



# Mechanically robust lattices inspired by deep-sea glass sponges

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**The predominantly deep-sea hexactinellid sponges are known for their ability to construct remarkably complex skeletons from amorphous hydrated silica. The skeletal system of one such species of sponge, *Euplectella aspergillum*, consists of a square-grid-like architecture overlaid with a double set of diagonal bracings, creating a chequerboard-like pattern of open and closed cells. Here, using a combination of finite element simulations and mechanical tests on 3D-printed specimens of different lattice geometries, we show that the sponge's diagonal reinforcement strategy achieves the highest buckling resistance for a given amount of material. Furthermore, using an evolutionary optimization algorithm, we show that our sponge-inspired lattice geometry approaches the optimum material distribution for the design space considered. Our results demonstrate that lessons learned from the study of sponge skeletal systems can be exploited for the realization of square lattice geometries that are geometrically optimized to avoid global structural buckling, with implications for improved material use in modern infrastructural applications.**

The mineralized skeletal system of the hexactinellid sponge, *Euplectella aspergillum*, commonly known as the Venus' flower basket, has received considerable attention from the engineering and materials science communities for its remarkable hierarchical architecture and mechanical robustness across multiple length scales. Its constituent glassy skeletal elements (spicules) consist of a central proteinaceous core surrounded by alternating concentric layers of consolidated silica nanoparticles and thin organic interlayers<sup>1–3</sup>. These spicules are further organized to form a highly regular square grid, reinforced by two intersecting sets of paired diagonal struts, creating a chequerboard-like pattern of alternating open and closed cells (Fig. 1). Although the effects of the spicules' laminated architecture in retarding crack propagation<sup>4</sup> and increasing buckling strength<sup>5</sup> have been demonstrated previously, the potential mechanical benefits of the double-diagonal square lattice created from the assembly of these constituent spicules remain largely unexplored.

Grid-like open-cell lattices, such as those found in the skeletal system of *E. aspergillum*, are commonly employed in engineering contexts owing to their reduced weight<sup>6,7</sup>, high energy absorption<sup>8</sup> and ability to control the propagation of acoustic<sup>9</sup> and thermal waves<sup>10–12</sup>. Generally, the properties and functionality of such geometries are dictated by their node connectivity. For example, a minimum node connectivity of six is required for two-dimensional lattices to be stretching-dominated, and thereby achieve a higher strength-to-weight ratio for structural applications<sup>13</sup>. In contrast, lattices with simple square geometries (with a node connectivity of four), are unstable when the loading vector has a transverse component (they are bending-dominated, and the only shear resistance arises from the joints)<sup>14</sup>, and typically require diagonal bracing for stabilization<sup>15</sup>.

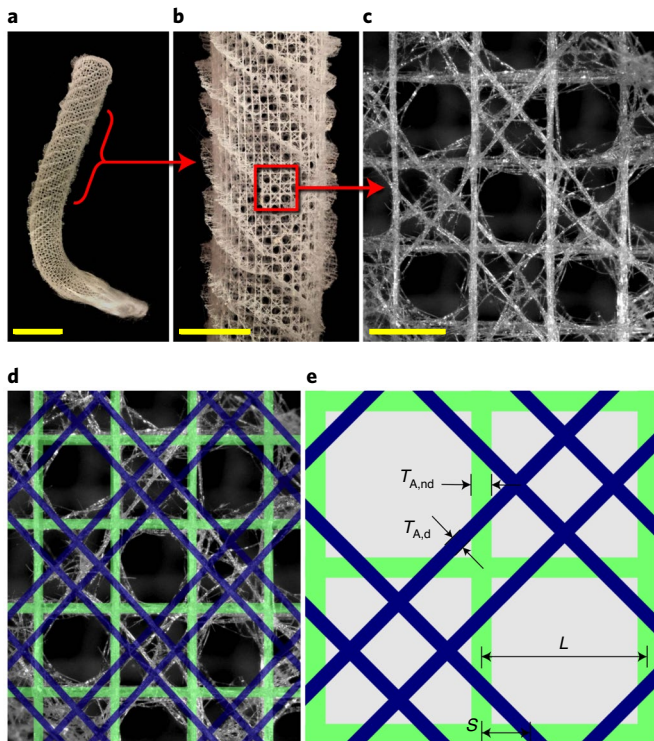
Here we use the skeletal anatomy of *E. aspergillum* as inspiration for the design of mechanically robust square lattice architectures (more information on the skeletal structure of the sponge can be found in Supplementary Section 1 and Supplementary Fig. 1). First, we use a combination of experimental and numerical analyses to

investigate the mechanical properties of the sponge's skeletal lattice. We then employ an optimization algorithm to identify the beam configuration in a diagonally reinforced square lattice that achieves the highest critical load, revealing—unexpectedly—that the skeletal system of *E. aspergillum* is very close to this design optimum. These results demonstrate that an integrated work flow, combining biological, computational and mechanical testing approaches, can guide the design of lattice architectures that are structurally more robust than those now employed in modern infrastructure and devices.

To understand the mechanical benefits of the sponge's skeletal architecture, we compared the performance of its geometry to that of three other 2D square-base lattices, all with the same total volume (that is, the same total amount of material) to ensure a fair comparison<sup>14</sup>. In each of these structures, the base square architecture was comprised of elements with lengths  $L$ , and with rectangular cross-sections characterized by a depth  $H$  that is large enough to avoid out-of-plane deformation. More specifically, we considered Design A, which was inspired by the sponge and comprised horizontal and vertical (non-diagonal) elements with thickness  $T_{A,nd} = 0.1L$  and two sets of parallel double diagonals with thickness  $T_{A,d} = 0.05L$  located at a distance  $S = L/(\sqrt{2} + 2)$  from the nodes (Fig. 2a); Design B, which was similar to the sponge-inspired design with  $T_{B,nd} = 0.1L$ , but only contained a single diagonal with thickness  $T_{B,d} = 0.1L$  crossing each of the closed cells (Fig. 2b); Design C, which was inspired by the bracings found in modern engineering applications with  $T_{C,nd} = 0.1L$  and contained a crossed set of diagonal beams with thickness  $T_{C,nd} = 0.05L$  in every cell (Fig. 2c); and Design D, with no diagonal reinforcement and horizontal and vertical elements with thickness  $T_{D,nd} = 0.1L(1 + 1/\sqrt{2})$  (Fig. 2d). Note that in an effort to further provide a fair comparison, the volume ratio of diagonal to non-diagonal struts was also identical for Designs A, B and C (see Supplementary Section 2 and Supplementary Figs. 2–5 for details and assumptions).

We began our analysis by comparing the mechanical response under uniaxial compression along the vertical elements of the four lattices described above. Samples comprising  $6 \times 6$  tessellations of

