [™]email: iulen@unizar.es



Figure 1. The dimensions of the 17-year-old (**a**) and 29-year-old (**b**) lens geometry. The nucleus is depicted in light grey, whilst the cortex is in dark grey. A plane (**c**) and profile (**d**) view of the FE model for the 29 y/o subject is presented. Zonules and part of the ciliary body ring are depicted in blue and red, respectively.

.....

Due to its complexity, this study also helps to identify the lens material properties in order to determine them experimentally. Burd et al.¹⁹ reported that the spinning lens measurements of Fischer²⁰ might not be reliable, and since then, few studies pertaining to the internal lens mechanical properties have been performed without individually characterising the mechanical properties of the lens nucleus and cortex^{21,22,23}.

To provide a more accurate approach, the effects of two key lens mechanical aspects on accommodation were previously studied. On the one hand, the lens stiffness gradient was analysed because there is an evidence that the morphological shape of the lens forms a gradient of refractive index (GRIN) and stiffness²²⁻²⁵. On the other hand, the distribution of the capsule thickness was studied as the lens capsule thickness varies along the lens location^{26,27}.

The paper is organised as follows. First, the FE model, together the stretching test, is described in "Methods"; then, the case studies analysed in this research are explained. After that, the results are presented sequently as in "Case studies" section to be finally discussed in the last section.

Methods

The lens geometries of 17 and 29 y/o subjects, the material approach for each tissue and the mesh structure are described in "FE model" section. Then, the lens stretching test simulated in this study is presented in "Analysis procedure" section. Lastly, the case studies are described, which includes the influences of the lens stiffness gradient and the distribution of the capsule thickness on the ability of the lens to change its shape. Both studies were initially performed for the 29 y/o lens geometry. Once both effects were numerically analysed, the lens mechanical properties for two different geometries corresponding to two different ages (17 and 29 y/o) were analysed following the design of experiments (DoE) methodology with a full factorial design²⁸.

FE model. The lens geometries were generated according to various studies for isolated lenses as a function of age. The anterior and posterior curvature radii were extracted from Borja et al.²⁹, whilst the lens thickness and diameter were based on the study by Martinez-Enriquez et al.³⁰ For both geometries, the anterior and posterior thickness values of the cortex were 0.80 mm and 0.50 mm, respectively, assuming that hardly any change in the cortex thickness occurs upon accommodation^{31,32}. Radii of curvature of the anterior and posterior surfaces of 4.00 and 3.25 mm, respectively, were considered^{32,33}. Zonules were anchored 0.50 mm in the anterior capsule and in the lens equatorial diameter according to the study by Bernal et al.³⁴. The zonules emerged from the apex area of the ciliary body. Figure 1a,b summarises the lens dimensions for both 17 and 29 y/o subjects.

Abaqus v.14.1 was chosen as the software suite for the FEA. An axisymmetric FE model was designed to perform the lens stretching tests. A mesh sensitivity analysis was previously performed in order to establish the final mesh size; see Fig. 1c,d. The lens nucleus and cortex were considered solid bodies and were meshed with 4672 4-node bilinear axisymmetric quadrilateral hybrid elements (CAX4H); the capsule was meshed with 203 2-node linear axisymmetric membrane elements (MAX1); 10 zonules were modelled using Abaqus connector elements; and the ciliary body was meshed with 231 CAX4H elements. The lens material was modelled with an incompressible linear elastic behaviour (E=f(r, z), $\nu = 0.5$). The lens capsule was modelled via membrane elements, assuming a state of tensile stress without allowing any bending or transverse shear stiffness. In turn, the mechanical properties of the anterior and posterior lens capsule were modelled individually according to the study of Krag and Andreassen^{35,36}, who reported different mechanical properties for both surfaces.

The zonules were modelled with linear connector elements. These elements were characterised by means of a force-displacement equation:

F

$$(u) = ku, (1)$$

with k = 100 mN/mm and u representing the displacement in the direction of the zonule (element)³⁷. No compression was considered.

Analysis procedure. The experimental lens stretching tests^{13,14} were simulated via FEA. These tests attempt to reproduce the relaxation of the ciliary muscle, adjusting the focal length from the near to the far vision state. Therefore, the reference configuration of our FE model corresponds to the accommodated geometry (near state vision), where a stress-free state of both zonules and lens can be considered. To simulate the relaxation of the ciliary muscle, in all cases of the study, a radial displacement of 0.50 mm in the whole ciliary body ring was imposed, isolating the effect of the stretching process in the lens; see Fig. 1d.

During the simulation, all dynamic optical and biometric lens measurements were evaluated in each time increment. For that purpose, the displacements of the nodes of the lens contour were registered by an URDFIL Abaqus subroutine and post-processed with MATLAB R2020b. To measure the lens power, the thick lens formula was used:

$$L_P = (n_L - n_a) \left[\frac{1}{r_a} - \frac{1}{r_p} + \frac{L_T (n_L - n_a)}{r_p r_a n_L} \right],$$
(2)

where $n_a = 1.336$ represents the refractive index of the aqueous humour and $n_L = 1.42$ is the estimated equivalent refractive index of the lens²⁵. The remaining biometric terms, r_a , r_p and L_T , defined in Fig. 1a,b, vary throughout the simulation. The radii of curvature throughout the stretching process were calculated through an equation for a conic section with apex at the origin and tangent to the y-axis.

$$y^2 - 2rx + (k+1)x^2 = 0.$$
 (3)

To obtain the corresponding radius (*r*) and the conic constant (*K*), a nonlinear system of equations formed by the coordinates of the nodes (*x*, *y*) was solved. The goodness of the fit was confirmed, with $R^2 > 99\%$. Note that the change in the lens power (ΔL_P) obtained is negative because the lens power decreases with this stretching process.

