

A multiscale topology optimisation framework for hollow spheres as cellular materials

Bruno G. Christoff^a, José Humberto S. Almeida Jr.^{b,c,*}, Eduardo L. Cardoso^d, Volnei Tita^{a,e}

^a Department of Aeronautical Engineering, Sao Carlos School of Engineering, University of Sao Paulo, Sao Carlos, SP, Brazil

^b School of Mechanical and Aerospace Engineering, Queen's University Belfast, Belfast, UK

^c Department of Mechanical Engineering, Aalto University, Espoo, Finland

^d Department of Mechanical Engineering, State University of Santa Catarina, Joinville, Brazil

^e Department of Mechanical Engineering, Faculty of Engineering of the University of Porto, Porto, Portugal

ARTICLE INFO

Keywords:

Cellular materials
Hollow spheres
Multiscale approach
Asymptotic homogenisation method
Topology optimisation

ABSTRACT

Cellular materials can be designed to achieve mechanical properties with low weight. Among them, hollow spheres have been investigated since modern manufacturing methods can accurately produce them. This work aims to develop an optimisation procedure to distribute hollow spheres to minimise the compliance of a structure through a multiscale approach. The model has two geometrical parameters: internal and external diameters, in which the asymptotic homogenisation method (AHM) is employed to predict the effective properties of the material. Equations relating the effective properties to geometrical parameters are obtained through the least square method. Then, topology optimisation is employed to minimise compliance constrained by an admissible relative density. The optimised structures are compared to homogeneous distributions of hollow spheres, and compliance reductions up to 79% are reached. The optimum distributions of hollow spheres are validated against the classical solid isotropic with material penalisation (SIMP) approach. Moreover, some structures are 3D-printed to show the feasibility and capabilities of the proposed approach. Experimental tests are conducted on the structures through additive manufacturing. It is shown that optimised structures outperform the ones with homogeneous distributions of hollow spheres with the same relative density.

1. Introduction

Cellular materials are formed, necessarily, by two phases [1,2]: the first is composed of solid and continuous material and the second lacks material, that is, void. These materials can roughly be divided into two distinct groups: open and closed cell materials [3]. In closed-cell materials, voids are discontinuous and dispersed into the solid phase. An open-cell structure presents a continuous void phase within the structure [1]. In practice, most cellular materials present characteristics of both open and closed-cell structures simultaneously. Another way of defining a cellular material is through the concept of a composite. Considering that a composite is a set of two or more different materials combined into a macroscopic scale, cellular materials can be seen as a particular type of composite, in which one of the constituent materials is solid and the one is void [4].

The most important feature of cellular materials is their relative density, i.e., the density of the cellular material divided by the density of the solid of which the cellular material is made [5] since these materials can be designed to achieve very small relative densities.

According to Gibson and Ashby [5], the four major areas of application of cellular materials are thermal insulation, packaging, structural, and buoyancy. The cellular structure provides excellent properties to the structure, such as high energy absorption, good formability, and excellent insulation [6]. In addition, such cellular structures allow tailoring their mechanical, thermal, and acoustic properties, which aids in multi-functionality, such as in thermo-structural applications [7]. As these kinds of materials can be designed to achieve a broad range of properties, they can be used in several industrial applications. Cellular materials are widely used in thermal conductivity applications [8,9], damping and vibration control [10,11], structural applications [12–15] and frequency shielding [16,17].

A type of cellular material is hollow spheres [18–20]. These structures provide a specific microstructure with the likelihood of enhanced properties for low-density lightweight structures [21,22]. This type of structure is characterised by easily reproducible geometry, guaranteeing physical consistency in the properties of the material [23–25]. Additionally, hollow sphere structures can be manufactured from

* Corresponding author at: School of Mechanical and Aerospace Engineering, Queen's University Belfast, Belfast, UK.

E-mail address: humberto.almeida@qub.ac.uk (J.H.S. Almeida Jr.).

a broad range of materials and can be assembled in a periodic structure [26]. Augustin et al. [27] show the technological development of manufacturing processes for hollow spheres focusing on their production and prospective applications. Waag et al. [28] present several manufacturing processes for hollow spheres made of porous metals, ceramics and polymers. Kalamar et al. [29] performed a structural analysis of full-scale hollow, laminated glass columns under combined in-plane compression and impact loads. Liu et al. [30] investigated the residual mechanical properties of hollow spherical joints with H-beam (H-WHSJ) after being loaded in elevated temperatures. Gasser et al. [31] predicted the elastic behaviour of a hollow sphere foam using a model derived from the thin shell elastic theory. Marcadon and Feyel [32] studied the influence of localised plasticity and buckling of hollow spheres on the effective behaviour of their packing. Yan et al. [33] assessed the mechanical behaviour of H-shaped steel member (WHS-HSM) joints under axial compression. Hosseini et al. [34] investigated the thermal properties of a perforated hollow sphere structure. Solorzano et al. [35] analysed the thermal conductivity of hollow sphere structures analytically. Fiedler and Solorzano [36] used Monte Carlo and finite element methods to predict the effective thermal conductivity properties of randomly oriented hollow sphere structures. Marcadon [37] aimed at exploiting the potential of using hollow spheres in high-temperature applications, wherein elastic, plastic, and viscous properties on the effective behaviour of hollow sphere structure were investigated. Liu et al. [38] exploited the dynamic crushing of hollow spheres, Marcadon [39] evaluated the influence of geometrical defects on the mechanical response of hollow sphere structures, whereas Wu et al. [40] focused on tailoring the sound absorption properties. Shufrin et al. [41] investigated the negative Poisson's ratio in auxetic cellular structures.

After this non-extensive state-of-the-art, three main gaps are found: (i) How to predict the effective material properties of a media formed by hollow spheres? (ii) How to optimally distribute hollow spheres in a domain to maximise their performance whilst keeping the relative density? (iii) Is it possible to manufacture the structures with the design variables considered? (iv) Do the optimised structures have superior experimental structural stiffness? To answer these questions, the main novelties of the present work are listed as follows:

- The problem is tackled in a multiscale environment, in which the global domain is locally represented using an RVE. An idealised model for a single hollow sphere is proposed (microscale), which is described by its geometrical parameters;
- The effective properties are numerically obtained by AHM and translated as a continuous and differentiable function of the geometrical parameters of the RVE;
- The distribution of the hollow spheres within the domain is performed by an adaptation of the classical topology optimisation based on the optimum criterion method;
- The optimum distribution of the cellular material can be determined to achieve optimised hollow sphere structures;
- The geometry of the microstructure and the distribution of the hollow spheres can be concurrently tailored, thus enhancing design horizons;
- It is possible to obtain manufacturable structures strictly as-optimised, with high resolution (i.e., resolution of 100 μm) and with precise distribution of the spheres in the domain.

Given these novel characteristics of the proposed approach, this paper aims at minimising the compliance of hollow sphere structures in a multiscale environment against two classical benchmark cases: (i) cantilever beam and (ii) three-point bending. The maximum allowed relative densities considered are 5%, and 10%. Experimental validation in terms of manufacturing and testing is also carried out.

2. The approach

An anisotropic and quasi-periodic elastic body is considered. Let Ω be a domain in $\mathbb{R}^3$ with boundary $\partial\Omega$ (see Fig. 1). Consider that Dirichlet and Neumann boundary conditions are applied on $\partial\Omega_u$ and $\partial\Omega_f$, respectively, where

$$\partial\Omega = \partial\Omega_{u_i} \cup \partial\Omega_{f_i}; \quad \partial\Omega_{u_i} \cap \partial\Omega_{f_i} = \emptyset \quad i = 1, 2, 3, \quad (1)$$

such that

$$u_i = u_i^g \quad \text{on} \quad \partial\Omega_{u_i} \quad i = 1, 2, 3, \quad (2)$$

where u_i is the i th component of the displacement and u_i^g is known, and

$$\sigma_{ij} n_j = t_i \quad \text{on} \quad \partial\Omega_{f_i} \quad i, j = 1, 2, 3, \quad (3)$$

where σ is the stress tensor, $\mathbf{n}$ is a normal vector, and $\mathbf{t}$ is a traction vector.

The elastic body is assumed to be a cellular solid with a microstructure formed by a distribution of hollow spheres. Two scales are used to define the problem. On the macroscale, defined by the slow variable $\mathbf{x}$, the mechanical properties are homogenised in the considered material point. On the microscale, represented by the fast variable $\mathbf{y}$, the effective properties of the medium are calculated with a two-scale Asymptotic Homogenization Method (AHM), such that

$$C_{ijkl}^H = C_{ijkl}^H(\mathbf{y}). \quad (4)$$

Both coordinate systems are assumed to be coincident.

In Fig. 1, a small portion of the domain is highlighted, depicting the distribution of the hollow sphere material. An idealised material model is assumed, in which a regular distribution of hollow spheres is considered.

A Representative Volume Element (RVE) is used to depict the medium. The geometrical parameters ρ_o , and ρ_i (outer and inner diameters of the RVE, respectively), describe the entire microscale domain. In addition, two adjacent hollow spheres are connected by a flat area and it is considered that the thickness is constant and a function of the geometrical parameters. Therefore, the homogenised elasticity tensor of the media can be written as

$$C^H = C^H(\rho_o, \rho_i). \quad (5)$$

With the macroscopic properties of the domain written as a function of the RVE geometry, it is assumed that the distribution of cellular material within the macroscopic domain varies as a function of its position. This can be written as a function of the geometric parameters of the RVE as

$$\rho_o = \rho_o(\mathbf{x}) \quad \text{and} \quad \rho_i = \rho_i(\mathbf{x}). \quad (6)$$

An adaptation of the classical topology optimisation problem is used in the present study to find the optimum distribution of hollow spheres in the domain. Thus, every material point of the domain is described by a pair of geometrical parameters ρ_o and ρ_i , describing the hollow sphere for that particular point. The optimisation problem is set as

$$\begin{aligned} \min_{\rho_o, \rho_i} \quad & f(\rho_o(\mathbf{x}), \rho_i(\mathbf{x})) \\ \text{Subject to} \quad & V(\rho_o(\mathbf{x}), \rho_i(\mathbf{x})) \leq \bar{V}, \end{aligned} \quad (7)$$

where f is the compliance, V is the relative density of the structure, and $\bar{V}$ is a given admissible relative density. It is also considered that the design variables are bounded, such that

$$\begin{aligned} \rho_o^{\min} &\leq \rho_o(\mathbf{x}) \leq \rho_o^{\max} \\ \rho_i^{\min} &\leq \rho_i(\mathbf{x}) \leq \rho_i^{\max}, \quad \forall \mathbf{x} \in \Omega. \end{aligned} \quad (8)$$

Linear elastic behaviour is assumed, and Fig. 2 shows the design domains considered for the optimisation cases. The AHM equilibrium relations and the entire optimisation procedure are carried out on in-house routines written in Julia Language [42].

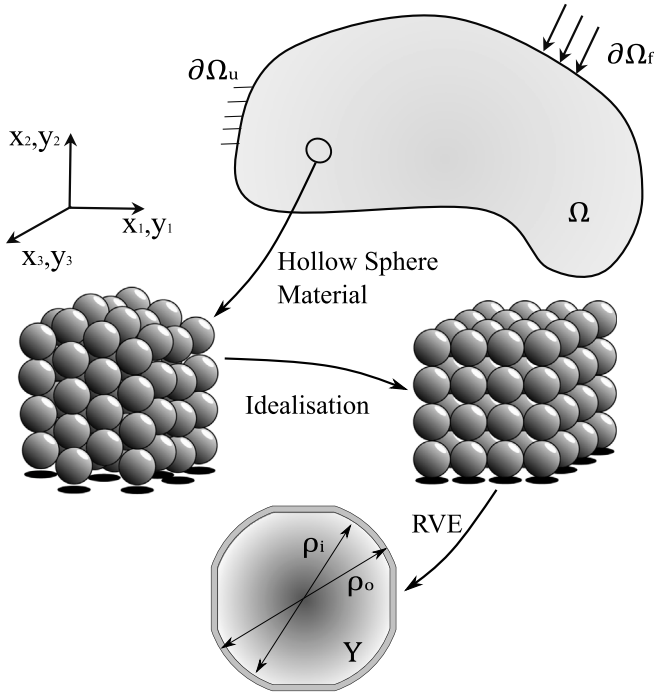


Fig. 1. Depiction of the microscopic structure of a small portion of the macroscopic domain, idealised model and the RVE.