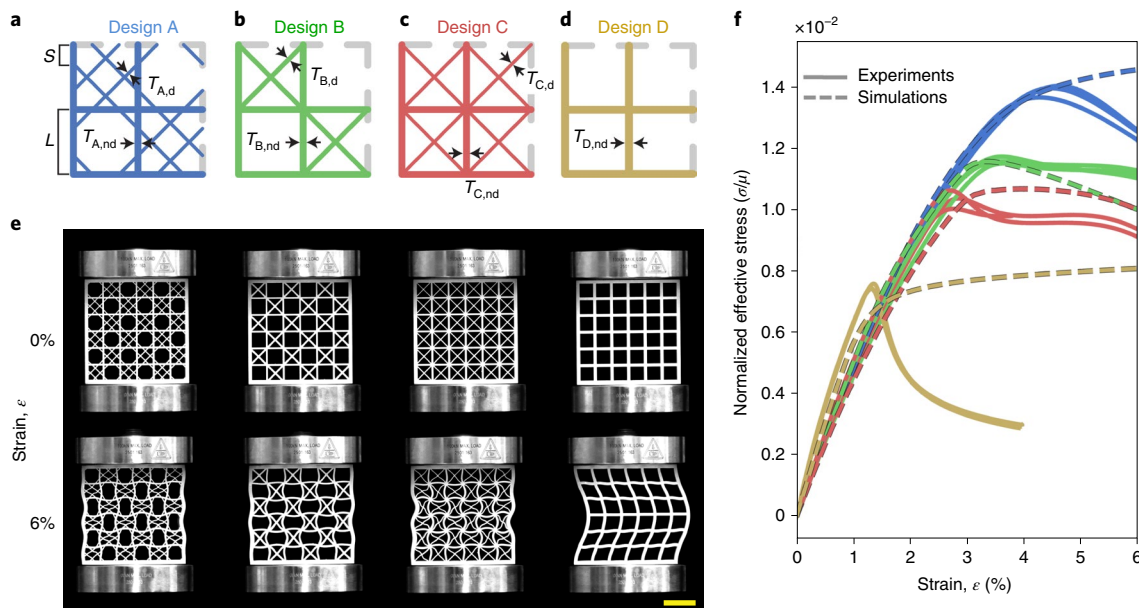
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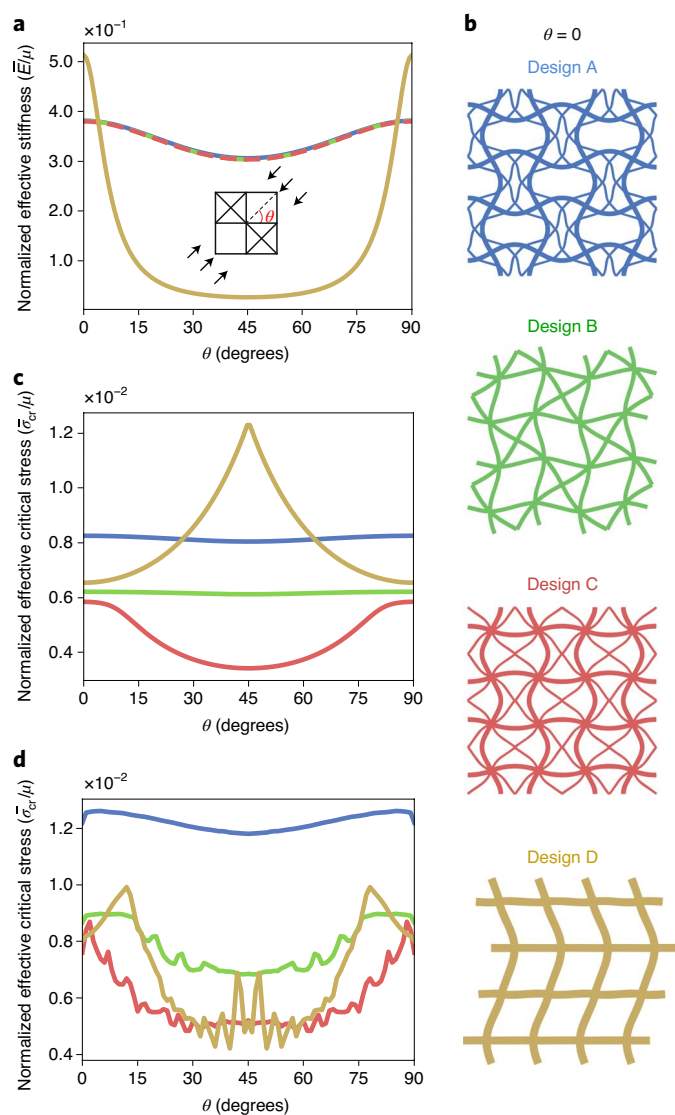
**Fig. 1 | Representative skeletal system of the hexactinellid sponge *Euplectella aspergillum*.** **a–c**, Progressively magnified views of the sponge's skeletal system, showing the entire skeletal tube (**a**), a magnified view of its highly regular lattice-like organization (**b**), and its alternating arrangement of open and closed cells (**c**). Scale bars, 4 cm (**a**); 2 cm (**b**); 2.5 mm (**c**). **d**, Composite overlay of an idealized truss model (green lines designate the vertical and horizontal truss elements, and the blue lines designate the diagonal truss elements) on the sponge's underlying skeletal structure. **e**, Schematic of Design A, comprising non-diagonal elements with length  $L$  and thickness  $T_{A,nd}$  and diagonal elements with thickness  $T_{A,d}$  located at a distance  $S$  from the nodes.

square cells with  $L=1.5$  cm and  $H=4$  cm were fabricated with a Connex500 multi-material 3D printer (Stratasys) from a Shore A 95 durometer material (digital elastomer FLX9795-DM) and compressed uniaxially using a single axis Instron (Model 5969) with a 50 kN load cell (Fig. 2e). Two key features emerged from the stress–strain curves reported in Fig. 2f. First, we found that all designs with diagonal reinforcement (that is, Designs A–C) were characterized by a nearly identical initial elastic response, demonstrating that the different diagonal reinforcement designs did not impact the structure's initial overall stiffness. Design D, as expected, exhibited a higher initial stiffness because of its thicker vertical and horizontal elements. Second, all curves showed a clear maximum load-bearing capacity, with Design A (the sponge-inspired design) accommodating the highest load. As each maximum load corresponded to the onset of buckling, we inferred that Design A displayed the highest critical buckling stress of the considered designs. Furthermore, we found that in all three designs with diagonals, the post-buckling behaviour resulted in a homogeneous pattern transformation throughout the sample (Fig. 2e). In contrast, for Design D, the critical mode resulted in a much larger wavelength than the size of a square unit cell, leading to a post-buckled shape qualitatively similar to that of a compressed buckled beam (more information on the experimental methods can be found in Supplementary Section 3 and Supplementary Table 1).

In an effort to understand how the sponge-inspired lattice design resulted in substantially improved mechanical performance, we conducted finite element simulations using ABAQUS/Standard (Dassault Systèmes SE). For these analyses, the geometries were constructed using Timoshenko beam elements (ABAQUS element type B22) and the material's response was captured using an incompressible Neo-Hookean material model with a shear modulus  $\mu=14.5$  MPa. Our simulations consisted of three steps: (1) a buckling analysis (\*BUCKLE step in ABAQUS) was conducted to obtain the buckling modes for each of the structures, (2) a perturbation in the form of the lowest buckling mode was then applied to the nodes of the mesh, and (3) a static nonlinear analysis (\*STATIC step in ABAQUS) was performed to evaluate the nonlinear, large-deformation responses. To verify the validity of our



**Fig. 2 | Experimental and numerical results.** **a–d**, Schematics of designs A–D, respectively. **e**, Mechanical deformation snapshots of the different 3D-printed models at 0% applied strain (top) and 6% applied strain (bottom). Scale bar, 3 cm. **f**, Simulated and normalized experimental stress–strain curves for  $n=3$  independently tested samples of each design. Curves in this plot are colour coded according to **a–d**. All designs are characterized by the same total volume and mass ratio allocation between non-diagonal and diagonal elements.



**Fig. 3 | Numerical results describing structural response to varying loading angle.** **a**, Evolution of the normalized structural stiffness for infinite size periodic lattice designs as a function of  $\theta$ . **b**, Normalized critical buckling modes for Designs A–D at  $\theta = 0^\circ$ . **c**, Evolution of the effective buckling stress for the different lattice designs as a function of  $\theta$ . Results are obtained by simulating a supercell with  $10 \times 10$  RVEs and periodic boundary conditions. **d**, Evolution of the normalized effective buckling stress as a function of  $\theta$  for finite (non-periodic) lattice structures comprising  $10 \times 10$  RVEs. In each plot, the line colour corresponds to the designs in **b**. All designs are characterized by the same total volume and mass ratio allocation between non-diagonal and diagonal elements.

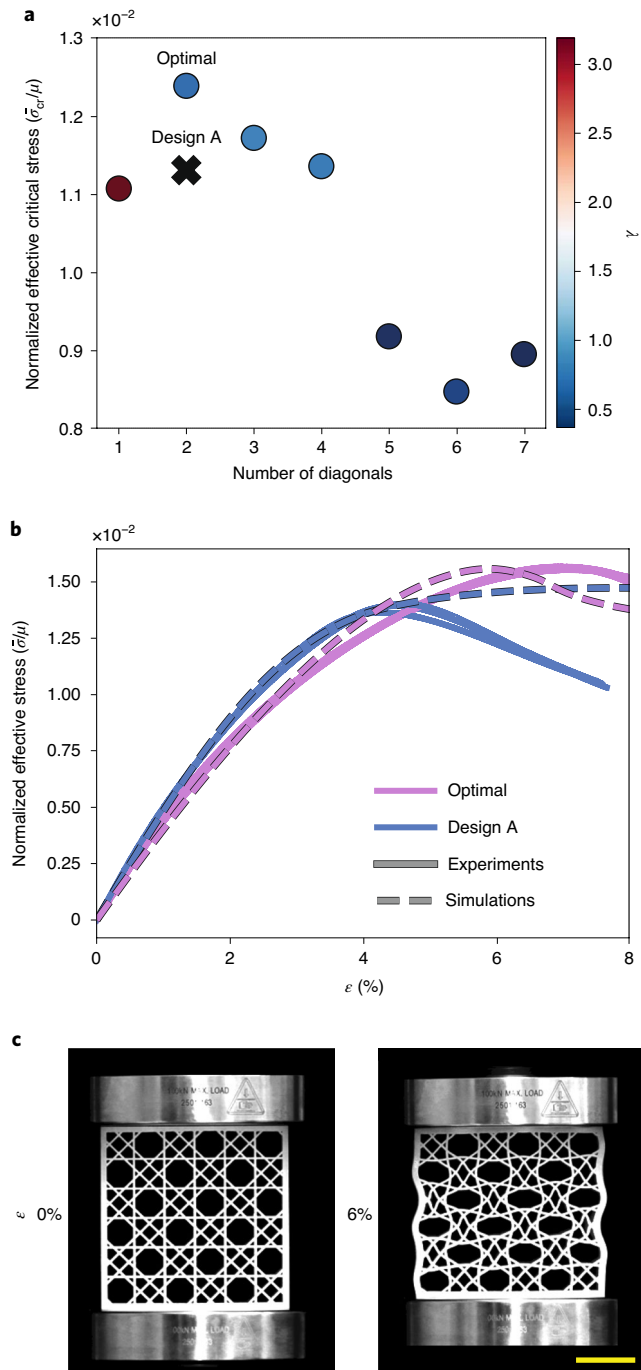
analyses, we investigated the responses of models identical to those specimens tested in our Instron compression studies. As shown in Fig. 2f, we found close agreement between the numerical and experimental results up to the onset of buckling, confirming the accuracy of our simulations in capturing the linear regime and critical load. Next, we extended our finite element model to explore the effects of loading direction. To reduce computational cost and eliminate edge effects, we capitalized on the periodicity of the structures and investigated the response of representative volume elements (RVEs) with suitable periodic boundary conditions<sup>16,17</sup> (see Supplementary Section 4 and Supplementary Figs. 6–24 for details and additional numerical analysis). Figure 3a shows the evolution of the structures'