Case studies. Evaluation of the lens stiffness gradient. The lens nucleus and cortex are widely modelled in the literature with homogeneous material behaviour^{4,7,8}. However, it has been reported that the stiffness varies within the lens according to its morphological shape^{21,22}. Weeber et al.²² reported that the lens shear modulus (*G*) varies with location, showing a maximum value at a distance of 2.5–3.0 mm from the centre of the lens in young eyes. Weeber et al.⁶ modelled three different cases of age-related lenses with stiffness gradients; however, the mechanical influence of having or not having a stiffness gradient was not analysed. Thus, to evaluate whether the stiffness gradient ($\nabla E(r, z)$, with E(r, z) representing the elastic modulus) has a significant mechanical influence on the ability of the lens to change its shape, an exhaustive analysis with multiple scenarios of the stiffness gradient in the lens was performed.

To do so, we designed a stiffness gradient (E = f(FV)) as a function of the location, creating a field variable FV to attempt to reproduce the actual lens layered structure³⁸; see Fig. 2a. FV measures the perpendicular absolute distance (mm) between a point in the lens and the anterior or posterior radius of the lens nucleus according to the region in which the point is located (anterior or posterior, separated by the lens equator). As observed in Fig. 2a, FV is 0.00 mm in the anterior and posterior radii of the lens nucleus and reaches its maximum of 1.40 mm in the equatorial lens diameter and in the centre of the lens.

Based on the studies by Weebet et al.²² and Wilde et al.²³, and considering that the stress–strain relationship $E = 3G, G, E_{cortex} = 3.00$ kPa and $E_{nucleus} = 0.30$ kPa were calculated as a reference scenario²³; see case #HC in Fig. 2, E = f(FV). The first gradient (#A) was derived from Weeber's²² measurements for a 30 y/o subject (scaled to fit scenario #HC); see Fig. 2, $E = 3.00, ^{22}, FV > 1.10, ^{20,31}, 2$,

In all analyses, the elastic modulus of the anterior capsule was E = 1.00 MPa, and that of the posterior capsule was E = 0.70 MPa. The distribution of capsule thickness reported by Fincham²⁶ is shown by the black line in Fig. 3, where the 29 y/o lens geometry was considered.

Evaluation of the distribution of the lens capsule thickness. Fincham²⁶ and Barraquer et al.²⁷ reported five different distributions of the capsule thickness. However, the mechanical influence of this factor has not yet been numerically evaluated. For this reason, five experimental distributions of the capsule thickness were analysed:



Figure 2. (a) FV variable which measures the absolute perpendicular distance from a point in the lens to the anterior or posterior radius of the lens nucleus. (b) E = f(FV) for the seven different scenarios analysed. The values of elastic modulus *E* within the lens for scenarios #A and #F are depicted in (c) and (d), respectively.

two of them are reported by Fincham²⁶ and indicated by the black and grey dashed lines in Fig. 3, and three different distributions according to different ages of 36, 65 and 92 years are reported by Barraquer et al.²⁷. For this study, the elastic modulus of the anterior capsule was 1.00 MPa, and that of the posterior capsule was 0.70 MPa. The nucleus and cortex were considered homogeneous, with $E_{cortex} = 3.00$ kPa and $E_{nucleus} = 0.30$ kPa. All analyses were calculated for the 29 y/o lens geometry.

Moreover, to help extract and isolate the effects of the lens capsule on the focal changes of the lens, three different uniform thicknesses of 7, 13 and $20 \,\mu$ m, with the same elastic modulus for the entire lens capsule, E = 1.00 MPa, were analysed and compared.

Evaluation of the lens mechanical properties and geometry. Considering the elastic modulus values of the lens tissues (nucleus, cortex and capsule) to be homogeneous, a full factorial design was performed to analyse the effect of its magnitude on the ability of the lens to change its shape, i.e., the change in lens power (ΔL_P – dioptres (D)), the change in lens thickness due to the nucleus ($\frac{\Delta L_T}{\Delta L_P}$ – %), the anterior and posterior radii of curvature ($\frac{\Delta r_a}{\Delta L_P}$ and $\frac{\Delta r_p}{\Delta L_P}$ – mm/D) and the lens thickness and diameter ($\frac{\Delta L_T}{\Delta L_P}$ and $\frac{\Delta \emptyset_L}{\Delta L_P}$ – mm/D). To do so, following the DoE methodology used in our previous work analysing the design of intraocular lenses (IOLs)^{28,39}, a full factorial design with four factors (the elastic modulus values of the nucleus, cortex and anterior and posterior capsule) and five levels, i.e., 4⁵ = 625, was performed. The minimum and maximum level for the mechanical properties of the lens capsule and lens nucleus and cortex were obtained from literature^{20–22,35,36}. Table 1 presents the elastic modulus levels of the factors analysed.

Furthermore, to observe the influence of the geometry, the analysis was performed for two lens geometries depending on age (17 and 29 $y/o^{29,30}$), resulting in $625 \cdot 2 = 1250$ simulations. For these analyses, the distribution of the capsule thickness reported by Fincham²⁶, indicated by the black line in Fig. 3, was considered.

Results

In this section, the influences of the lens stiffness gradient is explained first. Then, the distribution of the capsule thickness on the ability of the lens to change its shape is analysed. Once both effects are numerically analysed, the lens mechanical properties for two different geometries corresponding to two different ages (17 and 29 y/o)



Figure 3. Five different cases of capsule thickness distribution (μ m) as a function of the standardised capsule perimeter. An outline for understanding standardisation is attached. *The mean values were obtained with the first and third row data from Table VII—thickness of lens capsule from Fincham²⁶. The second row data of this table were discarded due to notable differences with the other data.