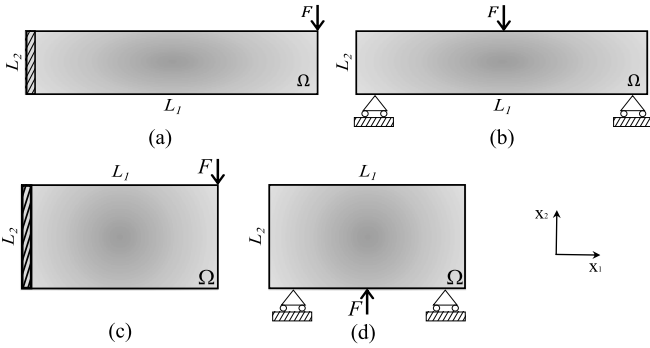


Fig. 2. Design domains considered for the optimisation problem: (a) cantilever beam (cb_1), (b) 3-point bending beam with load application on the upper side (3pb_1), (c) cantilever beam (cb_2), and (d) 3-point bending beam with load application on the bottom side (3pb_2).

3. Mathematical background

3.1. Asymptotic homogenisation method

In the context of linear elasticity, the effective properties of a material with a periodic (or quasi-periodic) microstructure can be determined through AHM [43]. This method is based on the assumption that the RVE, a small part of the domain which repeats itself with periodicity in the whole domain, is considerably smaller than the design domain [44].

The notation, derivation of the equilibrium problems, and the finite element (FE) solution are based on [43,45–47].

An anisotropic and quasi-periodic elastic body is considered. The problem is formulated in the bounded subset Ω of $\mathbb{R}^3$, and a slow variable $\mathbf{x}$ and a fast variable $\mathbf{y}$ are considered to describe the problem.

The RVE is denoted by

$$Y = \{\mathbf{y} = (y_1, y_2, y_3) \in \mathbb{R}^3 : 0 < y_i < l_i, i = 1, 2, 3\} \quad (9)$$

where Y is the size of the RVE, with l_i as positive numbers. The macroscopic domain is denoted as

$$\Omega = \varepsilon Y = \{\mathbf{x} = (x_1, x_2, x_3) \in \mathbb{R}^3 : \varepsilon^{-1}x_i \in Y, i = 1, 2, 3\}, \quad (10)$$

where

$$\mathbf{y} = \frac{\mathbf{x}}{\varepsilon}, \quad (11)$$

with $\varepsilon \ll 1$.

The development of the method follows three basic considerations [48]. The first demands that the displacement field of the media can be written in an asymptotic expansion as

$$\mathbf{u}^\varepsilon(\mathbf{x}) = \mathbf{u}^{(0)}(\mathbf{x}) + \varepsilon \mathbf{u}^{(1)}(\mathbf{x}, \mathbf{y}) + \varepsilon^2 \mathbf{u}^{(2)}(\mathbf{x}, \mathbf{y}) + \dots \quad (12)$$

where $\mathbf{u}^\varepsilon$ is the total displacement field and $\mathbf{u}^{(0)}$, $\mathbf{u}^{(1)}$ and $\mathbf{u}^{(2)}$ are the contributions for the displacement of the macroscopic scale, microscopic scale, and eventual smaller scales, respectively. The second consideration is that the coordinates at each level are related by a small parameter ε , as shown in Eq. (11). The third consideration is that the displacements on the boundaries of the RVE are periodic. This consideration implies that the local domain is periodic, thus describing the macroscopic domain.

A general field variable f_i^ε is thus dependent on both fast and slow variables, such as

$$f_i^\varepsilon(\mathbf{x}) = f_i(\mathbf{x}, \mathbf{y}) \quad (13)$$

and its partial derivatives take the form

$$\frac{\partial f_i^\varepsilon}{\partial x_j} = \frac{\partial f_i}{\partial x_j} + \varepsilon^{-1} \frac{\partial f_i}{\partial y_j}. \quad (14)$$

Assuming that no body forces are acting on the media, one can write the elastic equilibrium as

$$\frac{\partial \sigma_{ij}^\varepsilon}{\partial x_j} = 0 \quad \text{in } \Omega^\varepsilon, \quad (15)$$

where

$$\sigma_{ij}^\varepsilon = C_{ijkl}(\mathbf{y}) \frac{\partial u_k^\varepsilon}{\partial x_l}. \quad (16)$$

Using the asymptotic expansion, Eq. (12), and the definition of the stress field, Eq. (16), it is possible to demonstrate that the stress is dependent on $\mathbf{x}$ and $\mathbf{y}$ in the form of

$$\sigma_{ij}^\varepsilon(\mathbf{x}) = \sigma_{ij}^{(0)}(\mathbf{x}, \mathbf{y}) + \varepsilon \sigma_{ij}^{(1)}(\mathbf{x}, \mathbf{y}) + \varepsilon^2 \sigma_{ij}^{(2)}(\mathbf{x}, \mathbf{y}) + \dots, \quad (17)$$

where

$$\sigma_{ij}^{(m)}(\mathbf{x}, \mathbf{y}) = C_{ijkl}(\mathbf{y}) \frac{\partial u_k^{(m)}}{\partial x_l} + C_{ijkl}(\mathbf{y}) \frac{\partial u_k^{(m+1)}}{\partial y_l}, \dots, m = 0, 1, 2, \dots \quad (18)$$

Taking the derivatives of the expanded stress, Eq. (17), and taking in consideration Eq. (14), one can group like exponents ε , and obtain for ε^{-1} and ε^0 , respectively

$$\frac{\partial \sigma_{ij}^{(0)}}{\partial y_j} = 0 \quad (19)$$

and

$$\frac{\partial \sigma_{ij}^{(0)}}{\partial x_j} + \frac{\partial \sigma_{ij}^{(1)}}{\partial y_j} = 0. \quad (20)$$

Using Eq. (18) for $m = 0$ and Eq. (19) one has

$$\frac{\partial}{\partial y_j} \left(C_{ijkl} \frac{\partial u_k^{(1)}}{\partial y_l} \right) = - \frac{\partial C_{ijkl}}{\partial y_j} \frac{\partial u_k^{(0)}}{\partial x_l} \quad (21)$$

where the solution is represented in the form of

$$u_i^{(1)}(\mathbf{x}, \mathbf{y}) = \chi_i^{jk}(\mathbf{y}) \frac{\partial u_j^{(0)}(\mathbf{x})}{\partial x_k}, \quad (22)$$

where χ is a characteristic periodic displacement field. Thus the following local problem is obtained:

$$\frac{\partial}{\partial y_j} \left(C_{ijkl} \frac{\partial \chi_k^{pq}}{\partial y_l} + C_{ijpq} \right) = 0 \quad \text{in } Y, \quad [\chi_k^{pq}] = 0 \quad (23)$$

and

$$\left[C_{ijkl} \frac{\partial \chi_k^{pq}}{\partial y_l} + C_{ijpq} \right] n_j = 0 \quad \text{on } \Gamma, \quad (24)$$

where Γ is the interface in the unit cell Y . The differential relation, given in Eq. (24) can also be written in its integral, or relaxed form as

$$\int_Y C_{ijkl} \frac{\partial \chi_k^{pq}}{\partial y_l} \frac{\partial v_i}{\partial y_j} dY = - \int_Y C_{ijpq} \frac{\partial v_i}{\partial y_j} dY, \quad (25)$$

where v is a periodic virtual displacement field, which is the equilibrium relation on the microscale.

Assuming $m = 0$ in Eq. (18), and considering Eq. (22), one obtains

$$\sigma_{ij}^{(0)} = \left(C_{ijpq} + C_{ijkl} \frac{\partial \chi_k^{pq}}{\partial y_l} \right) \frac{\partial u_p^{(0)}}{\partial x_q}. \quad (26)$$

The macroscopic equilibrium is obtained by averaging Eq. (20) as

$$\frac{\partial \langle \sigma_{ij}^{(0)} \rangle_Y}{\partial x_j} = 0 \quad (27)$$

where

$$\langle \sigma_{ij}^{(0)} \rangle_Y = \frac{1}{|Y|} \int_Y \sigma_{ij}^{(0)} dY = C_{ijpq}^H \frac{\partial u_p^{(0)}}{\partial x_q} \quad (28)$$

with

$$C_{ijpq}^H = \left\langle C_{ijpq} + C_{ijkl} \frac{\partial \chi_k^{pq}}{\partial y_l} \right\rangle_Y, \quad (29)$$

which is the homogenised elasticity tensor of the media. The cell average operator is defined as

$$\langle \bullet \rangle_Y = \frac{1}{|Y|} \int_Y \bullet dY. \quad (30)$$

Equations (25) and (29) are sufficient to obtain the complete elasticity tensor of a periodic media as a function of its microstructure. Several analytically explicit relations were derived in the last years (see [46,47,49,50]). However, in all cases, only simple geometries of the RVE are considered. If a complex geometry is considered, the explicit relations for the elasticity tensor of the media might become tedious to obtain, and thus, numerical methods are typically used in this kind of problem.

In this study, both the equilibrium in the microscopic scale and the relation for the effective properties are solved by the FE method.

Equation (25) can be written in a vector form as

$$\int_Y \left(\frac{\partial v}{\partial y} \right)^T C \frac{\partial \chi}{\partial y} dY = - \int_Y \left(\frac{\partial v}{\partial y} \right)^T C dY \quad (31)$$

Dividing the domain into finite elements and assuming a general isoparametric interpolation, one can write the derivatives of displacement fields as

$$\frac{\partial v}{\partial y} = B \hat{v}, \quad \text{and} \quad \frac{\partial \chi}{\partial y} = B \hat{\chi}, \quad (32)$$

where $\hat{v}$ and $\hat{\chi}$ are the nodal virtual and characteristic displacement vectors, respectively, and B is the global strain–displacement relation. Also, as $\hat{\chi}$ is not a function of the local coordinates, and the virtual displacement vector $\hat{v}$ is arbitrary and chosen to satisfy the same boundary conditions of $\hat{\chi}$, the equilibrium becomes

$$\int_Y B^T C B dY \hat{\chi} = - \int_Y B^T C dY, \quad (33)$$

which, in a standard finite element form, can be written as

$$K \hat{\chi} = -f. \quad (34)$$

Equation (34) depicts six independent linearly independent equilibrium problems, and the periodicity constraints on $\hat{\chi}$ are enforced directly to the global arrays by using a condensation method [51]. The global arrays are assembled in the usual way.

A similar procedure is used for the discretisation of the integral Eq. (29), which can be written as

$$C^H = \frac{1}{|Y|} \int_Y (C + C B \hat{\chi}) dY. \quad (35)$$

The complete homogenised elasticity tensor of the media is obtained by Eq. (35) subject to the equilibrium relation of Eq. (34). A quadrature scheme is used to evaluate the integrals on Eqs. (34) and (35).

