

# **Bulging Brains**

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Abstract Brain swelling is a serious condition associated with an accumulation of fluid inside the brain that can be caused by trauma, stroke, infection, or tumors. It increases the pressure inside the skull and reduces blood and oxygen supply. To relieve the intracranial pressure, neurosurgeons remove part of the skull and allow the swollen brain to bulge outward, a procedure known as decompressive craniectomy. Decompressive craniectomy has been preformed for more than a century; yet, its effects on the swollen brain remain poorly understood. Here we characterize the deformation, strain, and stretch in bulging brains using the nonlinear field theories of mechanics. Our study shows that even small swelling volumes of 28 to 56 ml induce maximum principal strains in excess of 30 %. For radially outward-pointing axons, we observe maximal normal stretches of 1.3 deep inside the bulge and maximal tangential stretches of 1.3 around the craniectomy edge. While the stretch magnitude varies with opening site and swelling region, our study suggests that the locations of maximum stretch are universally shared amongst all bulging brains. Our model has the potential to inform neurosurgeons and rationalize the shape and position of the skull opening,

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with the ultimate goal to reduce brain damage and improve the structural and functional outcomes of decompressive craniectomy in trauma patients.

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Einen Druck über einen gewissen Grad und über eine gewisse Zeit hinaus hält das Gehirn nicht aus. Darum ist es stets Pflicht, einen Druck auf das ungefährliche Mass von Intensität und Dauer zu reduciren.

Emil Theodor Kocher [1901]

### 1 Motivation

Under physiological conditions, the mechanical environment of our brain is tightly regulated. The intracranial pressure, for example, lies within a narrow window between 0 and 10 mmHg [18]. An increase in intracranial pressure—most commonly caused by traumatic brain injury, subarachnoid hemorrhage, ischemic stroke or a brain tumor—can be devastating or even fatal: It reduces cerebral perfusion, and limits the supply of metabolites and oxygen [8]. As a method of last resort, neurosurgeons remove part of the skull to allow the swollen brain to bulge outward and facilitate an immediate release of the elevated pressure [27]. This life-saving procedure, known as decompressive craniectomy [35], is typically recommended if the intracranial pressure exceeds 20 mmHg for longer than 30 minutes [25]. While a decompressive craniectomy improves short-term pressure management and survival, its survivors often experience severe long-term disabilities [23]. To date, the precise criteria related to the optimal timing of treatment, the optimal location and size of the skull opening, and the long-term functional outcome remain unclear.

From a mechanical perspective, a decompressive craniectomy is a compromise between maximizing the management of the intracranial pressure and minimizing the deformations induced by the bulging brain [19]. Recent studies have characterized bulge kinematics based on computerized tomography images before and after a decompressive craniectomy using non-linear image registration [44]; yet, little is know about the stress, stretch, and strain inside the brain. While our mechanical intuition tells us that stretch and strain can be reduced by increasing the opening size, a larger opening area is more prone to infection and clinically undesirable [39]. Clinical guidelines suggest opening diameters of about 12 cm [40], but the rationale for this recommendation is rather vague and lacks a clear mechanistic understanding of the bulging process itself.

When aiming to optimize the craniectomy size, it is unclear to which extent the location of the opening influences the stretch and strain profiles across the brain [13]. The most common procedure in clinical practice is a unilateral craniectomy with an opening on either the left or the right lateral skull depending on the side of the swelling [35]. Recent clinical studies have challenged the engineering intuition that a collateral craniectomy with the opening at the site of swelling is less invasive than a contralateral craniectomy with the opening at the opposite, non-injured side [43]. While the opening size for a unilateral craniectomy is anatomically limited, a bilateral craniectomy with a bifrontal opening across both hemispheres provides sufficient anatomic space for large opening sizes [27]. Yet, the precise bulging kinematics for the different types of craniectomy are far from being completely understood.

Mathematical models and computational simulations can provide analytical and numerical insight into the strain, stretch, and stress fields of bulging solids. Using the classic theory of contact mechanics [3, 24], we have recently shown that in the small deformation limit, the bulging problem is conceptually similar to an inverted punch problem [19]. This allows us to solve the bulging problem explicitly for a bulging half-space under plane strain, plane stress, and axisymmetric conditions. The explicit analytical solution for the stress field motivates the introduction of damage drops, drop-shaped zones of high and low shear stress with singularities that scale with the inverse square root of the distance from the opening [45]. Interestingly, the shape of the bulge, the singularities of the stress profile, and the orientation of the drops are generic for all bulging problems and independent of the constitutive model. These characteristic features also agree nicely with computational simulations, both in the linear [12] and in the nonlinear [45] regime. However, it remains unclear how these characteristics evolve in geometries as complex as the human brain. First attempts along these lines have modeled the brain via its convex hull embedded in a rigid skull [16], and shown that shear strains can reach values up to 25 %, even for bulge volumes of only 22 ml [14]. While these numbers clearly highlight the need for a kinematically and constitutively nonlinear formulation, the bulging brain has never been modeled using the nonlinear field theories of mechanics.