	Elastic mo	Elastic modulus (kPa)							
Factors	L1	L2	L3	L4	L5				
Anterior capsule	100	300	500	700	1000				
Posterior capsule	100	300	500	700	900				
Cortex	0.75	1.50	2.25	3.00	3.75				
Nucleus	0.10	0.20	0.30	0.40	0.50				

Table 1. Material properties for the different levels (L) of the DoE. Four factors and five levels were considered for two different geometries according to age (17 and 29 y/o).

are analysed following the design of experiments (DoE) methodology with a full factorial design²⁸. To evaluate the ability of the lens to change its shape, the results are presented as a ratio between the variation of each biometric term and the change in lens power, i.e., the following ratios: $\frac{\Delta r_a}{\Delta L_p}, \frac{\Delta r_p}{\Delta L_p}$ and $\frac{\Delta \varnothing_L}{\Delta L_p}$. This was possible to perform because all analyses followed a linear response. Additionally, the maximum change in lens power (ΔL_P) and the percentage of variation in the lens thickness due to the nucleus ($\frac{\Delta L_N}{\Delta L_T}$) were registered. All ratios and the maximum change in lens power represented in absolute values. Therefore, a higher ratio between the anterior and posterior radius values ($\frac{\Delta r_a}{\Delta L_P}, \frac{\Delta r_p}{\Delta L_P}, \frac{\Delta r_p}{\Delta L_P}, \frac{\Delta r_p}{\Delta L_P}$) indicates a greater effect of the corresponding parameter on the focal change of the lens. Note that the ratios $\frac{\Delta r_p}{\Delta L_P}$ can not be compared faithfully between them as their initial value is different and thus their absolute change affects differently in Eq. (2).

Influence of the lens stiffness gradient. Figure 4a,b show the influence of the stiffness gradient on the dynamic optical and biometric lens measurements for the 29 y/o lens geometry. There is a notable difference between the homogeneous materials (nucleus and cortex) scenario #HC and scenario #A, especially in terms of the ΔL_P , 2.26 against 1.95 D, an increase of 16 %. This is mainly produced by the Δr_P , which is 0.17 mm in scenario #HC against 0.03 mm for scenario #A, implying a disaccommodation amplitude of 0.42 D more for scenario #HC in the posterior surface term of Eq. (2). Although the change in the anterior surface is the main factor accountable for lens accommodation, Δr_a was similar for both scenarios, 1.71 and 1.83 mm for scenario #AC and #A, respectively, which implied a disaccommodation amplitude of only 0.11 D more for scenario #A.

This difference in ΔL_P could be explained by an underestimation of the stiffness gradient. After all, the cortex and nucleus were not differentiated in the experimental study by Weeber et al.²². Thus, we designed four lens stiffness gradient scenarios with two different approaches (#B, #C, #E and #F). For all four scenarios, the results were similar to the homogeneous scenario (#HC) with uniform stiffness in the nucleus and cortex. Surprisingly, when the stiffness gradient starts in the nucleus (#C), the results are almost identical to those of the scenario with uniform stiffness (#HC).

Last, there was hardly any difference between scenarios #A and #D, which indicated the lower influence of the elastic modulus on the equatorial lens diameter. All analyses are summarised in Table 2.

Influence of the lens capsule thickness. The influence of the distribution of the capsule thickness for the five cases analysed is shown in Fig. 4c,d. There is a statistically significant difference ($p_{value} < 0.05$) between



Figure 4. Change in the main biometric parameters of the lens for different case studies according to the focal change of the lens: anterior and posterior radius (**a**,**c**,**e**) and lens thickness and diameter (**b**,**d**,**f**). (**a**) and (**b**) depict the results for all stiffness gradient scenarios described in "Evaluation of the lens stiffness gradient" section; (**c**) and (**d**), the results for the five experimental distributions of the lens capsule thickness shown in Fig. 3; (**e**) and (**f**), the results for different uniform lens capsule thickness together with the reference scenario (#HC). All calculations were performed for the 29 y/o lens geometry and summarised in Table 2.

	Factors				Change in the lens shape						
Scenario (section)	СТ	AC (MPa)	PC (MPa)	LC (kPa)	LN (kPa)	$\Delta L_P(\mathbf{D})$	$\frac{\Delta L_N}{\Delta L_T}$ (%)	$\frac{\Delta r_a}{\Delta L_P} (\mathrm{mm/D})$	$\frac{\Delta r_p}{\Delta L_P} (\mathrm{mm/D}) 10^{-2}$	$\frac{\Delta L_T}{\Delta L_P}$ (mm/D) 10 ⁻²	$\frac{\Delta \varnothing_L}{\Delta L_P} (\text{mm/D}) 10^{-2}$
#HC, F-1 (G,T,TH)	F1	1.00	0.70	3.00	0.30	2.26	75.84	0.76	7.62	11.19	8.85
#A (G)	F1	1.00	0.70	E(FV)	E(FV)	1.95	71.45	0.94	2.04	13.63	10.50
#B (G)	F1	1.00	0.70	E(FV)	E(FV)	2.26	73.45	0.83	5.67	11.48	9.21
#C (G)	F1	1.00	0.70	E(FV)	E(FV)	2.23	74.99	0.75	7.73	11.48	8.75
#D (G)	F1	1.00	0.70	E(FV)	E(FV)	1.99	71.83	0.94	2.12	13.28	10.46
#E (G)	F1	1.00	0.70	E(FV)	E(FV)	2.11	73.65	0.86	4.63	12.39	9.67
#F (G)	F1	1.00	0.70	E(FV)	E(FV)	2.23	74.56	0.79	6.60	11.60	9.11
#F-2 (T)		1.00	0.70	3.00	0.30	2.13	75.81	0.78	6.80	11.98	9.21
#B-36y (T)		1.00	0.70	3.00	0.30	3.18	78.42	0.70	11.01	9.11	7.87
#B-65y (T)		1.00	0.70	3.00	0.30	3.32	80.25	0.67	11.94	8.73	7.73
#B-92y (T)		1.00	0.70	3.00	0.30	3.34	81.76	0.66	12.55	8.63	7.71
#7 μm (UT)		1.00	1.00	3.00	0.30	3.06	78.17	0.66	11.80	9.50	7.93
#10 µm (UT)		1.00	1.00	3.00	0.30	2.34	78.55	0.67	10.42	10.48	8.42
#20 µm (UT)		1.00	1.00	3.00	0.30	1.84	79.32	0.67	9.34	11.49	8.95
#7 µm* (UT)		1.00	0.70	3.00	0.30	3.40	78.84	0.65	12.77	8.76	7.68