3.2. Optimisation formulation

The domain Ω is divided in a FE mesh, with element subdomains donated as $\Omega^{(e)}$, such that

$$\Omega = \bigcup_{e=1}^{N_e} \Omega^{(e)} = \{x = (x_1, x_2, x_3) \in \mathbb{R}^3 : 0 < x_i < L_i, i = 1, 2, 3\}, \quad (36)$$

where N_e is the number of elements on the mesh, $\bigcup$ is the assembly operator, and L_i are positive numbers.

Furthermore, the mechanical properties of each element of the mesh are described by the geometrical parameters of a hollow sphere as

$$C^{(e)} = C^{(e)}(\rho_o^{(e)}, \rho_i^{(e)}), \quad (37)$$

where $\rho_o^{(e)}$ and $\rho_i^{(e)}$ are the outer, and inner diameters, respectively, of a hollow sphere associated to element e . The vectors containing the design variables are written as

$$\rho_o = [\rho_o^{(1)} \quad \rho_o^{(2)} \quad \rho_o^{(3)} \quad \dots \quad \rho_o^{(N_e)}]^T, \quad (38)$$

and

$$\rho_i = [\rho_i^{(1)} \quad \rho_i^{(2)} \quad \rho_i^{(3)} \quad \dots \quad \rho_i^{(N_e)}]^T, \quad (39)$$

and for simplicity, the following notation is adopted:

$$\rho = [\rho_o \quad \rho_i]. \quad (40)$$

A compliance minimisation problem is considered constrained by a known maximum allowed relative density of the structure. The optimisation takes the following form:

$$\begin{aligned} \min_{\rho} \quad & f(\rho) = F^T U(\rho) \\ \text{Subject to} \quad & V(\rho) \leq \bar{V}, \end{aligned} \quad (41)$$

where f is the compliance (proportional to the strain energy) of the structure, F is the global external load vector, U is the global displacement vector, V relative density of the structure, and $\bar{V}$ is a fixed known relative density (upper bound).

Additionally, side constraints are applied to the design variables, as the minimum and maximum admissible values for the diameters, as

$$\begin{aligned} \rho_o^{\min} &\leq \rho_o^{(e)} \leq \rho_o^{\max} \\ \rho_i^{\min} &\leq \rho_i^{(e)} \leq \rho_i^{\max} \quad e = 1, \dots, N_e. \end{aligned} \quad (42)$$

Linear elastic behaviour is considered, and thus the FE equilibrium can be written as

$$K(\rho) U(\rho) = F, \quad (43)$$

where K is the global stiffness matrix.

The optimisation problem can also be stated as an unconstrained problem, as

$$\min_{\rho} \quad L(\rho) \quad (44)$$

where $L(\rho) = f(\rho) + \lambda(V(\rho) - \bar{V})$ is the Lagrangian function and λ is the Kuhn–Tucker multiplier. The minimum is attained when

$$\nabla_{\rho} L = 0 \quad (45)$$

such that

$$\nabla_{\rho} f(\rho) + \lambda \nabla_{\rho} V(\rho) = \mathbf{0}, \quad (46)$$

which is rewritten as

$$-\frac{\frac{\partial f(\rho)}{\partial \rho_q}}{\lambda \frac{\partial V(\rho)}{\partial \rho_q}} = 1, \quad (47)$$

where ρ_q is the q th design variable of the problem.

Equation (47) is also known as the optimum condition and states that in the optimum (minimum) point ρ^* , all elements which are not bounded by the side constraints should attain a constant unitary value. Motivated by such behaviour, Bendsøe and Sigmund [52] proposed the use of an optimum criteria method in which the update of the design variables at the k th iteration can be done as

$$\rho_q^{k+1} = \rho_q^k \beta_q^{\eta} \quad (48)$$

where η is a relaxation parameter, and β_q is the update parameter, given by

$$\beta_q = \frac{-\frac{\partial f(\rho)}{\partial \rho_q}}{\lambda \frac{\partial V(\rho)}{\partial \rho_q}}, \quad (49)$$

where λ is the Kuhn Tucker Multiplier, obtained by a simple bisection algorithm written to satisfy the volume constraint. The sensitivity analyses are presented in [Appendix](#).

It is reasonable to assume that for the external diameter of a hollow sphere, the derivatives of the compliance and the derivatives of the volume are given, respectively, by

$$\frac{\partial f}{\partial \rho_o^{(e)}} \geq 0 \quad \text{and} \quad \frac{\partial V}{\partial \rho_o^{(e)}} \leq 0, \quad \forall \Omega^{(e)} \in \Omega \quad (50)$$

and, for the internal diameter, by

$$\frac{\partial f}{\partial \rho_i^{(e)}} \leq 0 \quad \text{and} \quad \frac{\partial V}{\partial \rho_i^{(e)}} \geq 0, \quad \forall \Omega^{(e)} \in \Omega, \quad (51)$$

which ensures that the value of the update parameter β_q (Eq. (49)) is always positive.

The behaviour of the external diameter of a hollow sphere and the pseudo densities at the classical SIMP case [52] are equal, since that, in both cases, when the value of the design variable increases, the volume increases, and the compliance reduces. Hence, analogously to the update of the design variables to the SIMP case, the external diameter is updated with a positive value of the relaxation coefficient, and it is adopted that

$$\eta_o = 0.5. \quad (52)$$

Conversely, the behaviour of the internal diameter is opposite to the behaviour of the external diameter. Therefore, it is adopted a relaxation coefficient of

$$\eta_i = -0.5. \quad (53)$$

such that, in both cases, the update of the variables is consistent with the optimal criteria method.

In addition, a basic density filtering scheme [53] is adopted to reduce the complexity of the structure. Thus, the filtered design variable $\bar{\rho}^{(e)}$ is considered linearly dependent on the neighbouring variables within a filtering radius R [54].

The optimisation is solved as a nested problem and it is considered that the range for the inner diameter is dependent on the value of the outer diameter for every iteration. Thus, the outer diameter is updated first, and the inner diameter is updated next as a function of the outer diameter on the current iteration. [Fig. 3](#) shows a flowchart for the nested optimisation approach. The convergence is assumed to be reached when the compliance and both outer and inner diameters have variation inferior to 1% in 5 subsequent steps.

Table 1

Normalised dimension l_i and number of finite elements n_i along direction y_i for the determination of effective properties.

y_1		y_2		y_3	
l_1	n_1	l_2	n_2	l_3	n_3
1.0	100	1.0	100	1.0	100

4. Results and discussion

4.1. Effective properties

The homogenised elasticity tensor of the hollow sphere material is obtained by Eq. (35) subjected to the periodic solution of the equilibrium problem given in Eq. (34). Some considerations are made to simplify the solution.

As the material distribution within the RVE is complex, a regular cubic RVE is adopted. In the regions containing material, the properties of solid isotropic material are assigned (Young's modulus, $E = 70$ GPa and Poisson's ratio, $\nu = 0.3$), whilst in regions with no material, properties of void elements are assigned ($E = 1.0^{-9}$ GPa and $\nu = 0.3$).

In this way, void elements do not need to be removed from the FE mesh, hence the connectivity of the elements does not need to be updated when the material distribution changes. Additionally, the application of periodic boundary conditions does not change as well. Conversely, this approach is computationally inefficient since void elements contribute to the assembly of global arrays, even though it does not influence the homogenised elasticity tensor of the media.

Additionally, a regular FE mesh is considered in the simulations, in which all elements on the mesh are cubes of the same size. The implication is that the hollow sphere itself cannot be faithfully represented by a coarse mesh. However, this also renders the mesh generation and application of periodic boundary conditions simpler. The normalised dimensions l_i of the RVE, and the number of elements n_i in the direction y_i are shown in [Table 1](#).

[Fig. 4\(a\)](#) shows the FE model used to discretise the RVE, in which both void and solid elements are portrayed. In [Fig. 4\(b\)](#) and (c), the complete FE mesh and a cross-section are shown, respectively, with void elements suppressed in the visualisation. The element used is the Trilinear Isoparametric Hexahedral element with incompatible modes. The FE mesh is chosen to be both convergence-independent and able to faithfully represent the domain.

For this model, two adjacent spheres are connected by a flat area delimited by the hollow sphere and the boundaries of the RVE. The thickness of the hollow sphere is constant and it is a function of the geometrical parameters ρ_o , and ρ_i . By varying the geometrical parameters in a given range, one can obtain a discrete set of the effective properties of the media. The considered normalised range for the geometrical parameters of the hollow sphere is

$$\begin{aligned} 1.09 &\leq \rho_o \leq 1.2 \\ \rho_o - 0.2 &\leq \rho_i \leq \rho_o - 0.01. \end{aligned} \quad (54)$$

The ranges are chosen so that the geometry of the sphere is maintained. If a large outer diameter is used, the sphere tends to become a cube, due to the area used to connect two adjacent spheres. On the other hand, if a small outer diameter is used, adjacent spheres have small contact areas, which lowers the overall stiffness. Additionally, the minimum inner diameter is chosen so that the finite element mesh can represent the thickness of the hollow sphere.

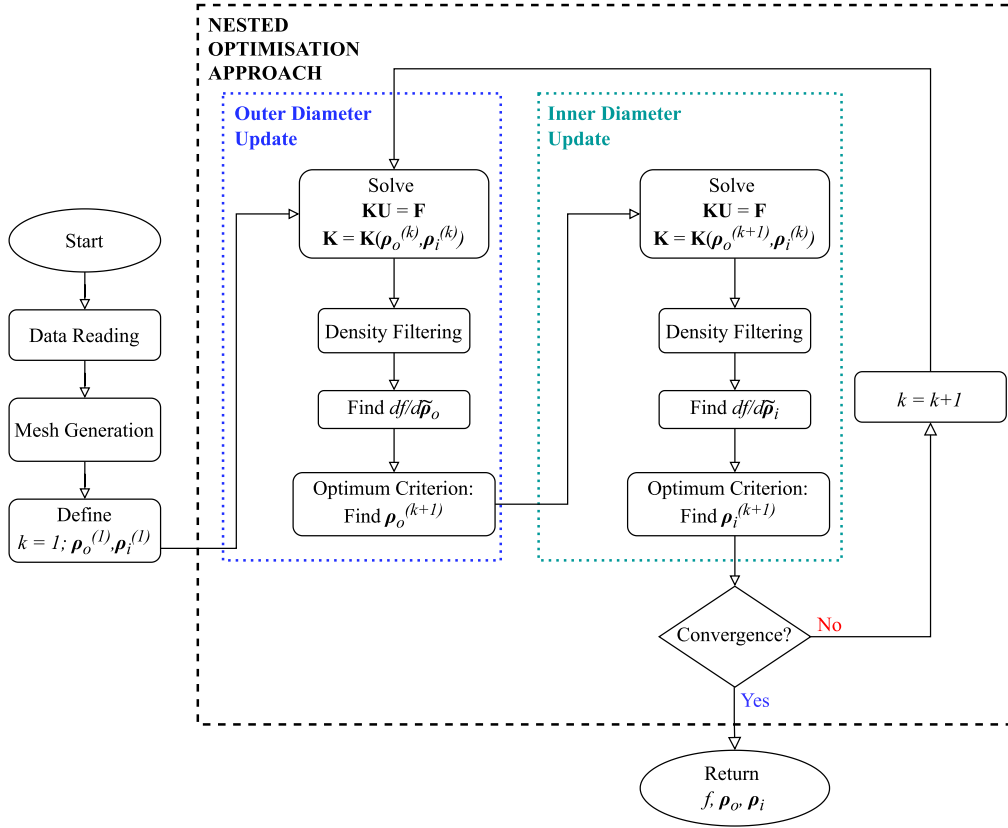


Fig. 3. Flowchart of the optimisation framework depicting the update of outer and inner diameters.