effective stiffness,  $\bar{E}$ , as a function of the loading angle  $\theta$ . We found that the stiffness of all structures containing diagonal reinforcement was virtually identical for any loading angle, further confirming that the structural stiffness was predominantly governed by the amount of material allocated along the loading direction. As a result, Design D, in which all of the material was allocated to the non-diagonal elements, exhibited the highest stiffness for  $\theta = 0^\circ$ , but had almost negligible load-bearing capacity for  $\theta = 45^\circ$ , where the only contribution to its stiffness came from the minimal bending resistance of the joints (see Supplementary Fig. 21 for a detailed analysis of the effect of joint stiffness).

Next, we investigated the effect of  $\theta$  on the buckling behaviour of Designs A–D. We found that the effective critical buckling stress ( $\bar{\sigma}_{cr}$ ) of Design A was higher than the other diagonally reinforced designs (Design B and Design C) for all values of  $\theta$  (Fig. 3b). Design D surpassed Design A for  $27^\circ < \theta < 63^\circ$  when considering an infinite structure. However, given the global nature of the buckling mode for Design D, such performance was largely affected by boundary effects and the critical buckling stress was substantially reduced when considering a finite size structure comprising  $10 \times 10$  RVEs (Fig. 3d; see also Supplementary Fig. 20). Furthermore, the geometry of Design A maintained its robustness even after modifications to the lattice through the introduction of various levels of disorder, an observation consistent with the features observed in the native sponge skeleton (see Supplementary Figs. 23 and 24).

Having demonstrated the benefits of the sponge-inspired design (Design A) compared with Designs B–D, we wondered whether a different diagonally reinforced square lattice design with even higher critical buckling stress exists. To address this question, we formulated an optimization problem to identify the number of diagonals,  $N$ , their distance from the nodes of the square lattice  $S_i$  (where  $i = 1, 2, \dots, N$ ), as well as the ratio between diagonal and non-diagonal elements  $\lambda = V_{nd}/V_d$  ( $V_{nd}$  and  $V_d$  being the volume of the non-diagonal and diagonal elements, respectively) that resulted in the highest buckling stress. Specifically, we considered finite size structures composed of  $3 \times 3$  RVEs and focused on uniaxial compression parallel to the non-diagonal elements (that is,  $\theta = 0^\circ$ ), while constraining the total volume of the RVE to match that of the designs considered in Fig. 2. We maximized the objective function  $\mathcal{Z} = \bar{\sigma}_{cr}$  using finite element simulations coupled to a Python implementation of the Covariance Matrix Adaptation Evolution Strategy algorithm (CMA-ES)<sup>18</sup> (more information on the implementation see Supplementary Section 5, Supplementary Figs. 25–27 and Supplementary Tables 2 and 3). For each set of inputs identified by CMA-ES, a finite element buckling analysis was conducted to obtain  $\bar{\sigma}_{cr}$ , which was subsequently used to evaluate the objective function  $\mathcal{Z}$ . We conducted seven separate optimizations, each considering a fixed integer number of diagonal elements  $N$  ranging from one to seven ( $N = \mathbb{Z} \in [1, 7]$ ). Given the high strength of lattices reinforced by diagonals aligned at a  $45^\circ$  angle<sup>19</sup>, we assumed in all of the runs that all of the diagonals were oriented at  $45^\circ$  with respect to the non-diagonal members and that  $V_d$  and  $V_{nd}$  were distributed equally among the diagonal and non-diagonal elements, respectively. Furthermore, to ensure symmetry, we assumed that  $S_{2i-1} = S_{2i}$  ( $i = 1, 2, \dots, N/2$ ) if  $N$  is an even number and  $S_1 = 0$  and  $S_{2i-1} = S_{2i}$  ( $i = 2, 3, \dots, (N-1)/2$ ) for odd values of  $N$ . In Fig. 4a, we report the highest  $\bar{\sigma}_{cr}$  identified by CMA-ES for all considered values of  $N$ . We found that the highest  $\bar{\sigma}_{cr}$  was only 9.55% higher than that of Design A and occurred in a design similar to the sponge-inspired one (with two diagonals located at a distance  $S = 0.1800L$  from the nodes, and volume distributed so that  $\lambda = 0.6778$ ). As such, this numerical prediction, which was validated by experimental results (Fig. 4b), demonstrated that the sponge-inspired design was extremely close to the design that exhibited the highest critical stress.

Thus far, we demonstrated that the skeletal organization pattern found in *E. aspergillum* could be adapted to realize lattice



**Fig. 4 | Optimization results and experimental validation.** **a**, Optimal value of critical buckling load for varying numbers of diagonals. The colour of each point represents the optimal mass ratio  $\lambda$ . **b**, Simulated and normalized experimental stress–strain curves for  $n = 3$  independently tested samples of Design A and the optimal lattice design. **c**, Experimental snapshots of the optimal design at 0% applied strain (left) and 6% applied strain (right). Scale bar, 3 cm.

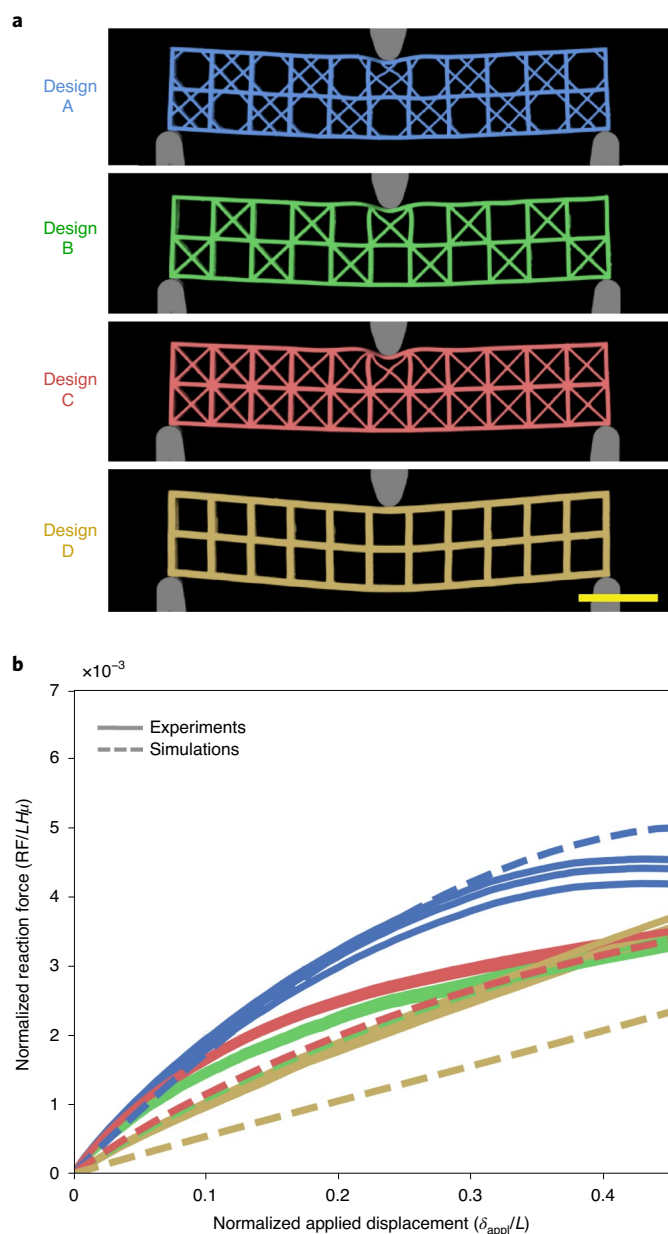
structures with high buckling resistance under uniaxial compression. However, it should be noted that the superior mechanical performance of the sponge-inspired lattice (Design A) is not limited to this loading condition. To demonstrate this important point, Fig. 5 shows results for a slender tessellation of  $11 \times 2$  square cells loaded in three-point bending. In this scenario, using an Instron, the slender geometry was mounted in a three-point bending configuration

and a displacement  $\delta_{\text{appl}}$  was applied at the top centre of the geometry. As the displacement was applied, the reaction force was measured and plotted in Fig. 5b for the various geometries. Both our experiments and finite element simulations demonstrated that the sponge-inspired design was stiffer and could withstand 15% higher loads over a larger range of applied displacements, illustrating the potential benefit of incorporating such a design into suspended structures. We further used finite element simulations to evaluate the performance of Designs A–D in five other loading regimes. For all of the loading cases considered (see Supplementary Figs. 9–12), we found that Design A was able to withstand considerably higher loads than any of the other structures—making it the best candidate to realize load-bearing structures for a variety of applications. Although we focused on lattices at the centimetre scale in this study, we want to emphasize that our approach can be extended to design structures over a wide range of length scales as long as they lie within the continuum limit. However, in our analysis, we did not account for the effect of gravity, which could become an important source of loading for large-scale structures.