Table 2. The results for the corresponding scenario, together with the corresponding section to which it belongs, gradient (G), thickness (T) or uniform thickness (UT), is described. The corresponding factor for each scenario is described: the distribution of the capsule thickness (CT) for the gradient section. In turn, the section thickness describes itself, as do the Young's modulus values of the anterior capsule (AC), posterior capsule (PC), lens cortex (LC) and lens nucleus (LN). Furthermore, the registered lens biometric measurements are presented: the maximum change in lens power (ΔL_P), the variation in the lens thickness of the nucleus ($\frac{\Delta L_N}{\Delta L_T}$) and the following ratios: $\frac{\Delta r_a}{\Delta L_P}, \frac{\Delta L_T}{\Delta L_P}, \frac{\Delta L_T}{\Delta L_P}$.

the ratios obtained for all biometric terms with respect to the simulations performed with the distributions of the capsule thickness reported by Fincham²⁶ and Barraquer et al.²⁷.

The results obtained with the capsule thickness distribution reported by Barraquer et al.²⁷ (referred to as Barraquer's group hereinafter) presented a larger average change in lens power, 3.27 D against 2.18 D. For Barraquer's²⁷ group, a higher ratio in the posterior radius of curvature was presented, with an average value $(\frac{\Delta \overline{r_p}}{\Delta L_p})$ of 11.80 \cdot 10⁻² against 7.24 \cdot 10⁻² mm/D for those obtained with the capsule thickness distribution reported by Fincham²⁶ (referred to as Fincham's group hereinafter). As a consequence, a lower ratio in the anterior radius was obtained, with an average value $(\frac{\Delta \overline{r_a}}{\Delta L_p})$ of 0.68 against 0.77 mm/D.

FINCHAM⁻⁻ (referred to as Finchams group hereinatter). As a consequence, a lower ratio in the anterior radius was obtained, with an average value $(\frac{\Delta T_a}{\Delta L_P})$ of 0.68 against 0.77 mm/D. The results for Barraquer's²⁷ group presented a lower ratio of lens thickness and diameter, with average values $(\frac{\Delta L_T}{\Delta L_P}, \frac{\Delta \overline{\varnothing}_L}{\Delta L_P})$ of 7.78 \cdot 10⁻² and 8.82 \cdot 10⁻² mm/D, whereas for Fincham's group, average values $(\frac{\Delta L_T}{\Delta L_P}, \frac{\Delta \overline{\varnothing}_L}{\Delta L_P})$ of 9.05 \cdot 10⁻² and 11.53 \cdot 10⁻² mm/D were obtained, respectively. Moreover, the variation in lens nucleus with the change in lens thickness $(\frac{\Delta L_N}{\Delta L_T})$ was 80.14% as determined by Barraquer's group, in comparison with 75.82% for Fincham's²⁶.

Regarding the case of a uniform capsule thickness, when the thickness is lower, the posterior radius of curvature exerts greater influence on the focal change of the lens, as displayed in Fig. 4e. The thinnest thickness (#7 μ m) of the lens capsule presented the highest lens focal change of 3.06 D, in comparison with 1.84 D for the thickest thickness (#20 μ m). Regarding the changes in lens thickness and diameter, as shown in Fig. 4f, the lower the uniform thickness is, the lower the ratio of the lens thickness and diameter. For the thinnest thickness (#7 μ m), $\frac{\Delta L_T}{\Delta L_P}$ and $\frac{\Delta \mathcal{B}_L}{\Delta L_P}$ of 9.50 \cdot 10⁻² and 7.93 \cdot 10⁻² mm/D were obtained, respectively, whilst for the thickest thickness (#20 μ m), $\frac{\Delta L_L}{\Delta L_P}$ and $\frac{\Delta \mathcal{B}_L}{\Delta L_P}$ of 11.49 \cdot 10⁻² and 8.95 \cdot 10⁻² mm/D were obtained, respectively. A similar case as the thinnest thickness (#7 μ m), but with an elastic modulus for the posterior capsule of 0.70 MPa, was also calculated (#7 μ m*), presenting a maximum change in lens power of 3.40 D. Interestingly, all cases present similar $\frac{\Delta L_N}{\Delta L_T}$ ratios of approximately 78%. All analyses are summarised in Table 2.

Influence of the mechanical properties and age-related lens geometry on accommodation. After the 1, 250 simulations, a screening analysis was performed to remove data in which the change of the lens power increases. These cases corresponded to the lowest level of the elastic modulus of the cortex (E = 0.75 kPa) and the highest levels of the nucleus (E = 0.50 kPa) and the posterior capsule (E = 0.90 MPa). This will be explained in the evaluation of the DoE. In total, 115 simulations were removed.

For the remaining simulations, 1, 135, a regression model with $R^2 > 99\%$ was designed for each response $(\Delta L_P, \frac{\Delta L_N}{\Delta L_T}, \frac{\Delta r_e}{\Delta L_P}, \frac{\Delta L_T}{\Delta L_P}, \frac{\Delta L_T}{\Delta L_P}, \frac{\Delta Q}{\Delta L_P})$ to evaluate the biomechanical effects of the factors of the DoE performed (anterior capsule stiffness (AC), posterior capsule stiffness (PC), lens cortex stiffness (LC), lens nucleus stiffness (LN), and lens geometry depending on age (Age)). The statistical model used to describe the results included up to second order terms.