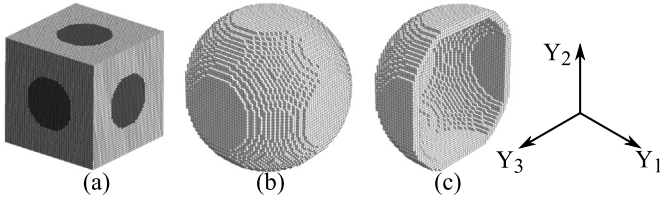


Fig. 4. The FE mesh for the hollow sphere model: (a) complete FE mesh; FE mesh with void elements suppressed for (b) the entire RVE and (c) a cross-section of the RVE.

For all combinations of parameters, the homogenised elasticity tensor has the form of

$$\mathbf{C}^H = \begin{bmatrix} C_{1111}^H & C_{1122}^H & C_{1133}^H & 0 & 0 & 0 \\ & C_{2222}^H & C_{2233}^H & 0 & 0 & 0 \\ & & C_{3333}^H & 0 & 0 & 0 \\ & & & C_{1212}^H & 0 & 0 \\ & & & & C_{2323}^H & 0 \\ & & & & & C_{1313}^H \\ \text{sym.} & & & & & & \end{bmatrix}, \quad (55)$$

in which

$$\begin{aligned} C_{1111}^H &= C_{2222}^H = C_{3333}^H, \\ C_{1122}^H &= C_{1133}^H = C_{2233}^H, \\ C_{1212}^H &= C_{2323}^H = C_{1313}^H, \end{aligned} \quad (56)$$

indicating a cubic symmetry on the material. Thus, the homogenised elasticity tensor is described by 3 independent constants.

For the optimisation procedure, the homogenised elasticity tensor has to be written as a continuous and differentiable function, in the

following form

$$\mathbf{C}^H = \mathbf{C}^H(\rho_o, \rho_i). \quad (57)$$

Thus, the least square method is used to adjust a continuous and differentiable surface based on the data given by the simulations. The Least Square Function is given by

$$\Phi = \sqrt{\sum_{n=1}^{n_s} \left(C_{ijkl}^H(\rho_o^{(n)}, \rho_i^{(n)}) - C_{ijkl}^{(n)} \right)^2}, \quad (58)$$

where n_s is the number of simulations, ρ_o^n and ρ_i^n are, respectively, the external and internal diameters of the hollow sphere at the n th simulation and $C_{ijkl}^{(n)}$ is the value of the component $ijkl$ of the homogenised elasticity tensor at the n th simulation.

A polynomial function is assigned to each independent coefficient and the optimum function is found when

$$\nabla_a \Phi = 0, \quad (59)$$

where $\mathbf{a}$ is the vector containing the coefficients of the function used to approximate the effective properties.

For all components of the homogenised elasticity tensor, the ideal polynomial function is obtained when $R^2 \geq 0.999$ is achieved. The continuous functions for the independent components of the homogenised elasticity tensor are given by

$$\begin{aligned} C_{1111}^H(\rho_i, \rho_o) &= +216.82 \rho_o^3 - 20.83 \rho_i \rho_o^2 - 348.38 \rho_o^2 \\ &\quad - 588.11 \rho_i^2 \rho_o + 847.58 \rho_i \rho_o - 183.31 \rho_o + 326.72 \rho_i^3 - 266.65 \rho_i^2 \\ &\quad - 92.39 \rho_i + 108.94 \text{ [GPa]}, \quad \text{with } R^2 = 0.9998, \end{aligned} \quad (60)$$

$$\begin{aligned} C_{1122}^H(\rho_i, \rho_o) &= +1148.55 \rho_i \rho_o^2 - 671.20 \rho_o^3 + 282.47 \rho_i^3 \\ &\quad + 280.89 \rho_i^2 + 263.22 \rho_i - 833.54 \rho_i \rho_o + 1337.64 \rho_o^2 - 981.53 \rho_i^2 \rho_o \\ &\quad - 1191.81 \rho_o + 366.79 \text{ [GPa]} \quad \text{with } R^2 = 0.9995, \end{aligned} \quad (61)$$

and

$$C_{1212}^H(\rho_i, \rho_o) = -8.13 \rho_o^3 - 2.44 \rho_i \rho_o^2 + 80.76 \rho_o^2 + 22.56 \rho_i^2 \rho_o - 117.16 \rho_i \rho_o - 26.55 \rho_o + 23.46 \rho_i^3 - 81.61 \rho_i^2 + 157.47 \rho_i - 48.40 \text{ [GPa]}, \quad \text{with } R^2 = 0.9999. \quad (62)$$

Furthermore, the optimisation is constrained by the relative density of the structure. Thus, the Least Square Method is used to adjust a continuous function for the relative density of a hollow sphere as a function of the geometric parameters and is given by

$$v(\rho_i, \rho_o) = +0.80 \rho_o^2 + 0.73 \rho_i \rho_o - 0.67 \rho_o - 1.68 \rho_i^2 + 1.00 \rho_i - 0.19, \quad \text{with } R^2 = 0.9998. \quad (63)$$

Equations (60)–(63) are valid for the ranges defined in Eq. (54), and are used in the optimisation problem.

Recent works on AHM show a good agreement with experimental data as well as a better performance compared to other homogenisation methods (see [55–59]). It is important to note that the homogenisation method demands that the size of the RVE is much smaller than the size of the macroscopic domain. As a limit theory, one expects to achieve better results when the relation of Eq. (11) is satisfied.

In addition, the approach used to find effective properties can be extrapolated to any kind of heterogeneous material. Thus, it is possible to derive a set of equations to fit manufacturing constraints, such as the resolution of the domain, the materials used in the manufacturing process, and the geometry of the RVE.

The two main considerations made to simplify the AHM analyses have a couple of drawbacks. The first one considers void elements with degenerated properties in regions without material. The second one is that all elements on the mesh are regular, and thus the geometry of the hollow sphere is depicted as a pixel-like structure. Both considerations significantly increase the computational effort. Void elements contribute to the assembly of the global arrays in the finite element equilibrium and a regular mesh requires a fine discretisation to truly represent the geometry, which is not possible with a coarse mesh.

It is noteworthy to mention that the dimensions of a three-dimensional finite element equilibrium problem increase in the third power with the number of elements in the mesh. This leads to an expensive computational effort and makes the solution to these problems the most computationally demanding part of the algorithm. On the other hand, for complex geometries, such as the ones considered, the mesh generation and the application of periodic boundary conditions are the most challenging parts to implement. Consequently, the considerations to simplify the procedure are used even if they significantly affect the processing time.

An alternative to avoid this high computational effort is either using external software for mesh generation or algorithms implemented alongside commercial software (see [43,60]). However, for both AHM and optimisation procedures, it is important to have full control and access to all variables in the finite element algorithms, mainly because the local arrays have to be manipulated, which is not always possible with external commercial software.

4.2. Optimisation results

The optimum distribution of hollow spheres to minimise structural compliance is considered and the problem is constrained by a maximum admissible relative density of the structure. Four cases are chosen to investigate the proposed formulation. Distinct relative densities, boundary conditions, and geometrical parameters are considered and discussed. The nomenclature and definitions for each case are shown in Table 2. The design variables associated with each element on the mesh are the outer and inner diameters of a hollow sphere. The update of the design variables is made through Eq. (48). The mechanical properties

Table 2

Nomenclature and definitions for the optimisation cases. The normalised dimension L_i and the number of finite elements N_i are used in direction x_i , domain and load definitions, and admissible relative density. $a > 0.0$.

Case	x_1		x_2		x_3		Domain	Relative density [%]
	L_1	N_1	L_2	N_2	L_3	N_3		
cb_1	10a	200	a	20	a	20	Fig. 2(a)	5 & 10
cb_2	8a	160	5a	100	a	10	Fig. 2(c)	5
3pb_1	10a	200	a	20	a	20	Fig. 2(b)	5 & 10
3pb_2	8a	160	5a	100	a	10	Fig. 2(d)	5

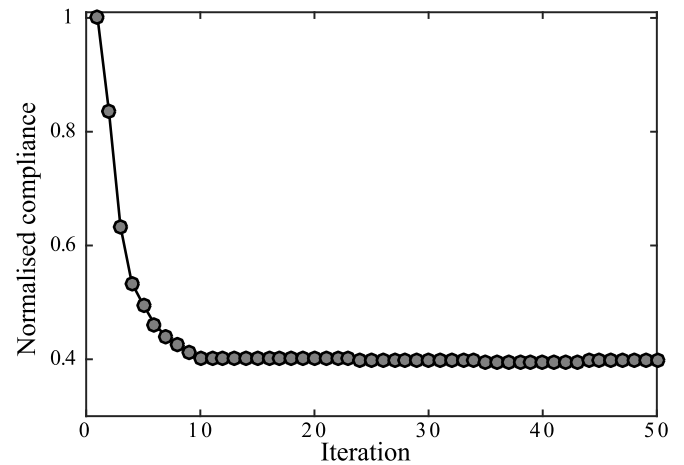


Fig. 5. Convergence plot for the cb_1 case.

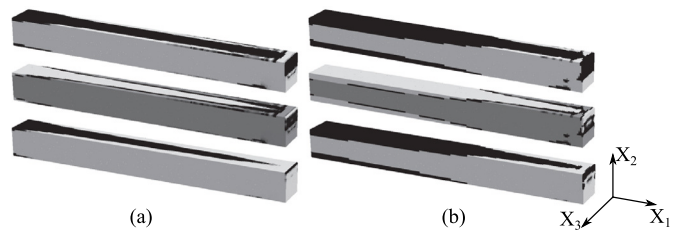


Fig. 6. Optimum distribution of hollow spheres for the case cb_1. External diameter, internal diameter and relative density for cases with (a) $\bar{V} = 5\%$, and (b) $\bar{V} = 10\%$. A linear scale is assumed between the minimum admissible value (light grey) and the maximum admissible value (black) for the considered variables.

and the relative density, as functions of the design variables, are given in Eqs. (60)–(63), and their derivatives are obtained explicitly.

The filtering radius, for all cases, comprises 4 adjacent elements on the mesh. No mesh dependency was observed for the discretisation used in all cases. The visualisation of the results is made using Gmsh software [61].

A convergence analysis of the objective function is shown in Fig. 5 for the cb_1 optimisation case. The compliance is normalised by its value in the first iteration. In this case, the compliance is calculated at the end of each global step of the optimisation procedure, meaning that both design variables are updated to obtain the value of the objective function. All optimisation cases follow the same convergence behaviour, therefore only one plot is presented as it is representative of all cases. Furthermore, the convergence is monotonic, which shows the consistency of the implemented algorithm.

For the visualisation of the optimal distribution of hollow spheres, both design variables are presented separately and represented in a linear grayscale. Black regions represent the maximum admissible value for a design variable, whilst light grey regions represent the minimum allowed value. In addition, as the relative density is a combination of outer and inner diameters, it is easier to analyse the results with the

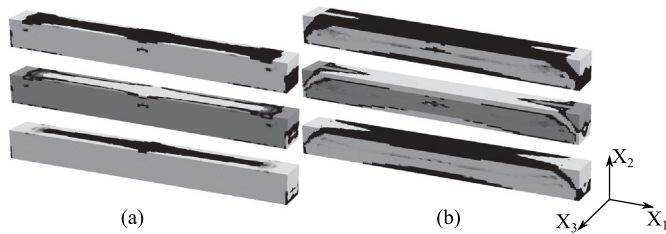


Fig. 7. Optimum distribution of hollow spheres for the case 3pb_1. External diameter, internal diameter and relative density for cases with (a) $\bar{V} = 5\%$, and (b) $\bar{V} = 10\%$. A linear scale is considered between the minimum admissible value (light grey) and the maximum admissible value (black) for the considered variables.

volume fraction alone instead of analysing both external and internal diameters separately. The optimum distribution of the relative density for each element of the mesh is also shown in the same linear grayscale.