Here we introduce a continuum model for bulging brains in the finite deformation setting. We model brain tissue as a swelling, elastically incompressible Mooney-Rivlin solid and illustrate how to translate its mathematical model into a general, nonlinear finite element environment. To demonstrate the features of the bulging problem under finite deformations, we conduct a series of case studies and perform systematic sensitivity analyses with respect to the swelling area, the opening size, and the opening location. We then create a personalized brain model from magnetic resonance images and simulate two different cases of craniectomy, a left unilateral flap and a frontal flap. For both cases, we study three swelling scenarios, swelling in both hemispheres, exclusively in the left hemisphere, and exclusively in the right hemisphere. We report and compare displacements, deformations, radial and tangential stretches, and maximum principal strains.

#### 2 Brain Model

To model brain tissue, we adopt a classical hyperelastic constitutive formulation [22]. We follow the recommendation to approximate brain as an isotropic material since our deformation rates are moderate [47]. To characterize the brain at finite deformations, we introduce the nonlinear deformation map  $\varphi$  and its gradient  $F = \nabla_X \varphi$  with respect to the coordinates X in the undeformed reference configuration. We allow parts of the brain to swell [29], and decompose the deformation gradient multiplicatively into an elastic part  $F^e$  and a swelling part  $F^s$ ,

$$\boldsymbol{F} = \nabla_{\boldsymbol{X}} \boldsymbol{\varphi} = \boldsymbol{F}^{\mathrm{e}} \cdot \boldsymbol{F}^{\mathrm{s}} \quad \text{with } \boldsymbol{J} = \det(\boldsymbol{F}) = \boldsymbol{J}^{\mathrm{e}} \boldsymbol{J}^{\mathrm{s}}. \tag{1}$$

The Jacobian J denotes the total volume change and  $J^e = \det(F^e)$  and  $J^s = \det(F^s)$  denote the volume change associated with the elastic deformation and with swelling. We then make two major kinematic assumptions: We assume that the elastic behavior is incompressible,  $J^e = 1$ , such that the total volume change is caused exclusively by swelling,  $J = J^s$ , and that swelling is volumetric,  $F^s = (J^s)^{1/3}I$ , such that the isochoric deformation is purely elastic  $\bar{F} = F^{e}$ . These assumptions imply that we can decompose the deformation gradient F into a volumetric contribution purely associated with swelling,  $J = J^{s}$ , and an isochoric contribution purely associated with the elastic deformation,  $\bar{F} = F^{e}$ ,

$$\boldsymbol{F} = \nabla_X \boldsymbol{\varphi} = J^{1/3} \bar{\boldsymbol{F}} \quad \text{with} \quad J = \det(\boldsymbol{F}) \quad \text{and} \quad \bar{\boldsymbol{F}} = J^{-1/3} \boldsymbol{F}. \tag{2}$$

We introduce the left Cauchy-Green deformation tensor b and decompose it into its swelling-induced volumetric contribution in terms of the Jacobian J and its elastic isochoric contribution  $\bar{b}$ ,

$$\boldsymbol{b} = \boldsymbol{F} \cdot \boldsymbol{F}^{\mathrm{t}} = J^{2/3} \bar{\boldsymbol{b}} \quad \text{with} \quad \bar{\boldsymbol{b}} = \bar{\boldsymbol{F}} \cdot \bar{\boldsymbol{F}}^{\mathrm{t}}.$$
 (3)

To characterize the swelling-induced deformation, we explore three kinematic metrics associated with the Green-Lagrange strain tensor,

$$\boldsymbol{E} = \frac{1}{2} \left[ \boldsymbol{F}^{\mathsf{t}} \cdot \boldsymbol{F} - \boldsymbol{I} \right],\tag{4}$$

the maximum principal strain,  $\lambda_E^{\text{max}}$ , associated with the eigenvalue problem of the Green-Lagrange strain tensor E,

$$\boldsymbol{E} \cdot \boldsymbol{n}_E = \lambda_E \boldsymbol{n}_E \quad \text{and} \quad \lambda_E^{\max} = \max\{\lambda_E\},$$
 (5)

the normal stretch along the axon, and the tangential stretch perpendicular to the axon. We then introduce the invariants  $I_1$ ,  $I_2$ , and  $I_3$ , in terms of the left Cauchy-Green deformation tensor **b**,