The influence of each factor on the responses analysed was evaluated by means of a Pareto analysis. The change in lens power (ΔL_P) is mostly influenced by the stiffness of the posterior capsule (PC, 42.59%), the lens nucleus





(LN, 28.49%) and the lens cortex (LC, 20.92%); see Fig. 5a. Other responses with respect to the age-related lens geometry were statistically significant, but their influences were lower than the stiffness of the PC, LN and LC.

The age-related lens geometry was the most influential factor (Age, 58.86%) on lens nucleus variation in the total change in lens thickness $(\frac{\Delta L_N}{\Delta L_T})$, as displayed in Fig. 5b, followed by the internal properties of the lens (LC, total charge in lens theckness $(\frac{\Delta L_T}{\Delta L_P})$, as displayed in Fig. 50, followed by the internal properties of the lens (LC, 18.95% and LN, 16.44%). The lens geometry depending on age (Age, 69.98%) was also the most relevant factor to the ratios $\frac{\Delta r_a}{\Delta L_P}$ and $\frac{\Delta r_P}{\Delta L_P}$; see Fig. 5c. As the initial anterior and posterior radii in the 17 y/o lens are lower, their variation produces a greater change in lens power; see Eq. (2). This explains the relevance of the age-related lens geometry to the ratios $\frac{\Delta r_a}{\Delta L_P}$ and $\frac{\Delta r_P}{\Delta L_P}$. A similar trend occurs in the ratios $\frac{\Delta L_T}{\Delta L_P}$ and $\frac{\Delta \varnothing L_T}{\Delta L_P}$; see Fig. 5d,e. The stiffness of the lens cortex is the most influential factor for both responses. To a lesser extent, the posterior capsule and lens nucleus also exert relevant factor influential factor for both responses. To a lesser extent, the posterior capsule and lens nucleus also exert relevant factor influential factor for both responses. To a lesser extent, the posterior capsule and lens nucleus also exert relevant for the response of the response of the relevant factor influential factor for both responses. To a lesser extent, the posterior capsule and lens nucleus also exert relevant influential factor for both responses. To a lesser extent, the posterior capsule and lens nucleus also exert relevant influential factor for both responses. To a lesser extent, the posterior capsule and lens nucleus also exert relevant influential factor for both responses.

influences on both responses. Further analysis based on the Pearson correlation matrix (see Fig. 6) supports these findings.

A stiffer lens cortex produced a greater change in the lens power (ΔL_P); see Fig. 6. Moreover, the posterior capsule and the lens cortex were confirmed to be strongly inversely correlated with the change in lens power. Surprisingly, $\frac{\Delta r_a}{\Delta L_P}$ and $\frac{\Delta r_p}{\Delta L_P}$ presented a high correlation with the posterior capsule, but not with the anterior





capsule, which confirms that the posterior capsule governs the change in lens power. Regarding the change in

capsule, which confirms that the posterior capsule governs the change in lens power. Regarding the change in lens thickness due to the nucleus $(\frac{\Delta L_N}{\Delta L_T})$, the greater the difference in stiffness between the nucleus and cortex, the larger the change in $\frac{\Delta L_N}{\Delta L_T}$ is. For the younger geometry, the $\frac{\Delta L_N}{\Delta L_T}$ was higher. A stiffer posterior capsule produced a higher ratio $\frac{\Delta L_P}{\Delta L_P}$ and a lower ratio $\frac{\Delta r_P}{\Delta L_P}$. As mentioned, the 29 y/o lens (value 1 in Fig. 6) requires a greater change in the anterior and posterior radii to produce the same change in lens power (strong direct correlation with $\frac{\Delta r_A}{\Delta L_P}$ and $\frac{\Delta r_P}{\Delta L_P}$). The stiffness of the lens cortex was strongly inversely correlated with the ratios $\frac{\Delta L_T}{\Delta L_P}$ and $\frac{\Delta \varnothing_L}{\Delta L_P}$, which indicates that a stiffer lens cortex produces a lower change in the ratios $\frac{\Delta L_T}{\Delta L_P}$ and $\frac{\Delta \vartheta_L}{\Delta L_P}$. The posterior capsule and lens nucleus exhibited direct correlation with $\frac{\Delta L_T}{\Delta L_P}$ and $\frac{\Delta \vartheta_L}{\Delta L_P}$ ratio presented a slight direct correlation with the age-related lens geometry. Contrary to this, the $\frac{\Delta \vartheta_L}{\Delta L_P}$ ratio presented the opposite behaviour as described for the $\frac{\Delta L_T}{\Delta L_P}$. Regarding the correlation between the lens biometric terms, there was a strong direct correlation between

Regarding the correlation between the lens biometric terms, there was a strong direct correlation between the change in lens power (ΔL_P) and the $\frac{\Delta r_P}{\Delta L_P}$ ratio, whereas there was a strong inverse correlation between $\frac{\Delta L_T}{\Delta L_P}$, $\frac{L}{p}$ and the change in lens power (ΔL_P) .

 $\frac{\Delta L_p}{\Delta L_p} \text{ and the change in lens power } (\Delta L_p).$ There was an inverse correlation between the $\frac{\Delta r_a}{\Delta L_p}$ and $\frac{\Delta r_p}{\Delta L_p}$ ratios, a strong inverse correlation between $\frac{\Delta r_p}{\Delta L_p}$ and $\frac{\Delta L_T}{\Delta L_p}$ and a strong direct correlation between $\frac{\Delta r_p}{\Delta L_p}$. Main effect and interaction plots were analysed to confirm the consistency of the correlation analysis.

Discussion

The results in this study provide essential data regarding how the crystalline lens changes its shape depending on different lens factors such as the stiffness gradient of the lens^{21,22}, the distribution of the capsule thickness^{26,2} the mechanical properties of the lens nucleus, cortex and anterior and posterior capsules in young subjects^{35,36}, and the influence of two different lens geometries depending on age $(17 \text{ and } 29 \text{ y/o})^{29}$.