In summary, through analysis of the skeletal organization of *E. aspergillum*, we discovered that its non-trivial, double-diagonal, chequerboard-like square lattice design provides enhanced mechanical performance compared to existing structures. We compared the sponge-inspired lattice (Design A) to other common diagonally reinforced square lattices (Designs B and C) and a non-diagonally reinforced lattice (Design D), all with the same total mass, and found that the sponge-inspired design provides a superior mechanism for withstanding loads before the onset of buckling for a wide range of loading conditions. By using optimization tools to survey a broad multidimensional design space, we also found that the architecture of the sponge skeleton is nearly identical to the lattice design that provides the highest critical stress under uniaxial compression.

The results presented here therefore demonstrate that, by intelligently allocating material within a square lattice, it is possible to produce structures with optimal buckling resistance without the need to add more material to the system. The mechanical properties of the sponge-inspired lattice described here thus have implications for improving the performance of a wide range of truss systems, with applications ranging from large-scale infrastructure such as bridges and buildings to small-scale medical implants.

Although not the primary focus of this study, the results presented here may also shed light on functional aspects of the skeletal organization in *E. aspergillum*. It is important to note that skeletal maturation in this and related species progresses through two distinct phases (a flexible phase and a rigid phase), ultimately resulting in the terminal growth form shown in Fig. 1 (refs. 1,20,21). In the early, flexible stage of growth, the vertical, horizontal and diagonal skeletal struts are not fused to one another, and can thus accommodate radial expansion of the skeletal cylinder. At this point, the mechanical behaviour of the sponge skeleton is dominated by the properties of the individual spicules, which have been reported to support large bending deformation and fail at strains greater than those found for buckling in our lattices—namely at strains greater than  $\epsilon \approx 0.04$  (refs. 22,23). Once the maximum length and width of the cylindrical lattice is achieved, the skeleton goes through a series of rigidification steps, resulting in a progressive stiffening of the skeletal system through nodal fusion of the vertical, horizontal and diagonal struts via the deposition of a lower-modulus laminated silica cement<sup>24</sup>, followed by the addition of the spiralling external ridges and further densification of the skeleton. Therefore, although the results presented here are thus unlikely to be biologically relevant with regards to the fully mature skeleton shown in Fig. 1, they may very well be relevant during the early stages of skeletal consolidation in this and related species where the buckling strains exceed the laminate yield strains<sup>22–24</sup>.



**Fig. 5 | Numerical and experimental results of slender structures undergoing 3-point bending tests.** **a**, Experimental snapshots of the four lattices comprising  $11 \times 2$  square cells when loaded in three-point bending at  $\delta_{\text{app}}/L = 0.45$ . Scale bar, 3 cm. The photographs have been false-coloured to more clearly reflect the corresponding plots in **b** for each design. **b**, Evolution of the normalized reaction forces for  $n = 3$  experimentally obtained samples (solid lines) and simulations (dashed lines) of the four designs as a function of the applied displacement. Normalization involved dividing the resulting reaction forces by the material shear modulus, specimen cell length  $L$ , and specimen depth  $H$ .

### Online content

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary

information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at <https://doi.org/10.1038/s41563-020-0798-1>.

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## Methods

Parameter derivation and an explanation of each geometry can be found in Supplementary Section 2. Details of the fabrication of the samples and the protocol for testing can be found in Supplementary Section 3. The numerical set-up and explanation for the finite element analysis can be found in Supplementary Section 4. Additional numerical analysis, including parameter exploration and considerations for different cross-sectional geometries, is presented in Supplementary Section 4.1. A detailed description of the optimization algorithm can be found in Supplementary Section 5.

## Data availability

Raw data for the plots are available on GitHub at <http://fer.me/sponge-structure>. Additional data that support the findings of this study are available from the corresponding authors on request.

## Code availability

All codes necessary to reproduce results in main paper are available on GitHub at <http://fer.me/sponge-structure>.

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## Author contributions

All authors secured research funding. K.B. and J.C.W. supervised the research. M.C.F. and J.C.W. generated models and performed mechanical testing and finite element simulations. M.C.F., K.B. and J.C.W. analysed the data. All authors wrote the paper.

## Competing interests

The authors would like to disclose a submitted patent application on related geometric features reported in this manuscript. United States Patent and Trademark Office (USPTO) (RO/US) application number: 002806-094100WOPT filed in 2019. Patent applicant: President and Fellows of Harvard College. Inventors: Matheus C. Fernandes, James C. Weaver, and Katia Bertoldi. The authors declare no further competing interests.

## Additional information

**Supplementary information** is available for this paper at <https://doi.org/10.1038/s41563-020-0798-1>.

**Correspondence and requests for materials** should be addressed to J.C.W. or K.B.

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# Supplementary Information: Mechanically Robust Lattices Inspired By Deep-Sea Glass Sponges

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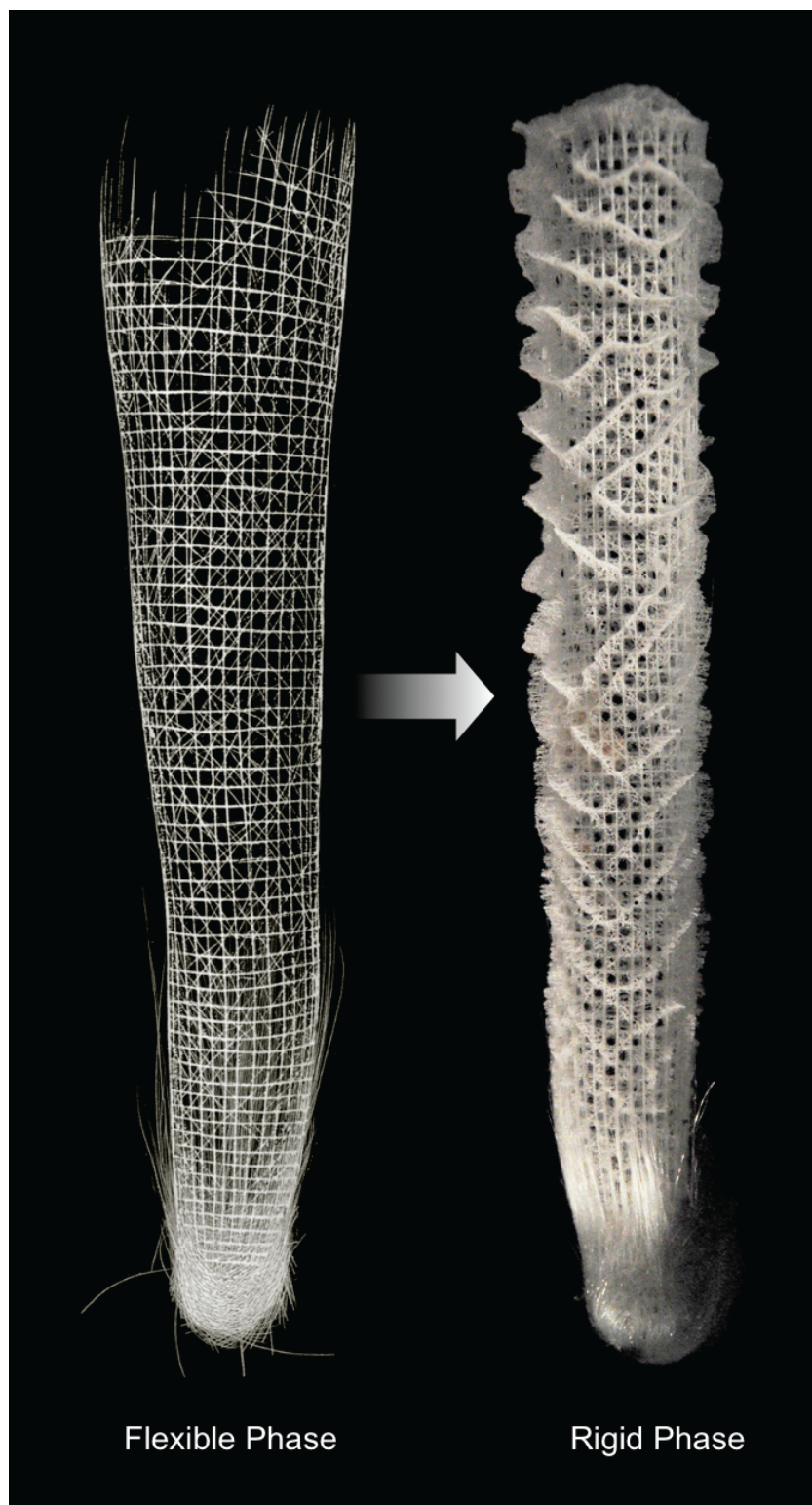
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## S1: STRUCTURE OF THE HEXACTINELLID SPONGE *EUPLECTELLA ASPERGILLUM*

The periodic structures investigated in this study are inspired by the skeleton of the hexactinellid sponge *Euplectella aspergillum*, which throughout its lifespan (Supplementary Fig. 1) progresses from a easily deformable skeletal lattice (flexible phase), consisting of loosely associated individual skeletal elements, through various stages of skeletal consolidation, ultimately resulting in the mature form (rigid phase), shown in Main Text Fig. 1 [S1–S3]. In this section, we provide a detailed description of the sponge's geometry and measured dimensions.