$$I_{1} = \operatorname{tr}(\boldsymbol{b}) \quad \text{with} \quad \partial I_{1}/\partial \boldsymbol{b} = \boldsymbol{I},$$

$$I_{2} = \frac{1}{2} \left[ \operatorname{tr}^{2}(\boldsymbol{b}) - \operatorname{tr}(\boldsymbol{b}^{2}) \right] \quad \text{with} \quad \partial I_{2}/\partial \boldsymbol{b} = I_{1}\boldsymbol{I} - \boldsymbol{b},$$

$$I_{3} = \operatorname{det}(\boldsymbol{b}) \quad \text{with} \quad \partial J/\partial \boldsymbol{b} = \frac{1}{2}J\boldsymbol{b}^{-1}$$
(6)

and their elastic, isochoric counterparts  $\bar{I}_1$ ,  $\bar{I}_2$ , and  $\bar{I}_3$ , either in terms of the isochoric left Cauchy-Green deformation tensor  $\bar{b}$  or in terms of the isochoric principal stretches  $\bar{\lambda}_1$ ,  $\bar{\lambda}_2$ , and  $\bar{\lambda}_3$ ,

$$\bar{I}_{1} = \operatorname{tr}(\bar{\boldsymbol{b}}) = J^{-2/3} I_{1} = \bar{\lambda}_{1}^{2} + \bar{\lambda}_{2}^{2} + \bar{\lambda}_{3}^{2}, 
\bar{I}_{2} = \frac{1}{2} \left[ \operatorname{tr}^{2}(\bar{\boldsymbol{b}}) - \operatorname{tr}(\bar{\boldsymbol{b}}^{2}) \right] = J^{-4/3} I_{2} = \bar{\lambda}_{1}^{-2} + \bar{\lambda}_{2}^{-2} + \bar{\lambda}_{3}^{-2}, 
\bar{I}_{3} = \operatorname{det}(\bar{\boldsymbol{b}}) = J^{-6/3} I_{3} = 1.$$
(7)

Many common constitutive models for brain tissues are special cases of the general Ogden model [33],

$$\bar{\psi} = \sum_{i=1}^{N} \frac{c_i}{\alpha_i} [\bar{\lambda}_1^{\alpha_i} + \bar{\lambda}_2^{\alpha_i} + \bar{\lambda}_3^{\alpha_i} - 3],$$
(8)

parameterized in terms of the Ogden parameters  $c_i$  and  $\alpha_i$ . For the special case of N = 2, with  $\alpha_1 = 2$  and  $\alpha_2 = -2$ , the Ogden model simplifies to the Mooney-Rivlin model [32, 36],

$$\bar{\psi} = \frac{1}{2}c_1[\bar{\lambda}_1^2 + \bar{\lambda}_2^2 + \bar{\lambda}_3^2 - 3] + \frac{1}{2}c_2[\bar{\lambda}_1^{-2} + \bar{\lambda}_2^{-2} + \bar{\lambda}_3^{-2} - 3], \tag{9}$$

which we can reformulate in terms of the elastic isochoric invariants  $I_1$  and  $I_2$ ,

$$\bar{\psi} = \frac{1}{2}c_1[\bar{I}_1 - 3] + \frac{1}{2}c_2[\bar{I}_2 - 3].$$
(10)

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The Mooney-Rivlin parameters  $c_1$  and  $c_2$  are related to the shear modulus  $\mu$  as  $c_1 + c_2 = \frac{1}{2}\mu$ , and their values can be identified through finite deformation experiments [15, 31]. We enforce the elastic incompressibility constraint,  $J^e - 1 = 0$ , in the form,  $J - J^s = 0$ , via a Lagrange multiplier p, and add the term  $p[J - J^s]$  to the energy functional,

$$\psi = \frac{1}{2}c_1[\bar{I}_1 - 3] + \frac{1}{2}c_2[\bar{I}_2 - 3] + p[J - J^s].$$
(11)

To derive the stresses, it proves convenient to reformulate the energy in terms of the overall invariants  $I_1$  and  $I_2$  and the Jacobian J,

$$\psi = \frac{1}{2}c_1 \left[ J^{-2/3} I_1 - 3 \right] + \frac{1}{2}c_2 \left[ J^{-4/3} I_2 - 3 \right] + p \left[ J - J^s \right].$$
(12)