The stiffness gradient of the lens was evaluated using different possible scenarios for a young adult subject based on experimental data²². There was a significant difference in the posterior radius response between scenario #A, with a stiffness gradient (see Fig. 4a,b and Table 2), and a scenario with homogeneous materials (scenario #HC). Nevertheless, it is true that the stiffness gradient might be understudied, as the mechanical properties of the nucleus and cortex were not individually characterised due to the high complexity of taking these measurements. When smoothing the stiffness gradient, there was similarity between the results presented (see scenarios #B, #C, #E and #F in Figs. 3a, 4b and Table 2). As observed in the study, the difference in stiffness between the nucleus and cortex is crucial to how the lens changes its shape. The greater the difference is, the more significant the effect of the posterior and anterior surface, and thus the higher the change in lens power, as presented throughout the study. Based on this statement, the ideal case is the scenario with homogeneous materials (#HC), where the difference between the stiffness of the nucleus and cortex is the greatest and most abrupt. Thus, the closer the gradient is to the homogeneous case, the greater the focal change of the lens. Therefore, we consider that the assumption of modelling the nucleus and cortex with homogeneous behaviour is appropriate for a theoretical approach.

Regarding the capsule thickness distribution, five different distributions, divided into Fincham²⁶ and Barraquer et al.²⁷ groups, and four different uniform thicknesses were evaluated. The main difference was that for Barraquer's²⁷ group, there is a decrease in thickness in the posterior capsule, as shown in Fig. 3. This decrease entails a higher lens focus and diminished changes in lens thickness and diameter, mainly produced by the increased changes in the posterior radius and lens nucleus. The trend was confirmed by the homogeneous scenarios; see Table 2. A thinner capsule thickness produces a similar effect to that of a capsule with a lower elastic modulus.

The use of numerical models along with advanced statistical tools (i.e., full factorial analysis) allows the study of the impacts of lens factors (material behaviour of the anterior capsule, posterior capsule, lens cortex and nucleus, and the age-related lens geometry) on the ability of the lens to change its shape (change in lens power (ΔL_P), percentage of the lens nucleus in the change in the lens thickness ($\frac{\Delta L_N}{\Delta L_T}$), and the following ratios which reproduce how the shape of the lens changes: $\frac{\Delta r_a}{\Delta L_P}$, $\frac{\Delta r_P}{\Delta L_P}$, $\frac{\Delta L_T}{\Delta L_P}$, and $\frac{\Delta Q_L}{\Delta L_P}$). Based on the presented results, the mechanical properties of the posterior capsule, lens cortex and lens nucleus are the most important factors affecting the ability of the lens to change its shape. The age-related lens geometry and the stiffness of the anterior capsule were also statistically significant, but their influences were lower.

Individually, the analysed factors differently influenced the ability of the lens to change its shape; see Fig. 6. A greater stiffness in the anterior capsule produced a lower change in lens power. It also presented a weak direct correlation with the lens thickness and a weak inverse correlation with the lens diameter. The posterior capsule presented a strong inverse correlation with the change in lens power and the posterior radius. A stiffer lens cortex implied a greater change in lens power and a higher ratio with respect to the posterior radius. The stiffness of the cortex was strongly inversely correlated with the thickness and diameter ratios. The stiffness of the lens nucleus presented the opposite behaviour as that of the cortex, which confirmed the strong influence of the difference in stiffness between both observations in the elastic gradient section. Furthermore, the screening analysis performed in the DoE where 115 simulations were removed showed that the lens would lose its accommodative properties if the stiffness of the lens nucleus might have presented a weaker correlation than the cortex due to the lower variation in the levels of the DoE performed.

Finally, the 17 y/o lens geometry presented a higher change in lens power. The change in the lens geometry was strongly and directly correlated with the anterior and posterior radius ratios because the changes in the anterior and posterior radii differ depending on the initial values in the accommodated state. A variation in the anterior radius from 6.00 to 8.00 mm does not influence the same focal change as the variation from 8.00 to 10.00 mm; see Eq. (2). Furthermore, the lens thickness ratio was lower in the 29 y/o lens geometry, whilst the lens diameter ratio was larger.

One of the limitations of this study is that contrary to the works of Manns et al.¹³ and Augusteyn et al.¹⁴, the force exerted to stretch the lens could not be compared with experimental data. This result was due to two factors: first, it would have involved the characterisation of all relevant tissues (ciliary body and sclera), and second, the exact geometry involved in these experimental tests. Nevertheless, with the essential data provided in this study, any change in lens shape for any hominid species, including humans, could be reproduced, which validates the model. One weakness is that the study was focused on healthy crystalline lenses (17–29 y/o). It would be interesting to broaden the scope of this research to include pathological eyes, with cataracts or presbyopia, of older adults.

To ease the understanding of the objective of the study, the thick lens formula has been used, see Eq. (2), instead of a GRIN optical model. The authors have checked that the pattern results of the study is the same with a four-surface shell model⁴⁰ and the use of Eq. (2) with an equivalent refractive index. The authors also have checked the consistency of the study observing the change in curvature of the posterior and anterior radius nucleus. Moreover, Van Sompel et al.⁷ also showed for the 29 y/o subject that the relative lens accommodative amplitude appears to be unaltered using an uniform or GRIN optical model. The group will focus on validating a GRIN optical model for the crystalline lens in future investigations.

Unlike other numerical papers that modelled the zonules with few "wires", we have modelled them in order to provide continuity in the displacement field of the lens. Their design was set according to experimental images³⁴. Contrary to other studies, we evaluated the main biometric lens parameters which explain its change in shape $(\frac{\Delta r_a}{\Delta L_P}, \frac{\Delta L_P}{\Delta L_P}, \frac{\Delta \omega_L}{\Delta L_P}, \frac{\Delta \omega_L}{\Delta L_P})$, and interestingly, most simulations prove that the $\frac{\Delta L_N}{\Delta L_T}$ ratio was approximately 80%, as Brown³¹ experimentally reported. Like Van Sompel et al.⁷, we observed that the lens geometry has an important role with respect to the change in lens focus. However, the change in lens focus is overly complex since it depends on so many factors, including capsule thickness, mechanical properties of all parts of the lens, geometry, etc., that it is difficult to highlight one over the others. The situation becomes even more complicated in accommodation, which is produced not only by focal changes of the lens but also by lens movement. This study provides compelling evidence that the stiffness values of the posterior capsule, lens cortex and nucleus are the most influential factors with respect to the ability of the lens to change its shape.