Main Text Fig 1. shows a photograph of the entire skeleton of a representative specimen of *E. aspergillum*, and its intricate, cylindrical cage-like structure (20 to 25 cm long, 2 to 4 cm in diameter)<sup>[S4]</sup>. The surface of the cylinder incorporates a regular square lattice composed of a series of cemented vertical and horizontal struts, consisting of bundles of individual spicules, each with a circular cross-section. The cell spacing between horizontal and vertical struts is  $L \approx 2.5$  mm<sup>[S5]</sup>, while the diameter is  $D_{nd} \approx 0.25$  mm<sup>[S5]</sup>. In addition to the horizontal and vertical struts, there is an additional set of diagonal elements, intersecting in a manner that creates a series of alternating open and closed cells, reminiscent of a checkerboard pattern<sup>[S5]</sup>. Although these diagonal elements are not as ordered as the horizontal and vertical ones, they can be approximated as two diagonal struts that are offset from the nodes (vertex joints between non-diagonal elements) and form roughly octagonal openings (Supplementary Fig. 2). To estimate the volume ratio between diagonal and non-diagonal elements, we acquired digital photographs of the sponge skeleton and performed image segmentation to segregate the projected area of the vertical/horizontal and diagonal spicules. For these measurements, and to minimize shadowing artifacts during image thresholding, sponge skeleton regions were selected that did not contain surface ridges. In total 4 different sponge skeletons were investigated and 25 different lattice cells from each specimen were analyzed. Using this approach, the projected area ratio of non-diagonal to diagonal elements was found to be  $A_{nd}/A_d \approx 1.41 \pm 0.16$ . Note that here, and in the following, the subscripts  $d$  and  $nd$  are used to indicate the diagonal and non-diagonal (i.e. horizontal and vertical) elements, respectively.

Finally, it should also be noted that the sponge is reinforced by external ridges that extend perpendicular to the surface of the cylinder and spiral the cage at an angle of  $\sim 45^\circ$ . However, in this paper we do not report the effects of these ridges on its mechanical performance, which will be addressed elsewhere.



**Supplementary Figure 1:** Historical illustration (left) and modern photograph (right) illustrating the flexible and rigid growth stages that occur during skeletal maturation in several hexactinellid sponges in the genus *Euplectella*. Left image adapted from Schulze<sup>[S2]</sup>.



## S2: OUR FOUR LATTICE DESIGNS

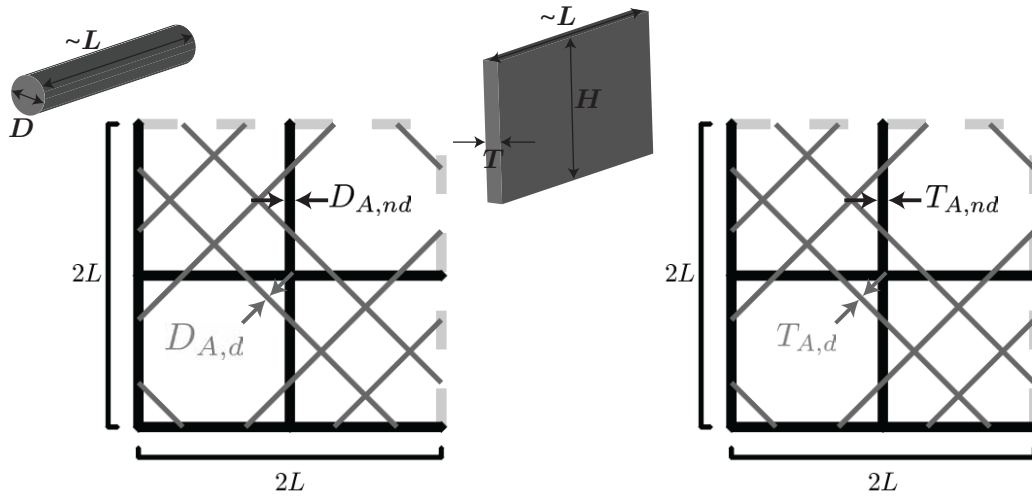
In this study, we focused on four different lattice configurations (*Designs A, B, C, and D*) constrained to deform in an in-plane setting only. In an effort to conduct a fair performance comparison between the different geometries, all four lattices were designed to contain the same total volume of material and a fixed volume ratio between non-diagonal and diagonal elements (chosen to match the sponge geometry) for *Designs A, B, and C*. Two different shapes were considered for the cross-section of the struts: circular and rectangular. For the circular cross-section case, we denoted the diameters of the non-diagonal (i.e. horizontal and vertical) and diagonal struts in the  $\alpha$ -th design as  $D_{\alpha,nd}$  and  $D_{\alpha,d}$ , respectively, and neglected out-of-plane buckling. For the rectangular cross-sections, we denoted the in-plane thickness of the non-diagonal (i.e. horizontal and vertical) and diagonal struts in the  $\alpha$ -th design as  $T_{\alpha,nd}$  and  $T_{\alpha,d}$ , respectively, and chose the depth  $H$  to avoid out-of-plane deformation (i.e. we chose the depth over thickness ratio sufficiently large to constrain in-plane deformation). Finally, it is important to note that the slenderness of the non-diagonal members in the  $\alpha$ -th design  $\in [A, B, C]$  was chosen as

$$\frac{D_{\alpha,nd}}{L} = 0.1, \quad \text{and} \quad \frac{T_{\alpha,nd}}{L} = 0.1, \quad (1)$$

for the case of the circular and rectangular cross-section, since this was the aspect ratio measured for the sponges (Section S1).

In the subsequent sections, we describe in detail the unit cells for four different designs, and provide the derivations for the characteristics of each geometry cross-section. To derive these relations, we laid a framework of underlying assumptions, namely:

- in-plane geometry is uniform and has the same shape (allowing only either thickness or diameter to change depending on cross-sectional shape) for all elements,
- all diagonal elements have the same in-plane dimension,
- all non-diagonal elements have the same in-plane dimension, and
- area of overlapping beam crossing is negligible and unaccounted for during volume calculations.



**Supplementary Figure 2:** Unit cell for *Design A*. Schematics of the unit cell for *Design A* (the sponge-inspired lattice). On the left, we indicate the geometric parameters of this design considering a circular cross-section, while on the right, we show the geometric parameters of this design considering a rectangular cross-section.

## S2.1: Design A

*Design A* was inspired by the sponge's skeletal architecture and consisted of a square grid reinforced by a double diagonal support system (Supplementary Fig. 2). Matching what was seen in the natural sponge, the diagonal elements were assumed to form an octagonal opening on every other cell, such that they intersect the horizontal and vertical struts at a distance  $\Delta L = L/(\sqrt{2} + 2)$  from the nodes, where  $L$  denotes the length of the vertical and horizontal struts.

### S2.1.1: Circular cross-section

Assuming that the cross-section of all struts is circular, the projected area and volume for the non-diagonal ( $A_{A,nd}$  and  $V_{A,nd}$ ) and diagonal ( $A_{A,d}$  and  $V_{A,d}$ ) members are given by

$$A_{A,nd} = 8LD_{A,nd}, \quad (2)$$

$$V_{A,nd} = 8L \left( \pi \frac{D_{A,nd}^2}{4} \right) = 2L\pi D_{A,nd}^2 \quad (3)$$

$$A_{A,d} = 8\sqrt{2}LD_{A,d}, \quad (4)$$

and

$$V_{A,d} = 8\sqrt{2}L \left( \pi \frac{D_{A,d}^2}{4} \right) = 2\sqrt{2}L\pi D_{A,d}^2. \quad (5)$$

Since the projected area ratio of the non-diagonal to diagonal elements in the sponge has been measured to be

$$\frac{A_{A,nd}}{A_{A,d}} = 1.41, \quad (6)$$

by substituting Eq. (2) and Eq. (4) into the equation above we find that for *Design A*

$$D_{A,nd} = 1.41\sqrt{2}D_{A,d} \approx 2D_{A,d}. \quad (7)$$

Substitution of Eq. (7) into Eq. (3) and Eq. (5) yields

$$\frac{V_{A,nd}}{V_{A,d}} = \frac{2L\pi D_{A,nd}^2}{2\sqrt{2}L\pi D_{A,d}^2} = 2\sqrt{2} \quad (8)$$

and

$$V_{A,T} = V_{A,nd} + V_{A,d} = 2\pi L(D_{A,nd}^2 + \sqrt{2}D_{A,d}^2) = 2\pi LD_{A,nd}^2 \left(1 + \frac{1}{2\sqrt{2}}\right), \quad (9)$$

where  $V_{A,T}$  indicates the total volume of the unit cell for *Design A*.