We can then directly obtain the Kirchhoff stress,

$$\boldsymbol{\tau} = \frac{\partial \psi}{\partial \boldsymbol{F}} \cdot \boldsymbol{F}^{\mathrm{t}} = 2 \frac{\partial \psi}{\partial \boldsymbol{b}} \cdot \boldsymbol{b} = 2 \left[ \frac{\partial \psi}{\partial I_1} \frac{\partial I_1}{\partial \boldsymbol{b}} + \frac{\partial \psi}{\partial I_2} \frac{\partial I_2}{\partial \boldsymbol{b}} + \frac{\partial \psi}{\partial J} \frac{\partial J}{\partial \boldsymbol{b}} \right] \cdot \boldsymbol{b}$$
(13)

or, with the derivatives of the invariants in Eq. (6),

$$\boldsymbol{\tau} = 2 \left[ \frac{\partial \psi}{\partial I_1} + I_1 \frac{\partial \psi}{\partial I_2} \right] \boldsymbol{b} + 2 \frac{\partial \psi}{\partial I_2} \boldsymbol{b}^2 + J \frac{\partial \psi}{\partial J} \boldsymbol{I}.$$
(14)

Using the definition of the energy (12), we obtain the following explicit representation of the Kirchhoff stress  $\tau$  for a volumetrically swelling, elastically incompressible, Mooney-Rivlin material [17],

$$\boldsymbol{\tau} = [c_1 + \bar{I}_1 c_2] \boldsymbol{\bar{b}} - c_2 \boldsymbol{\bar{b}}^2 - \left[\frac{1}{3} \bar{I}_1 c_1 + \frac{2}{3} \bar{I}_2 c_2 + Jp\right] \boldsymbol{I}.$$
 (15)

The isochoric contributions to the third term,  $\frac{1}{3}\bar{I}_1c_1 + \frac{2}{3}\bar{I}_2c_2$ , reflect the fact that we have formulated the Mooney-Rivlin model in terms of the isochoric invariants  $\bar{I}_1$  and  $\bar{I}_2$  and not of the total invariants  $I_1$  and  $I_2$ . Even though the elastic behavior is incompressible, the overall behavior is not, and the isochoric invariants  $\bar{I}_1$  and  $\bar{I}_2$  indirectly depend on the amount of swelling J. Rather than rewriting the energy formulation in Eq. (12), we could have introduced the Kirchhoff stress as  $\tau = \partial \Psi / \partial \bar{b} : \mathbb{P} \cdot b$ , where  $\mathbb{P} = \partial \bar{b} / \partial b$  denotes the spatial fourth order isochoric projection tensor, to obtain the term,  $\frac{1}{3}\bar{I}_1c_1 + \frac{2}{3}\bar{I}_2c_2$ , from the isochoric projection with  $\mathbb{P}$  [22].

In our continuum model, we prescribe the amount of swelling  $J^s$  pointwise and phenomenologically rather than modeling the swelling process itself [29]. We gradually increase the local tissue volume as  $\Delta V = [J^s - 1.0] \cdot 100$  %. In our computational model, we represent volumetric swelling via volumetric thermal expansion [1], and only allow selected regions of the cerebral white matter tissue to swell, while all other substructures remain purely elastic with  $J^s \doteq 1.0$ . We enforce the incompressibility constraint  $J - J^s = 0$  by using a hybrid finite element formulation with displacement degrees of freedom for the isochoric part and pressure degrees of freedom for the volumetric part of the deformation.

#### 3 Bulging of a Hemidisk

Our previous analysis of the bulging of a linear elastic half-space through an opening has revealed two interesting features related to damage and stress distributions and relevant to the problem of craniectomy: Large fiber stretches develop deep in the center of the bulge and large shear stresses develop around the opening edge [19, 45]. These previous results



**Fig. 2** Bulging of a hemidisk with a swelling sector. Displacement, vertical displacement, and radial and tangential stretches for frictional contact without sliding (*left*) and frictionless contact with sliding (*right*). In frictional contact without sliding, the solid is pushed outward with large displacements along the symmetry axis in the center of the bulge. In frictionless contact with sliding, the solid slides along the boundary and rotates outward around the opening edge

were obtained analytically under the assumption of uniform swelling in a rectangular halfspace geometry. In this section, we study the importance of geometric effects in an idealized geometry computationally by systematically varying the location and area of swelling.

### 3.1 Hemidisk Model

We first consider the bulging problem in a simple two-dimensional geometry. As depicted in Fig. 1, an incompressible isotropic elastic hemidisk is swelling and the deformations are constrained within the hemidisk except in an opening of angle  $\beta$ . We consider two swelling scenarios: the swelling of a sector with an opening  $\alpha$  where both  $\alpha$  and  $\beta$  are centered about the axis of symmetry as illustrated in Fig. 1A, and the swelling of a disk where the opening  $\beta$  is inclined off the axis of symmetry as illustrated in Fig. 1B. We assume that the axonal direction  $\boldsymbol{n}$  is oriented radially outward, with  $\boldsymbol{t}$  denoting the tangential direction. For both swelling scenarios, we present the radial or normal stretch  $\lambda_n = [\boldsymbol{n} \cdot \boldsymbol{F}^t \cdot \boldsymbol{F} \cdot \boldsymbol{n}]^{1/2}$  and the tangential or shear stretch  $\lambda_t = [\boldsymbol{t} \cdot \boldsymbol{F}^t \cdot \boldsymbol{F} \cdot \boldsymbol{t}]^{1/2}$ .