This work has been made possible by the emergence of new quality experimental studies, which enables the design of more complex and realistic numerical models. This study has demonstrated how lens focus is influenced by the main lens mechanical properties, allowing for a slightly improved understanding of the accommodation process. We hope to illuminate the mechanisms of the accommodation field, helping manufacturers and researchers find better solutions for dysfunctional lens conditions such as presbyopia and cataracts. Furthermore, our group will be focused on how presbyopia progresses according to the mechanical properties of age-related lens.

Received: 8 February 2021; Accepted: 22 April 2021 Published online: 05 May 2021

References

- Glasser, A. Restoration of accommodation: Surgical options for correction of presbyopia. *Clin. Exp. Optom.* 91, 279–295. https:// doi.org/10.1111/j.1444-0938.2008.00260.x (2008).
- Alió, J. L., del Barrio, J. L. A. & Vega-Estrada, A. Accommodative intraocular lenses: Where are we and where we are going. *Eye Vis.* 4, 1–12. https://doi.org/10.1186/s40662-017-0077-7 (2017).
- 3. de la Hoz, A. *et al.* Design and ex situ performance of a shape-changing accommodating intraocular lens. *Optica* 6, 1050. https://doi.org/10.1364/optica.6.001050 (2019).
- Burd, H., Judge, S. & Cross, J. Numerical modelling of the accommodating lens. Vis. Res. 42, 2235–2251. https://doi.org/10.1016/ s0042-6989(02)00094-9 (2002).
- Hermans, E., Dubbelman, M., van der Heijde, G. & Heethaar, R. Estimating the external force acting on the human eye lens during accommodation by finite element modelling. *Vis. Res.* 46, 3642–3650. https://doi.org/10.1016/j.visres.2006.04.012 (2006).
- 6. Weeber, H. A. & van der Heijde, R. G. On the relationship between lens stiffness and accommodative amplitude. *Exp. Eye Res.* 85, 602–607. https://doi.org/10.1016/j.exer.2007.07.012 (2007).
- Sompel, D. V., Kunkel, G. J., Hersh, P. S. & Smits, A. J. Model of accommodation: Contributions of lens geometry and mechanical properties to the development of presbyopia. *J. Cataract Refract. Surg.* 36, 1960–1971. https://doi.org/10.1016/j.jcrs.2010.09.001 (2010).
- Lanchares, E., Navarro, R. & Calvo, B. Hyperelastic modelling of the crystalline lens: Accommodation and presbyopia. J. Optom. 5, 110–120. https://doi.org/10.1016/j.optom.2012.05.006 (2012).
- Wang, K., Venetsanos, D., Wang, J. & Pierscionek, B. K. Gradient moduli lens models: How material properties and application of forces can affect deformation and distributions of stress. Sci. Rep. 6, 1-10 (2016).
- Wang, K., Venetsanos, D. T., Wang, J., Augousti, A. T. & Pierscionek, B. K. The importance of parameter choice in modelling dynamics of the eye lens. *Sci. Rep.* 7, 1–12. https://doi.org/10.1038/s41598-017-16854-9 (2017).
- Wang, K. *et al.* A modeling approach for investigating opto-mechanical relationships in the human eye lens. *IEEE Trans. Biomed. Eng.* 67, 999–1006. https://doi.org/10.1109/tbme.2019.2927390 (2020).
- Glasser, A. & Campbell, M. C. Biometric, optical and physical changes in the isolated human crystalline lens with age in relation to presbyopia. Vis. Res. 39, 1991–2015. https://doi.org/10.1016/s0042-6989(98)00283-1 (1999).
- Manns, F. et al. Optomechanical response of human and monkey lenses in a lens stretcher. Investig. Ophthalmol. Vis. Sci. 48, 3260. https://doi.org/10.1167/iovs.06-1376 (2007).
- Augusteyn, R. C. *et al.* Age-dependence of the optomechanical responses of ex vivo human lenses from India and the USA, and the force required to produce these in a lens stretcher: The similarity to in vivo disaccommodation. *Vis. Res.* 51, 1667–1678. https://doi.org/10.1016/j.visres.2011.05.009 (2011).
- Nankivil, D. et al. The zonules selectively alter the shape of the lens during accommodation based on the location of their anchorage points. Investig. Ophthalmol. Vis. Sci. 56, 1751–1760. https://doi.org/10.1167/iovs.14-16082 (2015).
- Michael, R. et al. Deformations and ruptures in human lenses with cortical cataract subjected to ex vivo simulated accommodation. Investig. Ophthalmol. Vis. Sci. 62, 12. https://doi.org/10.1167/iovs.62.1.12 (2021).
- Glasser, A., Wendt, M. & Ostrin, L. Accommodative changes in lens diameter in rhesus monkeys. *Investig. Ophthalmol. Vis. Sci.* 47, 278. https://doi.org/10.1167/iovs.05-0890 (2006).
- Ramasubramanian, V. & Glasser, A. Objective measurement of accommodative biometric changes using ultrasound biomicroscopy. J. Cataract Refract. Surg. 41, 511–526. https://doi.org/10.1016/j.jcrs.2014.08.033 (2015).
- Burd, H., Wilde, G. & Judge, S. Can reliable values of Young's modulus be deduced from Fisher's (1971) spinning lens measurements?. Vis. Res. 46, 1346–1360. https://doi.org/10.1016/j.visres.2005.07.012 (2006).
- 20. Fisher, R. F. Elastic constants of the human lens capsule. J. Physiol. 201, 1-19. https://doi.org/10.1113/jphysiol.1969.sp008739 (1969).
- Heys, K. R., Cram, S. L. & Truscott, R. J. W. Massive increase in the stiffness of the human lens nucleus with age: The basis for presbyopia?. *Mol. Vis.* 10, 956–963 (2004).
- Weeber, H. A., Eckert, G., Pechhold, W. & van der Heijde, R. G. L. Stiffness gradient in the crystalline lens. Graefe's Arch. Clin. Exp. Ophthalmol. 245, 1357–1366. https://doi.org/10.1007/s00417-007-0537-1 (2007).
- Wilde, G.S., Burd, H.J. & Judge, S.J. Shear modulus data for the human lens determined from a spinning lens test. *Exp. Eye Res.* 97(1), 36–48 (2012).
- 24. Maceo, B. M. *et al.* Contribution of the crystalline lens gradient refractive index to the accommodation amplitude in non-human primates: In vitro studies. *J. Vis.* **11**, 23–23. https://doi.org/10.1167/11.13.23 (2011).
- Birkenfeld, J., de Castro, A., Ortiz, S., Pascual, D. & Marcos, S. Contribution of the gradient refractive index and shape to the crystalline lens spherical aberration and astigmatism. *Vis. Res.* 86, 27–34. https://doi.org/10.1016/j.visres.2013.04.004 (2013).
- Fincham, E. F. The changes in the form of the crystalline lens in accommodation. *Trans. Opt. Soc.* 26, 239–269. https://doi.org/10. 1088/1475-4878/26/5/301 (1925).
- Barraquer, R. I., Michael, R., Abreu, R., Lamarca, J. & Tresserra, F. Human lens capsule thickness as a function of age and location along the sagittal lens perimeter. *Investig. Ophthalmol. Vis. Sci.* 47, 2053. https://doi.org/10.1167/iovs.05-1002 (2006).
- 28. Montgomery, D. Design & Analysis of Experiments 5th edn. (Wiley, 2001).
- 29. Borja, D. et al. Optical power of the isolated human crystalline lens. Investig. Ophthalmol. Vis. Sci. 49, 2541. https://doi.org/10. 1167/iovs.07-1385 (2008).
- Martinez-Enriquez, E. et al. Age-related changes to the three-dimensional full shape of the isolated human crystalline lens. *Investig.* Ophthalmol. Vis. Sci. 61, 11. https://doi.org/10.1167/iovs.61.4.11 (2020).
- Brown, N. The change in shape and internal form of the lens of the eye on accommodation. *Exp. Eye Res.* 15, 441–459. https://doi.org/10.1016/0014-4835(73)90136-x (1973).
- 32. Dubbelman, M., der Heijde, G. V., Weeber, H. & Vrensen, G. Changes in the internal structure of the human crystalline lens with age and accommodation. *Vis. Res.* **43**, 2363–2375. https://doi.org/10.1016/s0042-6989(03)00428-0 (2003).
- Hermans, E., Dubbelman, M., van der Heijde, R. & Heethaar, R. The shape of the human lens nucleus with accommodation. J. Vis. 7, 16. https://doi.org/10.1167/7.10.16 (2007).
- Bernal, A., Parel, J.-M. & Manns, F. Evidence for posterior zonular fiber attachment on the anterior hyaloid membrane. *Investig.* Ophthalmol. Vis. Sci. 47, 4708. https://doi.org/10.1167/iovs.06-0441 (2006).
- Krag, S. & Andreassen, T. T. Mechanical properties of the human lens capsule. Prog. Retinal Eye Res. 22, 749–767. https://doi.org/ 10.1016/s1350-9462(03)00063-6 (2003).
- Krag, S. & Andreassen, T. T. Mechanical properties of the human posterior lens capsule. *Investig. Ophthalmol. Vis. Sci.* 44, 691. https://doi.org/10.1167/iovs.02-0096 (2003).
- 37. Michael, R. *et al.* Elastic properties of human lens zonules as a function of age in presbyopes. *Investig. Ophthalmol. Vis. Sci.* 53, 6109. https://doi.org/10.1167/iovs.11-8702 (2012).