Finally, it is important to note that in this study we used *Design A* as our base model, and thus constrained the total volume of all the other unit cell designs with circular cross-sections to be equal to that of *Design A*, namely,

$$V_{\alpha,d} + V_{\alpha,nd} = V_{A,T} = 2\pi LD_{A,nd}^2 \left(1 + \frac{1}{2\sqrt{2}}\right), \quad (10)$$

with  $\alpha = B, C$  and  $D$ . For *Designs B* and  $C$ , which comprised diagonal elements, we also constrained the volume ratio of the non-diagonal to diagonal elements to be the same as in *Design A*

$$\frac{V_{\alpha,nd}}{V_{\alpha,d}} = \frac{V_{A,nd}}{V_{A,d}} = 2\sqrt{2}, \quad (11)$$

with  $\alpha \in B$  and  $C$ .

### S2.1.2: Rectangular cross-section

Assuming that the cross-section of all struts is rectangular, the projected-area for the non-diagonal ( $A_{A,nd}$ ) and diagonal ( $A_{A,d}$ ) members is given by

$$A_{A,nd} = 8LT_{A,nd} \quad (12)$$

and

$$A_{A,d} = 8\sqrt{2}LT_{A,d} \quad (13)$$

where  $T_{A,nd}$  and  $T_{A,d}$  are the non-diagonal and diagonal in-plane strut thickness for *Design A*, respectively. Since for the sponge  $A_{nd}/A_d \approx 1.41$ , it follows that

$$T_{A,nd} = 2T_{A,d}. \quad (14)$$

Finally, for the case of rectangular cross-section we used *Design A* as our base model, and thus constrained the total

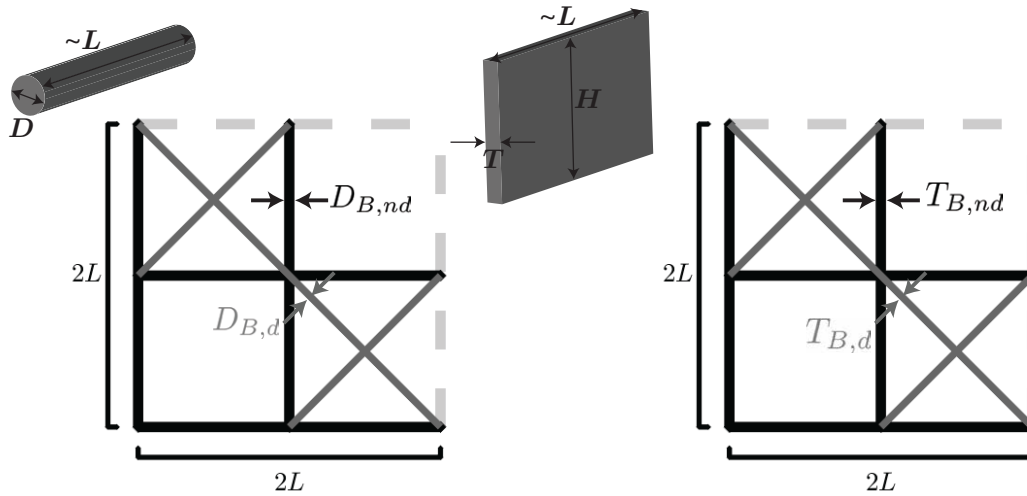
volume of all the other unit cell designs with rectangular cross-section to be equal to that of *Design A*, namely,

$$V_{A,T} = V_{\alpha,d} + V_{\alpha,nd} = 8LH(T_{A,nd} + \sqrt{2}T_{A,d}) = 8LHT_{A,nd} \left(1 + \frac{1}{\sqrt{2}}\right), \quad (15)$$

with  $\alpha \in B, C$  and  $D$ . Moreover, for *Designs B-C*, which comprised diagonal elements, we also constrained the volume ratio of the non-diagonal to diagonal elements to be the same as in *Design A*,

$$\frac{V_{\alpha,nd}}{V_{\alpha,d}} = \sqrt{2}, \quad (16)$$

with  $\alpha \in B$  and  $C$ .



**Supplementary Figure 3:** Unit cell for *Design B*. Schematics of the unit cell for *Design B* (an alternating open and closed cell structure resembling the sponge and employing a single set of diagonal bracings). On the left we indicate the geometric parameters of this design considering a circular cross-section, while on the right we show the geometric parameters of this design considering a rectangular cross-section.

## S2.2: Design B

*Design B* was similar to the sponge design (*Design A*) and was likewise characterized by an alternation of open and closed cells (Supplementary Fig. 3). However, instead of having two diagonals offset from the nodes, in this design only one diagonal passes through the nodes crossing through every other cell.

### S2.2.1: Circular cross-section

For this design with circular cross-section, the non-diagonal and diagonal volumes are given by

$$V_{B,nd} = V_{A,nd} = 2\pi LD_{B,nd}^2 \quad (17)$$

and

$$V_{B,d} = 2\sqrt{8}L \left( \pi \frac{D_{B,d}^2}{4} \right), \quad (18)$$

respectively. Using the constraints provided by Eq. (10) and Eq. (11), as well as the above volumes, we obtain

$$D_{B,nd} = D_{A,nd} \quad (19)$$

and

$$\frac{D_{B,d}}{D_{B,nd}} = \frac{1}{\sqrt{2}}. \quad (20)$$

### S2.2.2: Rectangular cross-section

For this design with circular cross-section, the volume of the non-diagonal and diagonal members are given by

$$V_{B,nd} = 8LT_{B,nd}H. \quad (21)$$

and

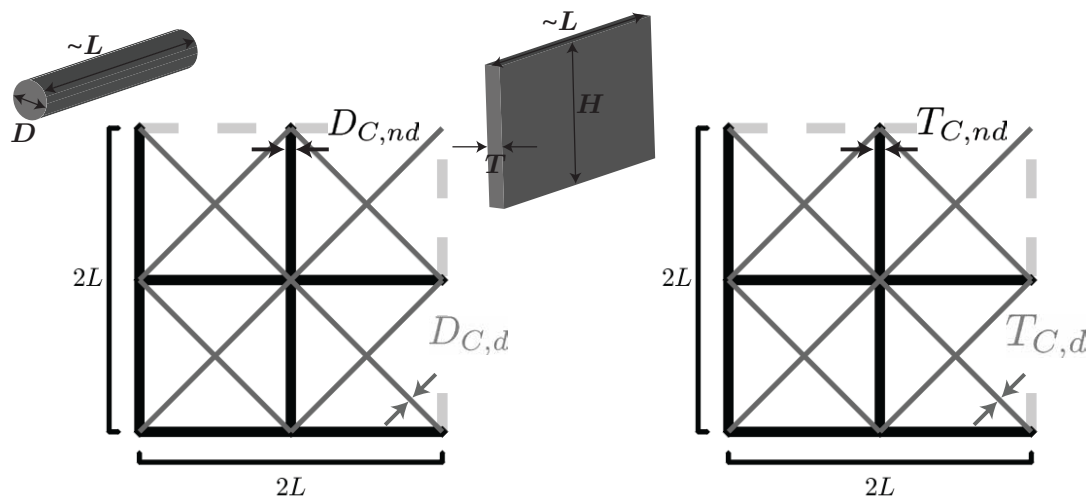
$$V_{B,d} = 4\sqrt{2}LT_{B,d}H. \quad (22)$$

Using the constraints provided by Eq. (15) and Eq. (16), as well as the above volumes, we obtain

$$T_{B,nd} = T_{B,d} \quad (23)$$

and

$$T_{B,nd} = T_{A,nd} \quad (24)$$



**Supplementary Figure 4:** Unit cell for *Design C*. Schematics of the unit cell for *Design C* (all cells filled with diagonal bracings, as is typically found in infrastructure applications). On the left we indicate the geometric parameters of this design considering a circular cross-section, while on the right we show the geometric parameters of this design considering a rectangular cross-section.

### S2.3: Design C

*Design C* was inspired by the Town lattice truss design introduced by architect Ithiel Town in 1820<sup>[S6]</sup> and consisted of every cell being reinforced by diagonal trusses passing through the nodes (Supplementary Fig. 4).