### 3.2 Bulging of a Hemidisk with a Swelling Sector

An important consideration for the stress distribution within the solid is the type of contact. By definition, the boundary of the bulge is traction free. On the base of the hemidisk, we assume no sliding. On the curved part of the contact region, we use two types of boundary conditions: either frictional contact without sliding or frictionless contact with sliding. To visualize both contact conditions side by side, we only show half of the hemidisk for each contact condition, frictional contact on the left and frictionless contact on the right.

Figure 2 illustrates the impact of the contact condition for a swelling sector of  $\alpha = 80^{\circ}$  and an opening angle of  $\beta = 60^{\circ}$  at a swelling magnitude of J = 1.2. For frictional contact without sliding shown on the left, the boundary nodes are fixed. Upon swelling, the solid is



**Fig. 3** Bulging of a hemidisk with a swelling sector. Radial and tangential stretches for varying opening angles of  $\beta$  (*rows*) and for varying swelling sector angles  $\alpha$  (*columns*) for frictional contact without sliding (*left*) and frictionless contact with sliding (*right*). Radial stretches take maximum values of 1.7 in regions deep inside the bulge; tangential stretches take maximum values of 1.7 in regions localized around the craniectomy edge

pushed outward with large displacements along the symmetry axis in the center of the bulge. For frictionless contact with sliding, the boundary nodes are allowed to slide freely along the contact region. Upon swelling, the solid slides along the boundary and rotates outward around the opening edge.

Figure 3 illustrates a sensitivity analysis with respect to the opening angle  $\beta$ , the swelling sector angle  $\alpha$ , and the contact condition for a swelling magnitude of J = 1.2. As the angle  $\alpha$  of the swelling sector increases with  $\alpha = 20^{\circ}$ ,  $40^{\circ}$ ,  $60^{\circ}$ ,  $80^{\circ}$ , from left to right, the relative swelling area increases as  $\Delta A/A = \alpha/\pi [J - 1]$ . Figure 3 reveals a number of expected and new features: (i) As expected, an increase in skull opening reduces the maximal deformation and with it the maximal stretch; (ii) The radial stretch is maximal in a zone deep inside the bulge and increases rapidly as the swelling increases; (iii) The tangential stretch is maximal at the opening edge in a zone that takes the form of a drop; (iv) The maximal radial stretch is markedly higher in the case of frictional contact without sliding than in the frictionless contact case; (v) The maximal tangential stretch is markedly higher in the case of frictional contact case. These features and trends appear to be shared broadly by all bulging cases.

#### 3.3 Bulging of a Hemidisk with a Swelling Disk

In the case of tumor-induced swelling, it is likely that the swelling region takes a spherical rather than a sector shape. To explore the effects of a swelling disk and analyze the sensitivity of the swelling location with respect to the location of the skull opening, we study five cases with varying swelling locations for a swelling of J = 1.3. For all five cases, we model the contact region as frictionless with sliding.

Figure 4 illustrates the radial and tangential stretches for the bulging hemidisk with a varying position of the swelling disk. In all five cases, swelling is a local event. Maximal



**Fig. 4** Bulging of a hemidisk with a swelling disk. Radial and tangential stretches (*rows*) for five different swelling locations (*columns*). Radial and tangential stretches take maximal and minimal values around the swelling disk, while large regions of the hemidisk are unaffected by the local swelling

and minimal stretches are localized close to the swelling disk. Except for the swelling region itself, the overall stretch profile is rather insensitive to the location of swelling.

# 4 Bulging of a Personalized Brain

To simulate the effects of swelling in an anatomically detailed brain geometry, we create a personalized human head model from magnetic resonance images and simulate six different scenarios: a decompressive craniectomy with either unilateral flap or frontal flap subjected to both left and right, exclusively left, and exclusively right hemispherical swelling of the white matter tissue.