The efficiency of the proposed multiscale approach is made by quantitative and qualitative analyses. Initially, the distribution of design variables and relative densities are compared for the same case using different admissible global relative densities for the structures. Thus, one can verify that the patterns of material distribution within the domain are the same, regardless of the admissible relative density. As a quantitative comparison, the compliance of the same structure, now with a homogeneous distribution of hollow spheres with the same global relative density is presented. With this comparison, it is possible to measure the reduction of compliance for optimised structures with the structure made of a homogeneous distribution of hollow spheres. As a qualitative comparison, the classical 0 – 1 SIMP [52] approach is presented for the same cases. This comparison is made to verify that the patterns of material distribution are the same for both cases. As the same physical problem is addressed for both approaches, it is expected that the regions with hollow spheres with a higher relative density, consequently a higher stiffness, are the same that those regions with material in the classical SIMP approach.

Figs. 6 and 7 show the distribution of design variables and relative densities for cases cb_1 and 3pb_1, respectively, for admissible global relative densities of 5% and 10%. The distribution of design variables is consistent with a maximum allowed relative density of 5% and 10% since the same patterns are observed. This indicates consistency in the results as the patterns of material distribution should not change regardless of the maximum assumed relative density. The difference between the results obtained for the different admissible relative densities is the amount of material in the same regions of the domain. Also, the results are compatible with the beam theory, as the distribution of material, for both cases, occurs in the regions where the highest stresses are expected, i.e., in regions with the highest bending moments and distant from the neutral axis.

Table 3 shows quantitative comparisons for all cases, where the optimised results are compared to the compliance obtained by a homogeneous distribution of hollow spheres defined by ρ_o^h and ρ_i^h . For all cases, a significant reduction in compliance is observed, with values ranging from 42% to 79%.

For the cases cb_1 and 3pb_1, relative densities of 5% and 10% are considered. In those cases, the higher the admissible relative density, the higher the compliance reduction. Since all elements have the same relative density (homogeneous distribution cases), regions that barely affect compliance still have a high relative density. On the other hand, for the optimised results, regions that are not significant to compliance are occupied by elements with a low relative density. This behaviour is intensified when higher admissible relative densities are considered.

Moreover, the higher the outer diameter, the lower the compliance minimisation. This is expected since the flat area connecting two adjacent spheres is a function of the outer sphere, and for a higher outer diameter, this region is larger, thus there is more material

connecting the hollow spheres, hence increasing the overall stiffness of that particular region. This behaviour is observed in all cases.

Figs. 8–11 show, for all cases, a qualitative comparison for the optimum distribution of material using SIMP. The results show the optimum distribution of maximum allowed relative density, that is, the elements that contribute more to the minimisation of the compliance remain in the optimised topology towards minimising their compliance.

In a cantilever beam, when bending dominates the problem, some considerations concerning the stiffness of the structure can be made. The bending moment is the highest at the cantilever and it has a null value on the opposite side, where the load is applied. Sections in which the bending moment is higher are more susceptible to higher displacements, rendering the beam in these sections to be more flexible.

Considering the cross-section of a beam, the moment of inertia increases when more material is added to the regions away from the neutral axis of the section. The higher the moment of inertia of a section, the lesser its flexibility. Adding material to regions close to the neutral axis barely modifies the moment of inertia of a given section.

One can see that, for both cases, the optimisation procedure leads to topologies in which there is a concentration of material close to the cantilever, alongside material in the regions away from the neutral axis. These facts show a consistency of the results with the physical aspect of the problem.

The structure obtained with SIMP follows the same principles of hollow sphere structures. It can be seen that material is added to regions closer to the cantilever and, at the cross-section, in the regions far from the neutral axis. The main difference between the two approaches is that, for the SIMP case, there are solid connections between the upper and lower regions of the beam since void regions do not provide stiffness to the structure. Here, it is not necessary to connect the two regions with spheres with a high relative density since even spheres with low relative density can provide stiffness to the structure. With this consideration, it is clear that the algorithm is concerned with adding material to the most significant regions of the domain.

On the other hand, for the 3-point bending cases, the highest bending moment is at the central section and the lowest is near the supports. Concerning the moment of inertia, the same considerations of the cantilever beam cases apply. Thus, the optimisation procedure leads to a material distribution in which there is more material close to the central part of the beam. Also, the hollow spheres with higher relative density, consequently higher stiffness, are concentrated at the upper and lower parts of the beam, which complies with the beam theory for a beam under 3-point bending load.

As the hollow spheres with lower relative densities also add stiffness to the structure, they can be used to join the upper and lower parts of the beam, letting the material with higher stiffness be placed only at places with a higher bending moment and at regions in which the moment of inertia is increased, thus reducing the overall relative density of the optimised structure.

The comparison of the proposed problem with the classical SIMP approach shows consistency. In both cases, an arc is formed to provide higher stiffness for the structures. It is important to highlight that, in the SIMP case, the arc must be joined with the straight section, and radial reinforcements appear, otherwise, the structure would not present a proper stiffness.

For the hollow sphere case, the material in the interior of the arc still provides stiffness to the structure, while rendering is not necessary to connect the arc to the region where the load is applied with hollow spheres with high relative density. The reinforcement that appears in the hollow sphere case allows the load to be homogeneously distributed in the regions inside the arc, allowing material with a low relative density to be used in this region.

Table 3

Compliance reduction for optimised and homogeneous distributions of hollow spheres of same relative density ($\bar{V}$) for all cases. Homogeneous distributions are defined by ρ_o^h and ρ_i^h .

Case	Homogeneous structures				Optimised structures			
	Sample	ρ_o^h	ρ_i^h	$\bar{V}[\%]$	Compliance [N mm]	Sample	Compliance [N mm]	Compliance reduction [%]
cb_1	h1	1.2	1.1767	5	639.20	o	347.99	45.56
	h2	1.15	1.1252		831.88			58.17
	h3	1.10	1.0730		1183.99			70.61
cb_1	h1	1.2	1.1520	10	317.57	o	120.67	62.00
	h2	1.15	1.0987		372.36			67.59
	h3	1.10	1.0443		456.28			73.55
cb_2	h1	1.2	1.1767	5	9.18	o	4.14	54.90
	h2	1.15	1.1252		11.68			64.56
	h3	1.10	1.0730		16.08			74.25
3pb_1	h1	1.2	1.1767	5	41.21	o	23.56	42.83
	h2	1.15	1.1252		53.47			55.94
	h3	1.10	1.0730		73.83			68.09
3pb_1	h1	1.2	1.1520	10	20.49	o	8.75	57.30
	h2	1.15	1.0987		23.96			63.48
	h3	1.10	1.0443		29.28			70.12
3pb_2	h1	1.2	1.1767	5	3.02	o	1.08	64.24
	h2	1.15	1.1252		3.84			71.88
	h3	1.10	1.0730		5.19			79.19

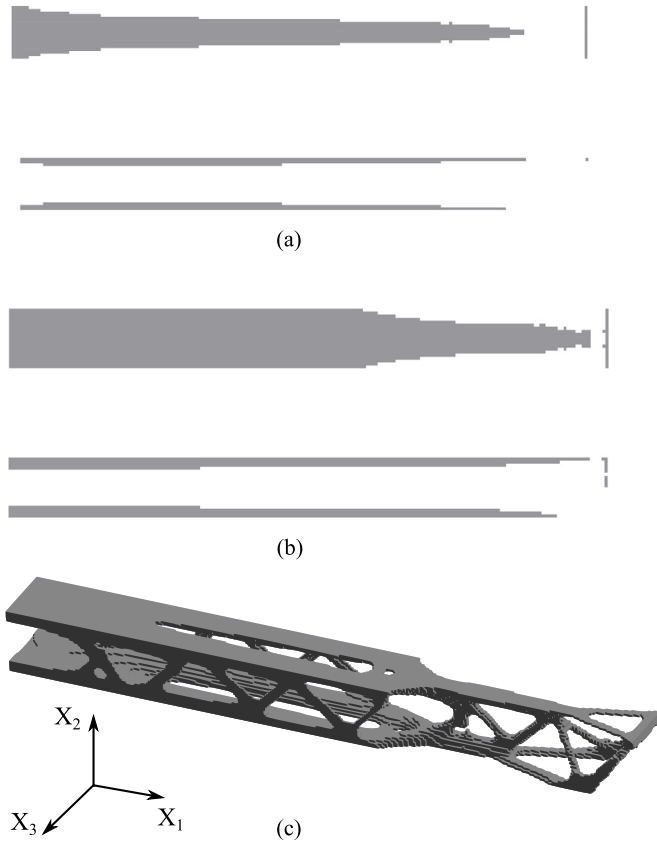


Fig. 8. Qualitative comparison for case cb_1 between the optimised distribution of relative densities for (a) $\bar{V} = 5\%$, (b) $\bar{V} = 10\%$, and (c) the optimum distribution of material using SIMP.

5. Experimental validation

Some hollow sphere structures with different dimensions were manufactured to demonstrate the feasibility of constructing the models and the possibility of manufacturing the spheres when a range of different

geometrical features is considered, and also by varying the dimensions of the structure. The topologies of the hollow spheres are obtained directly from the FE mesh of the homogenisation procedure (see Fig. 4). The FE mesh contains information about the nodes and connectivities of every node on the mesh. As most commercial additive manufacturing (AM) processes use STL file format as default, an in-house code was developed to convert the FE data into an STL file. The void elements are removed during this process. The smoothing of the geometries is carried out on MeshLab [62] using the Laplacian Smooth Algorithm [63]. The complete procedure to generate the STL files can be seen in Ref. [64].

All spheres are produced by AM by using a 3D printer from Form-Labs, model Form3, which utilises the stereolithography (SLA) principle. Here, Clear[®] resin, a photo-polymerising resin has been used, which polishes to near optical transparency, ideal for showcasing internal features. The parts are printer layer-by-layer with a layer thickness of 100 μm . After the printing is finished, the parts are washed in a Form Wash chamber with isopropyl alcohol (IPA) bath for 15 min, followed by curing in a Form Cure oven at 65 $^{\circ}\text{C}$ for 60 min, in which the parts sit on a rotating turntable.

In Fig. 12, the design variables of the hollow spheres are varied, where both non-smooth and smooth geometries are shown. Fig. 12(a)–(b) show a homogeneous distribution of the spheres. It can be seen that the smoothing of the geometry can maintain the geometry of the structure with high accuracy. In Fig. 12(c)–(d), a variation in the internal diameters is considered. Four different internal diameters are considered, with $\rho_i^{(1)} > \rho_i^{(2)} > \rho_i^{(3)} > \rho_i^{(4)}$, showing that this type of structure can be manufactured with thin walls. Fig. 12(e)–(f) shows the

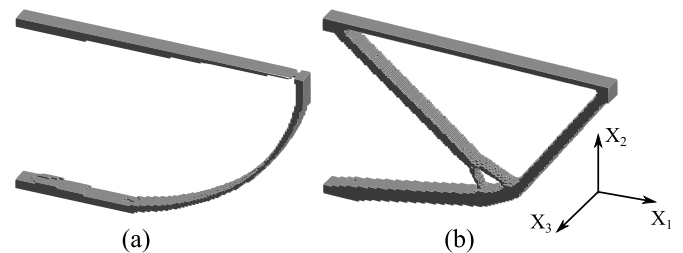


Fig. 9. Qualitative comparison for case cb_2 between the optimised distribution of relative densities for cases (a) $\bar{V} = 5\%$ and (b) the optimum distribution of material using SIMP.