**S2.3.1: Circular cross-section**

For this design with circular cross-section, the volume of the non-diagonal and diagonal members of the unit cell are given by

$$V_{C,nd} = V_{A,nd} = 2L\pi D_{A,nd}^2 \quad (25)$$

and

$$V_{C,d} = V_{A,d} = 2\sqrt{2}L\pi D_{A,d}^2 \quad (26)$$

respectively. Using the constraints provided by [Eq. \(10\)](#) and [Eq. \(11\)](#) we obtain

$$D_{C,nd} = D_{A,nd} \quad (27)$$

and

$$\frac{D_{C,d}}{D_{C,nd}} = \frac{1}{2}. \quad (28)$$

**S2.3.2: Rectangular cross-section**

For this design with circular cross-section, the volume of the non-diagonal and diagonal members of the unit cell are given by

$$V_{C,nd} = 8LT_{C,nd}H \quad (29)$$

and

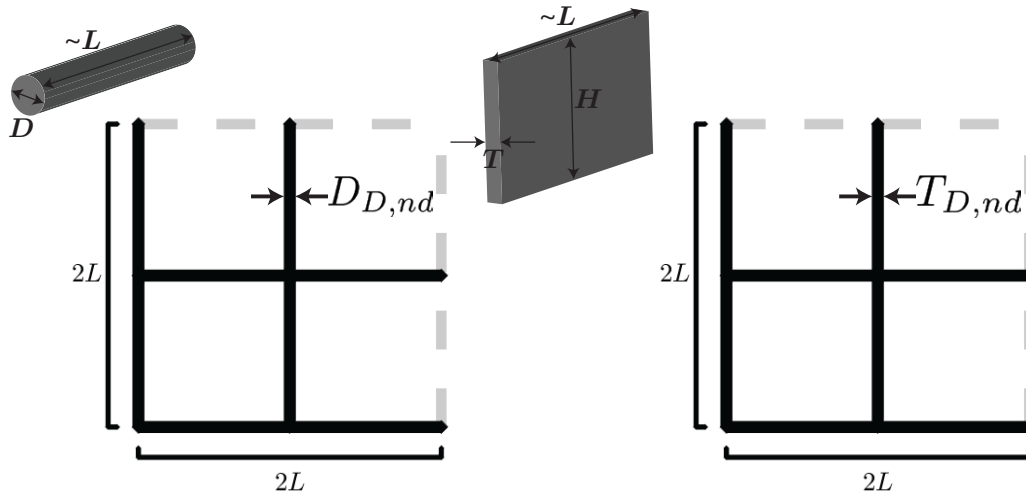
$$V_{C,d} = 8\sqrt{2}LT_{C,d}H \quad (30)$$

Using the constraints provided by [Eq. \(15\)](#) and [Eq. \(16\)](#), as well as the above volumes, we obtain

$$T_{C,nd} = 2T_{C,d}, \quad (31)$$

and

$$T_{C,nd} = T_{A,nd}. \quad (32)$$



**Supplementary Figure 5:** Unit cell for *Design D*. Schematics of the unit cell for *Design D* (square lattice with no diagonal reinforcement). On the left we indicate the geometric parameters of this design considering a circular cross-section, while on the right we show the geometric parameters of this design considering a rectangular cross-section.

## S2.4: Design D

*Design D* comprised only the square grid without diagonal reinforcement (Supplementary Fig. 5). As such, for this design we allocated the total material volume to the non-diagonal elements. Note that this design is well known to be unstable and very limited in resisting shear forces<sup>[S7,S8]</sup>.

### S2.4.1: Circular cross-section

Since

$$V_{D,T} = V_{D,nd} = V_{A,nd} = 2\pi L D_{D,nd}^2, \quad (33)$$

using the constraint provided by Eq. (10) we obtain

$$D_{D,nd} = D_{A,nd} \sqrt{1 + \frac{\sqrt{2}}{4}}. \quad (34)$$

### S2.4.2: Rectangular cross-section

Since

$$V_{D,T} = V_{D,nd} = 8L T_{D,nd} H, \quad (35)$$

using the constraint provided by Eq. (15) we obtain

$$T_{D,nd} = \left(1 + \frac{1}{\sqrt{2}}\right) T_{A,nd} \quad (36)$$

## S3: EXPERIMENTAL SETUP

### S3.1: Fabrication

We fabricated each of the lattice specimens with a Stratasys Connex500 multi-material 3D printer using the digital material FLX9795-DM. During the fabrication process, a photosensitive liquid precursor (the 3D printer "ink") is deposited in a voxel-by-voxel fashion. Several precursors are used to print multiple materials with different properties and the resulting modulus can be tuned by varying the concentration of photo-initiator. A UV light cross-links the liquid precursors in a layer-by-layer fashion and this process is repeated until the full 3D model is built. Each of the specimens were printed in parallel along with the print-head direction as to minimize material anisotropy between specimens. Depending on the liquid precursor composition and the degree of cross-linking, a broad range of mechanical properties can be achieved from stiff thermoplastic-like to soft rubber-like materials. For the samples fabricated for this study, we tuned the process to realize a material with an initial shear modulus  $\mu = 14.5$  MPa. The dimensions of the fabricated samples (as measured with a caliper) are shown in [Supplementary Tab. 1](#), and all fabricated lattices had depth (through thickness)  $H = 40$  mm.

### S3.2: Testing

All samples were tested using an Instron 5969 with a compression speed of 0.2 mm/min in order to allow material viscoelastic relaxation, thus achieving the material's fully elastic behavior. Note that the specific compression speed was determined by testing similar structures at different loading rates until the stress-strain curve achieved a rate independent solution.

To test the response of the specimens under uniaxial compression, we used standard compression plates with a 50kN load cell. The response under bending was also characterized using a 3-point bend test mount and a 500N load cell. While similar results were obtained regardless of whether the models were loaded parallel or perpendicular to the print direction, for experimental consistency all tests were performed with models oriented parallel to the print direction.



	Design A	Design B	Design C	Design D	Optimal Design
<i>Total Length (Test Dir.)</i> [mm]	93.29 [93]	93.45 [93]	93.47 [93]	93.25 [93]	93.27 [93]
<i>Total Length (Non-Test Dir.)</i> [mm]	93.52 [93]	93.31 [93]	93.55 [93]	93.19 [93]	93.54 [93]
<i>Depth H</i> [mm]	39.98 [40]	40.06 [40]	40.19 [40]	40.10 [40]	40.25 [40]
<i>Top L</i> [mm]	14.7 [15]	14.95 [15]	14.93 [15]	14.96 [15]	15.02 [15]
<i>Top <math>T_{\alpha,nd}</math></i> [mm]	1.48 [1.5]	1.56 [1.5]	1.51 [1.5]	2.68 [2.56]	1.11 [1.03]
<i>Top <math>T_{\alpha,d}</math></i> [mm]	0.86 [0.75]	1.53 [1.5]	0.78 [0.75]	N/A	1.07 [1.08]
<i>Bottom L</i> [mm]	15.04 [15]	15.01 [15]	15.01 [15]	14.96 [15]	15.05 [15]
<i>Bottom <math>T_{\alpha,nd}</math></i> [mm]	1.55 [1.5]	1.57 [1.5]	1.57 [1.5]	2.69 [2.56]	1.11 [1.03]
<i>Bottom <math>T_{\alpha,d}</math></i> [mm]	0.85 [0.75]	1.61 [1.5]	0.86 [0.75]	N/A	1.08 [1.08]
<i>Weight</i> [g]	145.2	148.4	150.8	143.36	146.36

**Supplementary Table 1: 3D Printed Model Caliper Sample Measurements.** This table provides the caliper measurements averaged over  $n = 3$  separate specimens for each design (values in black) as well as the expected values (bracketed values in red). All measurements reported were conducted prior to testing the samples.

## S4: FINITE ELEMENT (FE) ANALYSIS

The finite element analyses presented in this article were conducted using *ABAQUS/Standard*. All models were constructed using 1D Timoshenko beam elements (*ABAQUS* element type B22) and all beam crossings were assumed to be welded joints. For each instance, seeding of the mesh was chosen to be at least 1/10 of the minimum beam length. The response of the material was captured using an incompressible Neo-Hookean material model with shear modulus  $\mu = 14.5$  MPa. Due to small inconsistencies in the 3D printing process ([Supplementary Tab. 1](#)), we adjusted the dimensions of the FE models accordingly by applying a mass correction based on data derived from the 3D-printed models in Main Text Figs. 2(f) and 4(b).