### 4.1 Personalized Brain Model

Figure 5 shows representative sagittal, coronal, and transverse slices of an adult female head that form the basis of our anatomic model. The brain has a total volume of  $1,108 \text{ cm}^3$ , a surface area of 1,673 cm<sup>2</sup>, and an average cortical thickness of 0.252 mm. Our magnetic resonance image set contains a total of 190 slices in the sagittal plane at a spacing of 0.9 mm. Each slice has a matrix representation of  $256 \times 256$  pixels with an in-plane resolution of  $0.9 \times 0.9$  mm [38]. From the magnetic resonance images, we create a personalized high-resolution anatomic model of the brain using the ScanIP software environment of Simpleware [48]. This semi-automatic software iteratively produces an anatomically detailed and geometrically accurate three-dimensional reconstruction of all relevant substructures including the cerebral gray and white matter, the cerebrospinal fluid, the cerebellum, the skin, and the skull [9]. From these substructures, we create a finite element model with 1,275,808 linear tetrahedral elements and 241,845 nodes with the help of Simpleware [48]. Our model represents the skull with 43,614 elements and 14,591 nodes, the skin with 33,821 elements and 11,250 nodes, the cerebral gray matter with 666,570 elements and 99,124 nodes, the cerebral white matter with 338,346 elements and 53,719 nodes, the cerebellum with 10,208 elements and 3,466 nodes, and the remaining cerebrospinal fluid, the veins, the meninges, part of the brain stem, the sinuses, the falx, and the ventricles with 185,249 elements and 59,595 nodes [46]. For simplicity, our current model does not include an explicit representation of the falx and the tentorium although recent studies suggest that the falx could play an important role in distributing deformations more evenly across the brain [21]. We import our head model into the finite element software package Abaqus, in which we prescribe the constitutive models as well as the boundary, contact, and loading conditions [1].

For the constitutive model, we adapt a Mooney-Rivlin model with gray matter parameters  $c_1 = 0.28$  kPa and  $c_2 = 333$  kPa [31]. We assume that the cerebellum is as stiff as the gray



**Fig. 5** Personalized decompressive craniectomy model. Magnetic resonance images (*left*) and computational model (*right*). Anatomically detailed and geometrically accurate three-dimensional reconstructions of the individual substructures including the gray matter (*red*), the white matter (*pink*), the cerebellum (*green*), the skin (*brown*), the skull (*gray*), and the remaining cerebrospinal fluid, the veins, the meninges, part of the brain stem, the sinuses, the falx, and the ventricles (*beige*); shown for selected sagittal, coronal, and transverse slices

Table 1         Material parameters of the Mooney-Rivlin model in	Substructure	Parameter c <sub>1</sub> [kPa]	Parameter c <sub>2</sub> [kPa]
different regions of the brain			
	Cerebral gray matter	0.28	333.0
	Cerebral white matter	0.56	666.0
	Cerebellum	0.28	333.0
	Cerebrospinal fluid	0.03	33.3

matter tissue, and that the white matter tissue is twice as stiff [4, 5, 26, 28]. For simplicity, we model the cerebrospinal fluid as an ultrasoft solid with a stiffness ten times lower than the gray matter stiffness. We assume that all soft tissues are incompressible and enforce the incompressibility constraint using hybrid linear tetrahedral C3D4H elements [1]. Table 1 summarizes our material parameters for the individual substructures of the brain.

Figure 6 illustrates our boundary and loading conditions across the brain. For the boundary conditions, we use a combination of fixed and sliding contact. To limit the motion of the inferior soft tissue regions, we fix the lower boundary of the cerebrospinal fluid shown in red [14]. To allow the brain to slide freely along the skull, we apply frictionless contact at the upper interface between the cerebrospinal fluid and the skull, shown in purple [46]. This implies that the shared nodes between the cerebrospinal fluid and the skull are duplicated to allow for relative sliding between them. To prohibit separation and penetration, tensile and compressive forces can be transmitted between these pairs of nodes. We enforce the contact constraint by allowing for a relative motion between the cerebrospinal fluid and the skull while penalizing separation and penetration at the fluid-skull interface. To reduce the computational time, we ignore the skin layer, model the skull as a rigid body, and assume a tight contact between gray and white matter, the cerebellum, and the cerebrospinal fluid [14]. For the loading conditions, we simulate brain swelling by prescribing a local volumetric expansion in a predefined white matter region. We gradually increase the amount of swelling from  $J^{s} = 1.0$  to  $J^{s} = 1.1$  to model a volumetric expansion of 10 % in selected regions of the white matter tissue. We solve the resulting non-linear system of equations using Abaqus/Standard based on an implicit Newton-Raphson iteration scheme. We adopt a



**Fig. 6** Personalized decompressive craniectomy model. Boundary conditions and loading conditions. *Top row*: Full model discretized with 1,275,808 linear tetrahedral elements and 241,845 nodes; representative coronal section; anatomic details with cortical folds; frontal flap with 4,279 skull elements removed; lateral flap with 2,494 elements removed. *Bottom row*: Boundary conditions with lower red region fixed relative to the skull and upper purple region allowed to slide along the skull; swelling of left, right, and both white matter hemispheres

quasi-static analysis with an automatic time incrementation, which would terminate if there was no convergence for a minimal pseudo-time increment specified to  $10^{-5}$  [1].