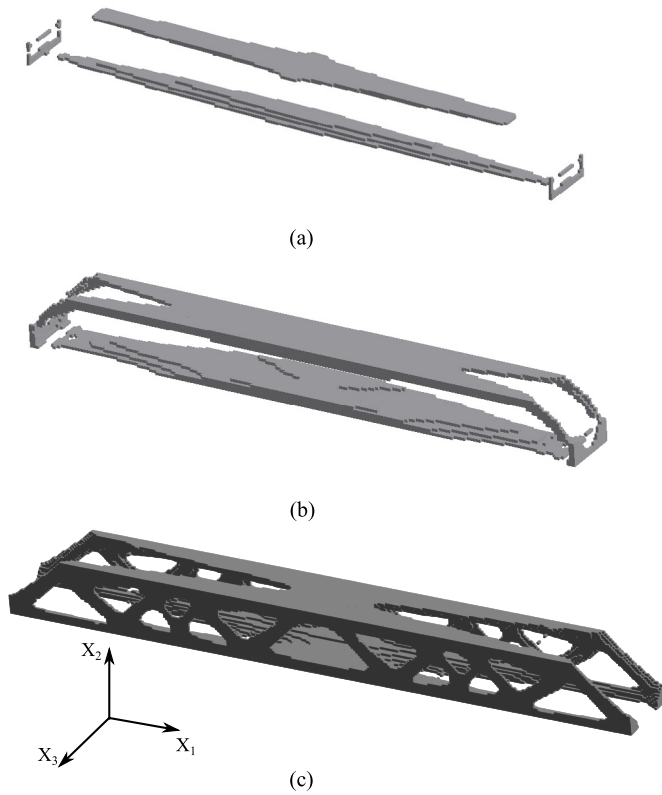


Fig. 10. Qualitative comparison for case 3pb_1 between the optimised distribution of relative densities for (a) $\bar{V} = 5\%$, (b) $\bar{V} = 10\%$, and (c) the optimal distribution of material using SIMP.

variation of the external diameters of the hollow spheres. It can be seen that the higher the diameters considered, the higher the contact area between two adjacent hollow spheres.

In Fig. 13, samples with different sizes and numbers of hollow spheres are shown. Structures with 16, 512, and 128 spheres were printed, which demonstrates the feasibility of using this type of material. It is then demonstrated that it is possible to manufacture this type of structure strictly following the proposed design variables, that is, it is feasible to produce samples by varying both the internal and external radii of the hollow spheres. Moreover, it is demonstrated that the number and size of the spheres can be varied in the manufacturing process without losing quality and resolution and that it is feasible to obtain structures comprised of small hollow spheres, which depends only on the resolution of the used equipment. In this way, it is possible to manufacture samples with an optimised distribution of hollow spheres without violating the conditions imposed by the AHM to determine the effective properties of the medium.

Once the spheres are proven to be manufacturable, both homogeneous and optimised structures (see 3) are 3D-printed. The cases 3pb_1 with $\bar{V} = 10\%$ (see Fig. 2(b)) and 3pb_2 (see Fig. 2(d)) are considered for manufacturing and testing. For each case, the three homogeneous and the optimised structures were 3D-printed. The 3pb_1 structures have dimensions of $40 \times 4 \times 4 \text{ mm}^3$, whereas 3pb_2 is 24-mm long, 15-mm high, and 3-mm wide. Three samples of each case are printed to provide statistical significance to the data.

The samples are then tested under 3-point bending using a LLoyd universal testing machine at a speed of 0.5 mm/min. Since the optimisation aimed to minimise compliance, the 3-point bending tests are performed in the linear-elastic regime of the structures, therefore, a load of 30 N is applied to all samples, ensuring small displacements and strains, and non-viscous influences. Fig. 14 shows the two 3-point

bending testing cases, where the small visible dimples are a result of the supports needed to print cavities in 3D. These dimples do not affect the mechanical performance of the structure.

The structural stiffness of the structures is then presented in Fig. 15. The results show the same trend observed in the computational results (Table 3) for both 3pb_1 and 3pb_2 cases, where the thicker the spheres the higher the stiffness ($h_1 > h_2 > h_3$). For both cases, the optimised structures, which have spheres with thickness locally-optimised, outperform the homogeneous ones at the same relative density. The optimised structure o_3pb_1 has a stiffness 22.8%, 30.5%, and 49.9% higher than h1_3pb_1, h2_3pb_1, and h3_3pb_1 respectively, whilst the sample o_3pb_2 has a stiffness gain of 28.7%, 38.1%, and 48.4% compared to h1_3pb_2, h2_3pb_2, and h3_3pb_2, respectively.

As depicted in Fig. 15, the structural stiffness is presented as a box plot, with the purpose to show the statistical relevance of the data showing the median (on top of the boxes), standard deviation (box height), range, median line, and quartiles. It is evident that the data is statistically relevant and there is significant difference between the cases. Also, all the data lie within the 25th and 75th percentiles, ensuring good reliability for both the manufacturing process and testing procedures.

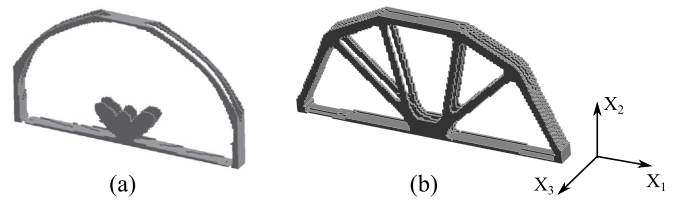


Fig. 11. Qualitative comparison for case 3pb_2 between the optimised distribution of relative densities for (a) $\bar{V} = 5\%$ and (b) the optimum distribution of material using SIMP.

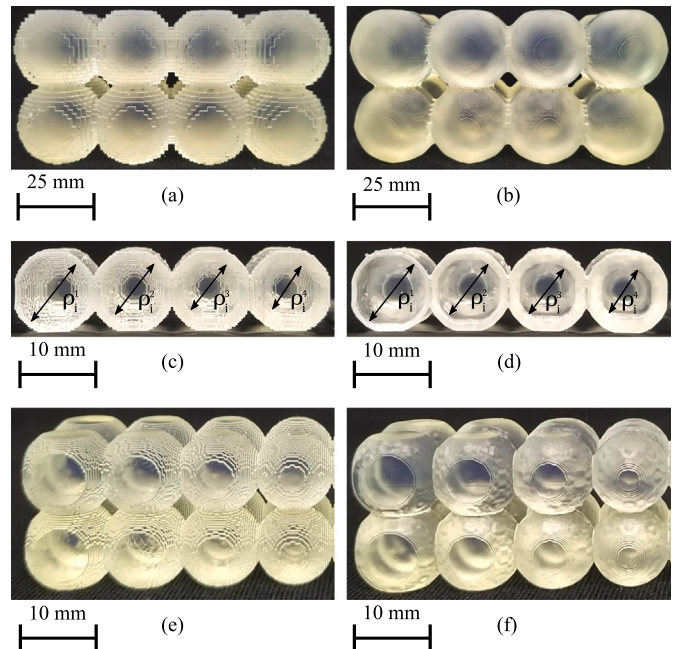


Fig. 12. Variation of geometrical parameters of the printed hollow sphere structures. Homogeneous distribution with (a) non-smooth geometry and (b) smooth geometry. Variation of the internal diameter for (c) non-smooth geometry, and (d) smooth geometry. Variation of the external diameter for (e) non-smooth geometry, and (f) smooth geometry.

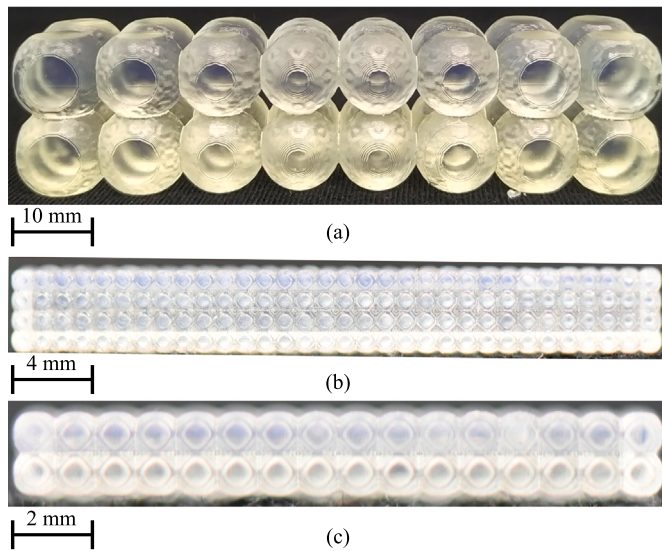


Fig. 13. Variation on the size and number of hollow spheres. The structures were printed with (a) 16, (b) 512, and (c) 128 spheres.

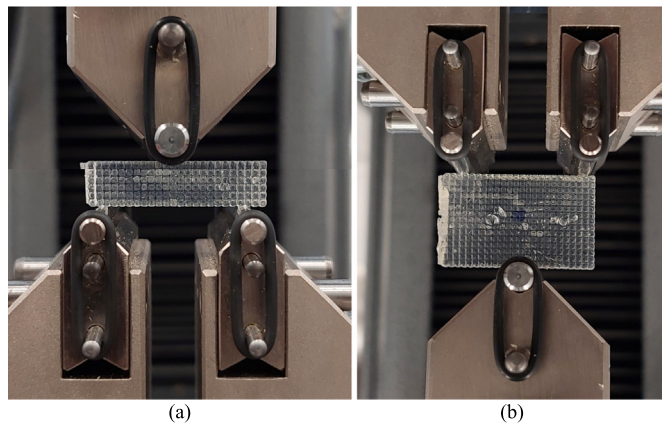


Fig. 14. The 3-point bending tests: cases (a) 3pb_1 and (b) 3pb_2.

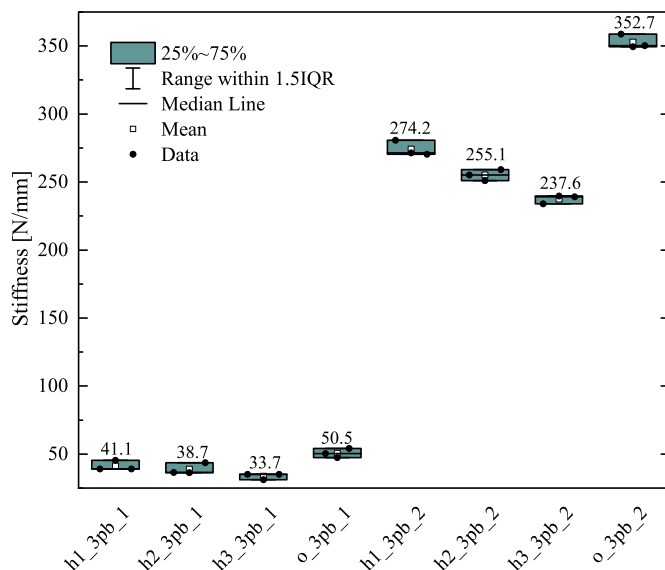


Fig. 15. Box plot of the experimental structural stiffness for cases 3pb_1 (with $\bar{v} = 10\%$) and 3pb_2.

6. Conclusion

In this work, a multiscale optimisation framework to find the distribution of hollow-sphere materials has been developed. The effective mechanical properties are obtained by the Asymptotic Homogenisation Method and written as a function of the geometrical parameters of a single hollow sphere. The topology optimisation procedure is an adaptation of the SIMP method. The objective function for all cases is compliance minimisation and the relative density of the structure is used as a constraint. A cantilever beam and a 3-point bending beam are considered as design domains, and relative densities of 5%, and 10% are considered. The structures are then experimentally validated from both the manufacturing and testing perspectives.