- 38. Hoeve, J. V., Nilsson, S. F. E., Wu, S., Kaufman, P. L. & Alm, A. Adler's Physiology of the Eye (Elsevier Health Sciences Division, 2011).
- Cabeza-Gil, I., Ariza-Gracia, M. Á., Remón, L. & Calvo, B. Systematic study on the biomechanical stability of c-loop intraocular lenses: Approach to an optimal design of the haptics. Ann. Biomed. Eng. https://doi.org/10.1007/s10439-019-02432-9 (2019).
- Navarro, R. & López-Gil, N. Impact of internal curvature gradient on the power and accommodation of the crystalline lens. Optica 4, 334–340. https://doi.org/10.1364/OPTICA.4.000334 (2017).

Acknowledgements

We would like to thank Adrian Glasser for the helpful and comprehensive discussions on this project. The authors gratefully acknowledge research support from the Spanish Ministerio de ciencia, innovacion y universidades (Grant DPI2017-84047-R) and the Department of Industry and Innovation (Government of Aragon) through the research group Grant T24-20R (cofinanciado con Feder 2014-2020: Construyendo Europa desde Aragon). Part of the work was performed by the ICTS "NANBIOSIS" specifically by the High Performance Computing Unit (U27), of the CIBER in Bioengineering, Biomaterials & Nanomedicne (CIBER-BBN at the University of Zaragoza). I. Cabeza-Gil was supported by PRE2018-084021.

Author contributions

I.C.G. and B. C. conceived the research. I.C.G. perfomed and analysed the simulations. J.G and B.C. supervised the results. All authors reviewed the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

Correspondence and requests for materials should be addressed to I.C.-G.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2021