# 4.2 Bulging of a Personalized Brain with Swelling White Matter Tissue

We simulate three different cases of swelling, in both hemispheres, exclusively in the left hemisphere, and exclusively in the right hemisphere. To release the swelling-induced pressure, we simulate two different decompressive craniectomies, a frontal flap with 4,279 skull elements removed and a unilateral flap with 2,494 elements removed. For all cases, we quantify and compare the mechanical response in terms of the overall deformation, the maximum principal strain, the radial and tangental stretch, and the midline shift. The midline shift is a common clinical indicator to characterize the degree of subcortical swelling and axonal damage.

Figure 7 illustrates the displacement and the superposed deformation in transverse sections facing downward and in sagittal sections facing left for unilateral and frontal flaps with both left and right, only left, and only right hemispherical swelling. The surgical area available for a frontal flap is about twice as large as the area for a unilateral flap. Consequently, for the same amount of swelling, the displacements of the frontal flap are significantly smaller than for the unilateral flap. This finding is in agreement with our intuition and with our idealized hemidisk simulation in Fig. 3, for which larger opening angles generate smaller radial and tangential stretches. The superposed deformation in transverse and sagittal sections in Fig. 7 highlights the relative motion of different regions of the brain as the brain bulges outward. Swelling naturally causes a shift of all intracranial tissues. The shift of the midline, which is clearly visible in this sequence of images, is a key clinical indicator for the degree of trauma.

Figure 8 illustrates the radial and tangential stretches in transverse sections facing downward and in sagittal sections facing left for unilateral and frontal flaps with both left and



**Fig. 7** Decompressive craniectomy. Displacement and superposed deformation in transverse section facing downward and sagittal section facing left for unilateral and frontal flaps with left and right, left, and right hemispherical swelling. Swelling causes a shift of intracranial tissues, a key indicator of the trauma's severity in clinical practice. The midline shift of the cortical and subcortical layers highlights the immediate release of tissue strain upon removal of the unilateral and frontal flaps



**Fig. 8** Decompressive craniectomy. Radial and tangential stretches in transverse section facing downward and sagittal section facing left for unilateral and frontal flaps with left and right, left, and right hemispherical swelling. Swelling causes maximum radial stretches of up to 1.3 deep inside the bulge, minimum radial stretches of 0.7 around the opening, and maximum tangential stretches of up to 1.3 around the opening

right, only left, and only right hemispherical swelling. If we assume that axons are primarily oriented outward, we can associate the radial stretch with the axonal stretch and the tangential stretch with the axonal shear. For a swelling of 10 %, the radial stretch takes maximal values of up to 1.3 deep inside the bulge and minimal values of 0.7 around the edge of the opening. The tangential stretch takes maximal values of up to 1.3 in a ring around the open-



**Fig. 9** Decompressive craniectomy. Displacement, maximum principal strain, radial stretch, and tangential stretch for unilateral and frontal flaps with left and right, left, and right hemispherical swelling. Swelling causes maximum principal strains of up to 30 % localized around the opening, maximum radial stretches of up to 1.3 deep inside the bulge, minimum radial stretches of 0.7 around the opening, and maximum tangential stretches of up to 1.3 around the opening

ing. These three regions might be associated with potential zones of herniation and axonal failure, either by tension or compression, or by shear.

Figure 9 illustrates the displacement, maximum principal strain, radial stretch, and tangential stretch for unilateral and frontal flaps with both left and right, only left, and only right hemispherical swelling. The displacement field confirms that the deformation is larger for the unilateral flap than for the frontal flap. Naturally, the displacements are largest in the center of the bulge, which explains the large radial strains in the bulge region. In agreement with Fig. 8, the radial stretch takes maximum values of 1.3 deep inside the bulge and minimum values of 0.7 around the opening. Similarly, the tangential stretch takes maximum values of 1.3 in a ring around the opening.

#### 5 Discussion

Decompressive craniectomy is an invasive neurosurgical procedure to release elevated pressures in a swollen brain. Although the technique is highly controversial, it is often performed as a method of last resort; yet, little is known about how the opening of the skull affects the strain and stress fields inside the brain. Here we introduce a computational model to explore the effects of decompressive craniectomy in idealized and personalized geometries. Through a systematic analysis of different sets of simulations, we identify several common features and trends that could help make the overall procedure less invasive.