Two comparisons are performed to validate the proposed multiscale approach. As a quantitative comparison, the optimised structures are compared to structures formed by a homogeneous distribution of hollow spheres with the same relative density. Compliance reductions between 42% and 79% are reached. Qualitatively, the optimised structures are compared to an optimal distribution of material using the SIMP approach. In both cases, the distribution of the material in the domain follows the same pattern, validating the originally proposed framework. In the regions where there is material for the SIMP material model, the developed algorithm adds hollow spheres with high volume fraction. In contrast, for regions with no material in the SIMP material model, the algorithm uses a material with a low volume fraction. These comparisons show the efficiency of the proposed multiscale approach to optimise the stiffness of hollow sphere structures.

The feasibility of the proposed approach is tested by additively manufacturing hollow spheres to show how the thickness of the spheres is locally optimised in an accurate way. Hollow spheres are 3D-printed by varying their design variables, as well as the number and size of hollow spheres, thus indicating that it is feasible to design, optimise, and manufacture such structures without losing quality and resolution. In addition, homogeneous and optimised structures were 3D-printed and tested in 3-point bending. Optimised structures showed to have superior structural stiffness than the homogeneous ones at the same relative density, demonstrating the efficacy of the proposed multiscale optimisation framework to maximise the stiffness of hollow sphere structures.

CRediT authorship contribution statement

Bruno G. Christoff: Conceptualization, Methodology, Software, Formal analysis, Investigation, Data curation, Writing – original draft, Visualisation. **José Humberto S. Almeida Jr.:** Methodology, Validation, Formal analysis, Investigation, Data curation, Writing – original draft, Funding acquisition. **Eduardo L. Cardoso:** Conceptualization, Methodology, Formal analysis, Resources, Writing – review & editing, Supervision. **Volnei Tita:** Writing – review & editing, Project administration.

Data availability

Data will be made available on request.

Acknowledgements

HA is supported by the Royal Academy of Engineering, United Kingdom under the Research Fellowship scheme [Grant No. RF/201920/19/150]; ELC thanks CNPq, Brazil (process number 303900/2020-2) and FAPESC, Brazil (process number 2021TR843); VT acknowledges CNPq, Brazil (process No. 310656/2018-4), CAPES-FCT, Brazil (No. AUXPE 88881.467834/2019-01 - Finance Code 001), and FAPESP-FAPERGS, Brazil (process number: 2019/15179-2 and 19/2551).

Appendix. Sensitivity analyses

For simplicity, the dependency of the arrays on the design variables is suppressed. The derivatives of the compliance, with respect to the q th design variable, are given by

$$\frac{\partial f}{\partial \rho_q} = -\mathbf{U}^T \frac{\partial \mathbf{K}}{\partial \rho_q} \mathbf{U} \quad (\text{A.1})$$

and the local stiffness matrix is

$$\mathbf{K}^{(e)} = \int_{\Omega^{(e)}} \mathbf{B}^{T(e)} \mathbf{C}^{(e)} \mathbf{B}^{(e)} d\Omega^{(e)}, \quad (\text{A.2})$$

where $\mathbf{B}^{(e)}$ and $\mathbf{C}^{(e)}$ are, respectively, the strain–displacement matrix and the elasticity tensor of the e th element of the mesh. The derivatives of the local stiffness matrix are obtained through

$$\frac{\partial \mathbf{K}^{(e)}}{\partial \rho_q} = \int_{\Omega^{(e)}} \mathbf{B}^{T(e)} \frac{\partial \mathbf{C}^{(e)}}{\partial \rho_q} \mathbf{B}^{(e)} d\Omega^{(e)}, \quad (\text{A.3})$$

and the derivatives of the global stiffness matrix through

$$\frac{\partial \mathbf{K}}{\partial \rho_q} = \bigoplus_{e=1}^{N_e} \frac{\partial \mathbf{K}^{(e)}}{\partial \rho_q} = \bigoplus_{e=1}^{N_e} \int_{\Omega^{(e)}} \mathbf{B}^{T(e)} \frac{\partial \mathbf{C}^{(e)}}{\partial \rho_q} \mathbf{B}^{(e)} d\Omega^{(e)}. \quad (\text{A.4})$$

As the constitutive tensor of a given element e depends only on the design variables associated with that element, it is possible to state that

$$\frac{\partial \mathbf{C}^{(e)}}{\partial \rho_q} = \delta_{eq} \frac{\partial \mathbf{C}^{(e)}}{\partial \rho_q}, \quad (\text{A.5})$$

where δ_{eq} is the Kronecker delta. The derivatives of the compliance with respect to the q th element of the mesh can thus be written in terms of the local arrays as

$$\frac{\partial f}{\partial \rho_q} = \mathbf{u}^{T(q)} \left[\int_{\Omega^{(q)}} \mathbf{B}^{T(q)} \frac{\partial \mathbf{C}^{(q)}}{\partial \rho_q} \mathbf{B}^{(q)} d\Omega^{(q)} \right] \mathbf{u}^{(q)}, \quad (\text{A.6})$$

where $\mathbf{u}^{(q)}$ is the displacement vector of the q th element of the mesh.

Similarly, the relative density $v^{(e)}$ of an element e , is also dependent on the internal and external diameters of the hollow sphere, such that

$$v^{(e)} = v^{(e)}(\rho_o^{(e)}, \rho_i^{(e)}), \quad (\text{A.7})$$

and the global relative density is given by

$$V = \sum_{e=1}^{N_e} v^{(e)}, \quad (\text{A.8})$$

with derivatives given by

$$\frac{\partial V}{\partial \rho_q} = \sum_{e=1}^{N_e} \frac{\partial v^{(e)}}{\partial \rho_q}. \quad (\text{A.9})$$

As the derivatives of a given element depend only on the design variables associated with it, one can write

$$\frac{\partial V}{\partial \rho_q} = \sum_{e=1}^{N_e} \delta_{eq} \frac{\partial v^{(e)}}{\partial \rho_q} = \frac{\partial v^{(q)}}{\partial \rho_q}. \quad (\text{A.10})$$

Eqs. (A.6) and (A.10) are valid for both outer and inner diameters associated to the q th element of the mesh.

References

- [1] Lehmhus D, Busse M, Herrmann A, Kayvantash K. *Structural materials and processes in transportation*. John Wiley & Sons; 2013.
- [2] Xu F, Zhang X, Zhang H. A review on functionally graded structures and materials for energy absorption. *Eng Struct* 2018;171:309–25. <http://dx.doi.org/10.1016/j.engstruct.2018.05.094>.
- [3] Grenestedt JL. Effective elastic behavior of some models for perfect cellular solids. *Int J Solids Struct* 1999;(36):1471–501. [http://dx.doi.org/10.1016/S0020-7683\(98\)00048-1](http://dx.doi.org/10.1016/S0020-7683(98)00048-1).
- [4] Kuczewicz M, Baranowski P, Stankiewicz M, Konarzewski M, Platek P, Małachowski J. Modelling and testing of 3D printed cellular structures under quasi-static and dynamic conditions. *Thin-Walled Struct* 2019;145:106385. <http://dx.doi.org/10.1016/j.tws.2019.106385>.
- [5] Gibson LJ, Ashby MF. *Cellular solids - structure and properties*. Cambridge: Cambridge University Press; 1997.
- [6] Luxner MH. *Modeling and simulation of highly porous open cell structures - elasto-plasticity and localization versus disorder and defects*. VDI Verlag; 2006.
- [7] Evans AG, Hutchinson J, Ashby M. Multifunctionality of cellular metal systems. *Prog Mater Sci* 1998;43(3):171–221. [http://dx.doi.org/10.1016/S0079-6425\(98\)00004-8](http://dx.doi.org/10.1016/S0079-6425(98)00004-8).
- [8] Fiedler T, Belova I, Murch G. Critical analysis of the experimental determination of the thermal resistance of metal foams. *Int J Heat Mass Transfer* 2012;55(15):4415–20. <http://dx.doi.org/10.1016/j.jheatmasstransfer.2012.04.010>.
- [9] Zhao C. Review on thermal transport in high porosity cellular metal foams with open cells. *Int J Heat Mass Transfer* 2012;55(13):3618–32. <http://dx.doi.org/10.1016/j.jheatmasstransfer.2012.03.017>.
- [10] Han F, Seiffert G, Zhao Y, Gibbs B. Acoustic absorption behaviour of an open-celled aluminium foam. *J Phys D: Appl Phys* 2003;36(3):294. <http://dx.doi.org/10.1088/0022-3727/36/3/312>.
- [11] Golovin I, Sinning H-R. Damping in some cellular metallic materials. *J Alloys Compd* 2003;355(1):2–9. [http://dx.doi.org/10.1016/S0925-8388\(03\)00241-X](http://dx.doi.org/10.1016/S0925-8388(03)00241-X).
- [12] Tita V, Caliri Júnior MF. Numerical simulation of anisotropic polymeric foams. *Latin Am J Solids Struct* 2012;9:1–21. <http://dx.doi.org/10.1590/S1679-78252012000200005>.
- [13] Caliri Júnior MF, Soares GP, Angélico RA, Canto RB, Tita V. Study of an anisotropic polymeric cellular material under compression loading. *Mater Res* 2012;15:359–64. <http://dx.doi.org/10.1590/S1516-14392012005000034>.
- [14] Li Q, Zhi X, Fan F. Dynamic crushing of uniform and functionally graded origami-inspired cellular structure fabricated by SLM. *Eng Struct* 2022;262:114327.
- [15] Menon HG, Dutta S, Krishnan A, Hariprasad M, Shankar B. Proposed auxetic cluster designs for lightweight structural beams with improved load bearing capacity. *Eng Struct* 2022;260:114241.
- [16] Xu S, Bourham M, Rabiei A. A novel ultra-light structure for radiation shielding. *Mater Des* 2010;31(4):2140–6. <http://dx.doi.org/10.1016/j.matdes.2009.11.011>.
- [17] Losito O, Barletta D, Dimiccoli V. A wide-frequency model of metal foam for shielding applications. *IEEE Trans Electromagn Compat* 2010;52(1):75–81. <http://dx.doi.org/10.1109/TEM.2009.2035109>.
- [18] Borges TE, Almeida Junior JHS, Amico SC, Amado FDR. Hollow glass micro-spheres/piassava fiber-reinforced homo- and co-polypropylene composites: preparation and properties. *Polym Bull* 2014;74(6). <http://dx.doi.org/10.1007/s00289-016-1819-8>.
- [19] Tsantilis AV, Triantafyllou TC. Innovative seismic isolation of masonry infills using cellular materials at the interface with the surrounding RC frames. *Eng Struct* 2018;155:279–97. <http://dx.doi.org/10.1016/j.engstruct.2017.11.025>.
- [20] Correa de Faria C, Carvalho H, Hallal Fakury R, Figueiredo Grilo L. Lateral-torsional buckling resistance of cellular steel beams at room temperature and fire situation. *Eng Struct* 2021;237:112046. <http://dx.doi.org/10.1016/j.engstruct.2021.112046>.
- [21] Li Q, Zhi X, Fan F. Dynamic crushing of uniform and functionally graded origami-inspired cellular structure fabricated by SLM. *Eng Struct* 2022;262:114327. <http://dx.doi.org/10.1016/j.engstruct.2022.114327>.
- [22] Wen S, Liu H, Chen Z, Ying J. Ultimate bearing behavior of H-beam welded hollow spheres under eccentric compression. *Eng Struct* 2020;212:110522. <http://dx.doi.org/10.1016/j.engstruct.2020.110522>.
- [23] Song J, Hu D, Luo S, Liu W, Wang D, Sun Q, Zhang G. Energy-absorption behavior of metallic hollow sphere structures under impact loading. *Eng Struct* 2021;226:111350. <http://dx.doi.org/10.1016/j.engstruct.2020.111350>.
- [24] Ferreira FPV, Tsavdaridis KD, Martins CH, De Nardin S. Composite action on web-post buckling shear resistance of composite cellular beams with PCHCS and PCHSCT. *Eng Struct* 2021;246:113065. <http://dx.doi.org/10.1016/j.engstruct.2021.113065>.
- [25] Li D, Kong L-H, Qian Y-C. On compacting pattern control of finite-size 2D soft periodic structures through combined loading. *Eng Struct* 2022;266:114574. <http://dx.doi.org/10.1016/j.engstruct.2022.114574>.
- [26] Sanders W, Gibson L. Mechanics of hollow sphere foams. *Mater Sci Eng A* 2003;347(1):70–85. [http://dx.doi.org/10.1016/S0921-5093\(02\)00583-X](http://dx.doi.org/10.1016/S0921-5093(02)00583-X).
- [27] Augustin C, Hungerbach W. Production of hollow spheres (HS) and hollow sphere structures (HSS). *Mater Lett* 2009;63(13):1109–12. <http://dx.doi.org/10.1016/j.matlet.2009.01.015>.
- [28] Waag U, Schneider L, Lothman P, Stephani G. Metallic hollow spheres-materials for the future. *Metal Powder Rep* 2000;55(1):29–33. [http://dx.doi.org/10.1016/S0026-0657\(00\)87339-7](http://dx.doi.org/10.1016/S0026-0657(00)87339-7).
- [29] Kalamar R, Bedon C, Eliášová M. Assessing the structural behaviour of square hollow glass columns subjected to combined compressive and impact loads via full-scale experiments. *Eng Struct* 2017;143:127–40. <http://dx.doi.org/10.1016/j.engstruct.2017.04.016>.
- [30] Liu H, Zhang Y, Wang L, Zhao Y, Chen Z. Mechanical performance of welded hollow spherical joints with H-beams after elevated temperatures. *Eng Struct* 2020;222:111092. <http://dx.doi.org/10.1016/j.engstruct.2020.111092>.
- [31] Gasser S, Paun F, Cayzele A, Bréchet Y. Uniaxial tensile elastic properties of a regular stacking of brazed hollow spheres. *Scr Mater* 2003;48(12):1617–23. [http://dx.doi.org/10.1016/S1359-6462\(03\)00139-8](http://dx.doi.org/10.1016/S1359-6462(03)00139-8).

- [32] Marcadon V, Feyel F. Modelling of the compression behaviour of metallic hollow-sphere structures: About the influence of their architecture and their constitutive material's equations. *Comput Mater Sci* 2009;47(2):599–610. <http://dx.doi.org/10.1016/j.compmatsci.2009.10.002>.
- [33] Yan X, Duan Y, Zhang Y, Chen Z, Zhang Q. Study on compressive bearing capacity and axial stiffness of welded hollow spherical joints with H-shaped steel member. *Eng Struct* 2020;203:109821. <http://dx.doi.org/10.1016/j.engstruct.2019.109821>.
- [34] Hosseini SMH, Merkel M, Öchsner A. Finite element simulation of the thermal conductivity of perforated hollow sphere structures (PHSS): Parametric study. *Mater Lett* 2009;63(13):1135–7. <http://dx.doi.org/10.1016/j.matlet.2008.10.009>.
- [35] Solórzano E, Rodríguez-Pérez M, de Saja J. Thermal conductivity of metallic hollow sphere structures: An experimental, analytical and comparative study. *Mater Lett* 2009;63(13):1128–30. <http://dx.doi.org/10.1016/j.matlet.2008.11.051>.
- [36] Fiedler T, Löffler R, Bernthaler T, Winkler R, Belova I, Murch G, Öchsner A. Numerical analyses of the thermal conductivity of random hollow sphere structures. *Mater Lett* 2009;63(13):1125–7.
- [37] Marcadon V. Mechanical modelling of the creep behaviour of hollow-sphere structures. *Comput Mater Sci* 2011;50(10):3005–15. <http://dx.doi.org/10.1016/j.compmatsci.2011.05.019>.
- [38] Liu Y, Wu H-X, Wang B. Gradient design of metal hollow sphere (MHS) foams with density gradients. *Composites B* 2012;43(3):1346–52. <http://dx.doi.org/10.1016/j.compositesb.2011.11.057>.
- [39] Marcadon V, Kruch S. Influence of geometrical defects on the mechanical behaviour of hollow-sphere structures. *Int J Solids Struct* 2013;50(3):498–510. <http://dx.doi.org/10.1016/j.ijsolstr.2012.10.014>.
- [40] Wu G, Li R, Yuan Y, Jiang L, Sun D. Sound absorption properties of ceramic hollow sphere structures with micro-sized open cell. *Mater Lett* 2014;134:268–71. <http://dx.doi.org/10.1016/j.matlet.2014.07.082>.
- [41] Shufrin I, Pasternak E, Dyskin AV. Negative Poisson's ratio in hollow sphere materials. *Int J Solids Struct* 2015;54:192–214. <http://dx.doi.org/10.1016/j.ijsolstr.2014.10.014>.
- [42] Bezanson J, Karpinski S, Shah VB, Edelman A. Julia: A fast dynamic language for technical computing. 2012, [arXiv:1209.5145](https://arxiv.org/abs/1209.5145).
- [43] Christoff BG, Brito-Santana H, Talreja R, Tita V. Development of an ABAQUS™ plug-in to evaluate the fourth-order elasticity tensor of a periodic material via homogenization by the asymptotic expansion method. *Finite Elem Anal Des* 2020;181:103482. <http://dx.doi.org/10.1016/j.finel.2020.103482>.
- [44] Neves MM, Rodrigues H, Guedes JM. Optimal design of periodic linear elastic microstructures. *Comput Struct* 2000;76:421–9. [http://dx.doi.org/10.1016/S0045-7949\(99\)00172-8](http://dx.doi.org/10.1016/S0045-7949(99)00172-8).
- [45] Silva BL, Christoff BG, Lepienski CM, Cardoso EL, Coelho LA, Becker D. Role of cured epoxy and block copolymer addition in mechanical and thermal properties of polyethylene. *Mater Res* 2017;20:1221–9. <http://dx.doi.org/10.1590/1980-5373-mr-2016-0589>.
- [46] Brito-Santana H, Christoff BG, Ferreira AJM, Lebon F, Rodríguez-Ramos R, Tita V. Delamination influence on elastic properties of laminated composites. *Acta Mech* 2019;230(3):821–37. <http://dx.doi.org/10.1007/s00707-018-2319-8>.
- [47] Christoff BG, Brito-Santana H, Tita V. Analysis of unbalanced composites with imperfect interphase: effective properties via asymptotic homogenization method. *Proc Inst Mech Eng L* 2021. <http://dx.doi.org/10.1177/14644207211060004>.
- [48] Hollister SJ, Kikuchi N. Homogenization theory and digital imaging: A basis for studying the mechanics and design principles of bone tissue. *Biotechnol Bioeng* 1994;43(7):586–94. <http://dx.doi.org/10.1002/bit.260430708>.
- [49] Brito-Santana H, de Medeiros R, Ferreira AJM, Rodríguez-Ramos R, Tita V. Effective elastic properties of layered composites considering non-uniform imperfect adhesion. *Appl Math Model* 2018;59:183–204.
- [50] Brito-Santana H, Thiesen JLM, de Medeiros R, Ferreira AJM, Rodríguez-Ramos R, Tita V. Multiscale analysis for predicting the constitutive tensor effective coefficients of layered composites with micro and macro failures. *Appl Math Model* 2019;75:250–66.
- [51] Yang Q-S, Becker W. Numerical investigation for stress, strain and energy homogenization of orthotropic composite with periodic microstructure and non-symmetric inclusions. *Comput Mater Sci* 2004;(31):169–80.
- [52] Bendsoe MP, Sigmund O. *Topology optimization - theory, methods and applications*. Springer; 2003.
- [53] Bruns TE, Tortorelli DA. Topology optimization of non-linear elastic structures and compliant mechanisms. *Comput Methods Appl Mech Eng* 2001;190(26):3443–59. [http://dx.doi.org/10.1016/S0045-7825\(00\)00278-4](http://dx.doi.org/10.1016/S0045-7825(00)00278-4).
- [54] Sigmund O. Morphology-based black and white filters for topology optimization. *Struct Multidiscip Optim* 2007;33:401–24. <http://dx.doi.org/10.1007/s00158-006-0087-x>.
- [55] Ameen M, Peerlings RHJ, Geers MGD. Higher-order asymptotic homogenization of periodic linear elastic composite materials at low scale separation. In: 24th international congress of theoretical and applied mechanics (ICTAM 2016). IUTAM; 2017, p. 2544–5.
- [56] Rodríguez-Ramos R, de Medeiros R, Guinovart-Díaz R, Bravo-Castillero J, Otero JA, Tita V. Different approaches for calculating the effective elastic properties in composite materials under imperfect contact adherence. *Compos Struct* 2013;99:264–75. <http://dx.doi.org/10.1016/j.compstruct.2012.11.040>.
- [57] Tapia M, Espinosa-Almeyda Y, Rodríguez-Ramos R, Otero JA. Computation of effective elastic properties using a three-dimensional semi-analytical approach for transversely isotropic nanocomposites. *Appl Sci* 2021;11(4):1867. <http://dx.doi.org/10.3390/app11041867>.
- [58] de Macedo RQ, Ferreira RTL, Guedes JM, Donadon MV. Intraply failure criterion for unidirectional fiber reinforced composites by means of asymptotic homogenization. *Compos Struct* 2017;159:335–49. <http://dx.doi.org/10.1016/j.compstruct.2016.08.027>.
- [59] de Macedo RQ, Ferreira RTL, Donadon MV, Guedes JM. Elastic properties of unidirectional fiber-reinforced composites using asymptotic homogenization techniques. *J Braz Soc Mech Sci Eng* 2018;40(5):1–11. <http://dx.doi.org/10.1007/s40430-018-1174-9>.
- [60] Dutra TA, Ferreira RTL, Resende HB, Guimarães A, Guedes JM. A complete implementation methodology for asymptotic homogenization using a finite element commercial software: preprocessing and postprocessing. *Compos Struct* 2020;245:112305. <http://dx.doi.org/10.1016/j.compstruct.2020.112305>.
- [61] Geuzaine C, Remacle J-F. Gmsh: a three-dimensional finite element mesh generator with built-in pre- and post-processing facilities. *Internat J Numer Methods Engrg* 2009;79(11):1309–31. <http://dx.doi.org/10.1002/nme.2579>.
- [62] Cignoni P, Callieri M, Corsini M, Dellepiane M, Ganovelli F, Ranzuglia G. MeshLab: an open-source mesh processing tool. In: Scarano V, Chiara RD, Erra U, editors. Eurographics italian chapter conference. The Eurographics Association; 2008. <http://dx.doi.org/10.2312/LocalChapterEvents/ItalChap/ItalianChapConf2008/129-136>.
- [63] Sorkine O. Laplacian mesh processing. In: Chrysanthou Y, Magnor M, editors. Eurographics 2005 - state of the art reports. The Eurographics Association; 2005. <http://dx.doi.org/10.2312/egst.20051044>.
- [64] Almeida Jr JHS, Christoff BG, Tita V, St-Pierre L. A concurrent fibre orientation and topology optimisation framework for 3D-printed fibre-reinforced composites. *Compos Sci Technol* 2023;232:109872. <http://dx.doi.org/10.1016/j.compscitech.2022.109872>.