In all cases, a unified stretch pattern with three extreme stretch regions emerges: a tensile zone deep inside the bulge, a highly localized compressive zone around the opening, and a shear zone around the opening. This suggests that regions deep inside the bulge are most vulnerable to damage by axonal stretch, while regions near the craniectomy edge are most vulnerable to damage by axonal shear and herniation. These findings are in agreement with our analytical prediction [19]. Axonal stretch has been studied quite extensively in single axon experiments in vitro [41], but axonal shear has been given little attention as a potential failure mechanism. Only a few studies distinguish between tension/compression- and sheartype damage [11]. Our study shows that the tangential stretch, a surrogate measure for the axonal shear, can take values as high as 1.3 for swelling volumes as small as 28 ml, corresponding to only 5 % of the overall white matter volume. These numbers agree well with a recent simulation that predicted shear strains of the order of 25 % for swelling volumes of 22 ml [14]. In view of the long and slender ultrastructure of an axon [42], it seems fairly reasonable to assume that it could be highly vulnerable to shear-type loading. We have recently shown that shear stresses in bulging solids are highly localized at the bulging edge in regions that we have termed damage drops [45]. The drop-shaped regions in the tangential stretch profiles of Fig. 3 agree remarkably well in shape, location, and orientation with our previous analytical predictions [19].

The recent awareness to shear loading is in line with a current trend in mild traumatic brain injury: For a long time, scientists have thought that linear accelerations are the major origin of brain damage in traumatic brain injury, and that damage would be mainly a result of axonal stretch [37]. Stretch-based injury criteria suggests that there is a 50 % chance of brain tissue damage at strain levels of 18 % in vitro [2] and a 50 % chance of mild traumatic brain injury at strain levels of 19 % in vivo [49]. We now know that rotational accelerations could play an equally important role in traumatic brain injury [20]. With more information becoming available, we might soon recognize that brain damage results not only from stretch [17], but also from shear [11], and that the critical damage thresholds need to be considered for each mechanism individually or for both mechanisms in combination [47].

Our simulations suggest that a frontal craniectomy, which provides anatomic space for a larger opening, creates significantly lower displacements, strains, and stretches in comparison to a unilateral craniectomy [27]. Typically, a craniectomy is performed to release swelling volumes on the order of 50-150 ml [12]. A recent study reported swelling volumes of 27-127 ml [44]. If we assume that gray and white matter are approximately of the same volume, and that both hemispheres are of equal size, for a total brain volume of 1,108 cm<sup>3</sup>, our swelling of 10 % corresponds to a swelling. While our swelling volumes are clearly on the lower end and would probably not be sufficient to require surgery in clinical practice, we already observe significant local strains that could exceed the functional and morphological damage thresholds of 18 % and 21 % reported in the literature [2]. However, we would like to note that these thresholds were found by dynamically stretching brain tissue. During a decompressive craniectomy, the stretch rates might be lower, and the injury thresholds could be different. Additional experimental studies would be needed to accurately characterize the relevant strain safety limits.

Our study only presents a first prototype analysis of strains and stretches inside the brain in response to intracranial swelling and decompressive craniectomy. To gain insight, we have made several simplifying assumptions: First, on the time scale of interest, on the order of hours, days, and weeks, we have modeled brain tissue as nonlinearly elastic keeping in mind that on shorter times scales, viscous effects might play an important role [10]. Second, we have modeled brain tissue using a Mooney-Rivlin model although we have recently shown that a higher order Ogden model [33] might be better suited to model the nonlinear behavior of the brain [6, 31]. Since our analysis is mainly based on kinematic quantities swelling, deformation, stretch, and strain—and we do not discuss the final stress distribution in the bulging brain, we believe this is a reasonable first assumption, although a four- or sixparameter Ogden model would more accurately capture the characteristic shear stiffening of brain tissue [34]. Third, while recent experiments suggest that the elastic response of brain tissues may reasonably well be approximated as isotropic [47], the damage response could very well be anisotropic with different failure mechanisms and different damage thresholds associated with axonal tension and axonal shear [7]. Fourth, for simplicity, we have assumed that all axons point radially outward. A more realistic model would take into account the discrete axonal orientation at each individual point of the brain [30]. Conceptually, our analysis itself would remain the same; yet, the post-processing to calculate the normal and shear stretches would use the true axonal direction n from diffusion tensor images rather than the simplified assumption that n points radially outward.

# 6 Conclusion

Taken together, our study of bulging brains illustrates how swelling-induced deformations propagate across the brain when opening the skull. It underlines the notion that a decompressive craniectomy is a highly invasive surgical procedure that releases an elevated intracranial pressure at the expense of inducing local zones of extreme strain and stretch. Mathematical models and computational simulations can help identify regions of extreme tissue kinematics. This approach could guide neurosurgeons to optimize the shape and position of the craniectomy with the goal to avoid placing the craniectomy edge near functionally important regions of the brain.

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