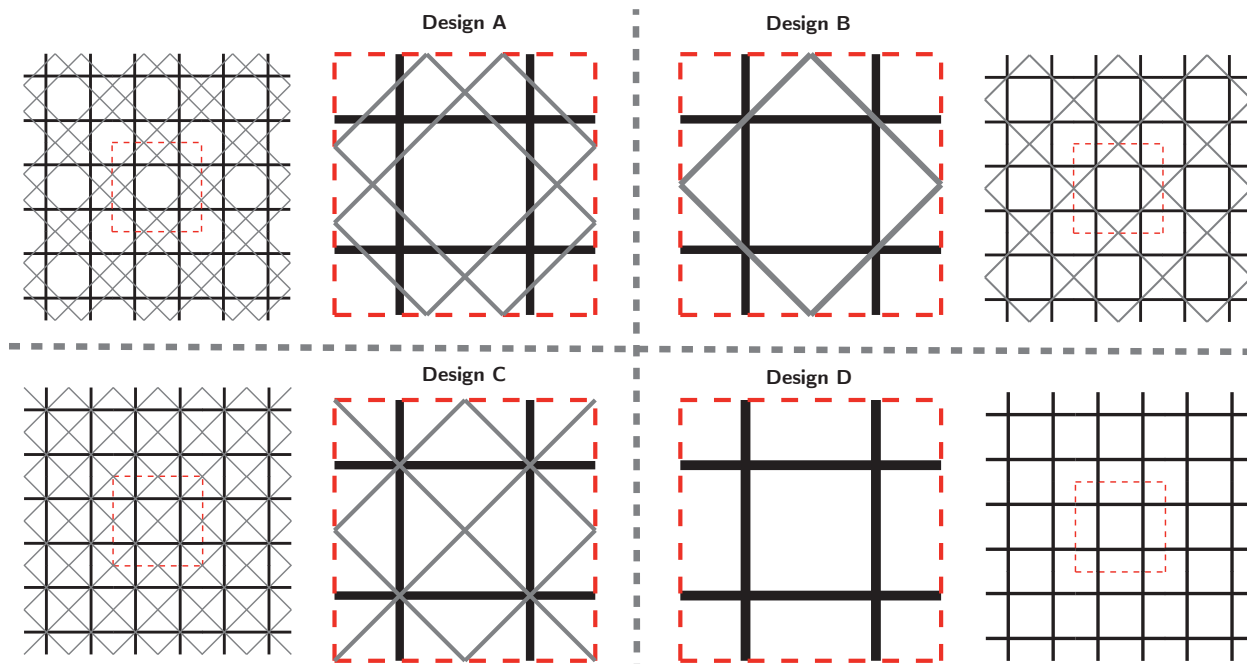
To reduce the computational cost, in most of our analyses, we took advantage of the periodicity of the structures and investigated their response using the unit cells shown in [Supplementary Fig. 6](#). To subject the unit cells to a macroscopic deformation gradient  $\bar{\mathbf{F}}$  periodic boundary conditions were imposed on all cell boundaries by enforcing<sup>[S9,S10]</sup>

$$\mathbf{u}_\alpha^{A_i} - \mathbf{u}_\alpha^{B_i} = (\bar{\mathbf{F}}_{\alpha\beta} - \delta_{\alpha\beta})(\mathbf{X}_\beta^{A_i} - \mathbf{X}_\beta^{B_i}), \quad i = 1, 2, \dots, K \quad (37)$$

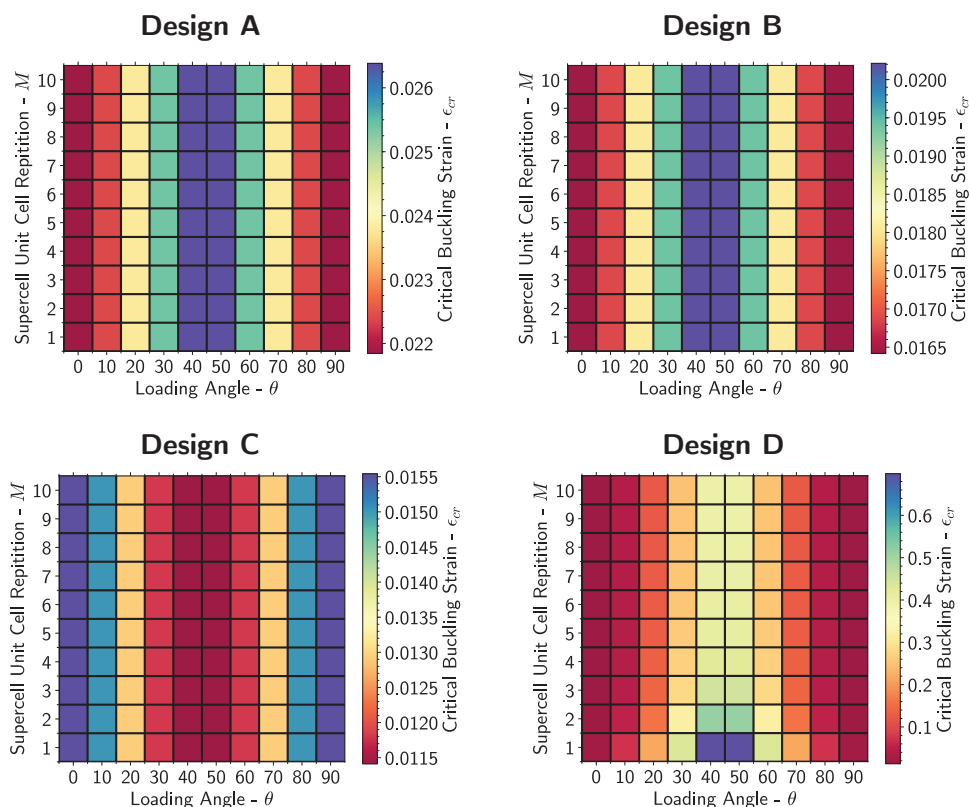
where  $\delta_{\alpha\beta}$  is the Kronecker delta,  $\mathbf{u}_\alpha^{A_i}$  and  $\mathbf{u}_\alpha^{B_i}$  ( $\alpha = 1, 2$ ) are displacements of points periodically located on the boundary of the unit cell. Moreover,  $\mathbf{X}_\alpha^{A_i}$  and  $\mathbf{X}_\alpha^{B_i}$  ( $\alpha = 1, 2$ ) are the initial coordinates of points periodically located on the boundary of the unit cell and  $K$  denotes the number of pairs of nodes periodically located on the boundary of the unit cell. Note that the components of  $\bar{\mathbf{F}}$  can be conveniently prescribed within the finite element framework using a set of virtual nodes. The corresponding macroscopic first Piola-Kirchoff stress is then obtained through virtual work considerations<sup>[S9,S10]</sup>. To subject the structures to uniaxial compression, we prescribed

$$\bar{\mathbf{F}} = \begin{bmatrix} \text{UNSET} & 0 \\ 0 & 1 + \varepsilon_y \end{bmatrix}, \quad (38)$$

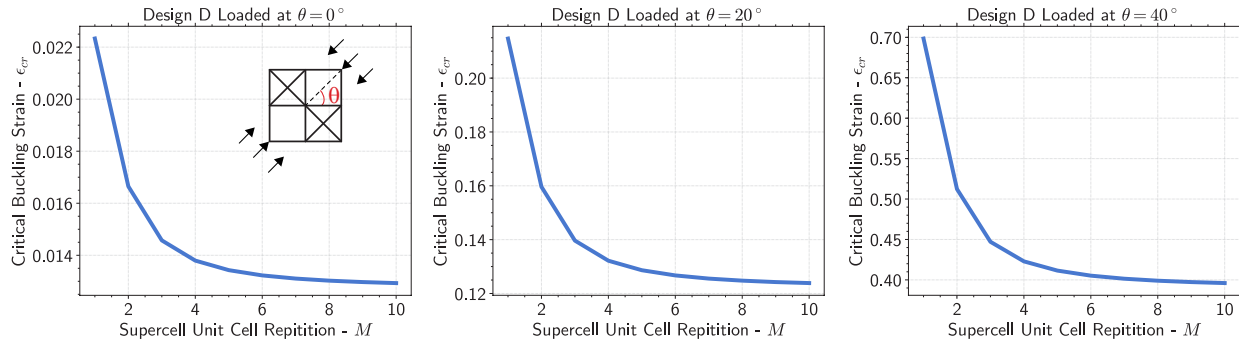
where  $\varepsilon_y$  is the macroscopic applied strain. Moreover, in order to investigate the structure's response for different loading directions, we rotated the unit cell model by an angle  $\theta$  and re-applied the above periodic boundary conditions using the rotated geometry coordinates. To determine the linear stiffness for the infinite structures we performed a small strain linear elastic analysis. For all buckling analyses, we performed a linear stability buckling analysis (\**Buckling* command in *ABAQUS* input file). Since buckling may alter the periodicity of the structure, we considered super cells consisting of  $M \times M$  undeformed RVEs with  $M \in [1, 10]$  subjected to periodic boundary conditions and calculated the critical strain for each of them. The critical strain of the infinite periodic structure was subsequently defined as the minimum critical strain on all considered super cells. The results reported in [Supplementary Fig. 7](#) show that for *Design A-C* the critical strain is identical for all considered values of  $M$ , indicating that the structure undergoes a local (microscopic) instability with wavelength corresponding to the size of the RVE. *Design D*, on the other hand, undergoes a global (macroscopic) instability, as the minimum critical strain is observed for  $M = 10$  ([Supplementary Fig. 8](#)).



**Supplementary Figure 6: RVE used for the different designs.** Schematics of the RVEs used for *Design A-D*. Periodic boundary conditions are applied on the nodes that intersect with the red dashed line.

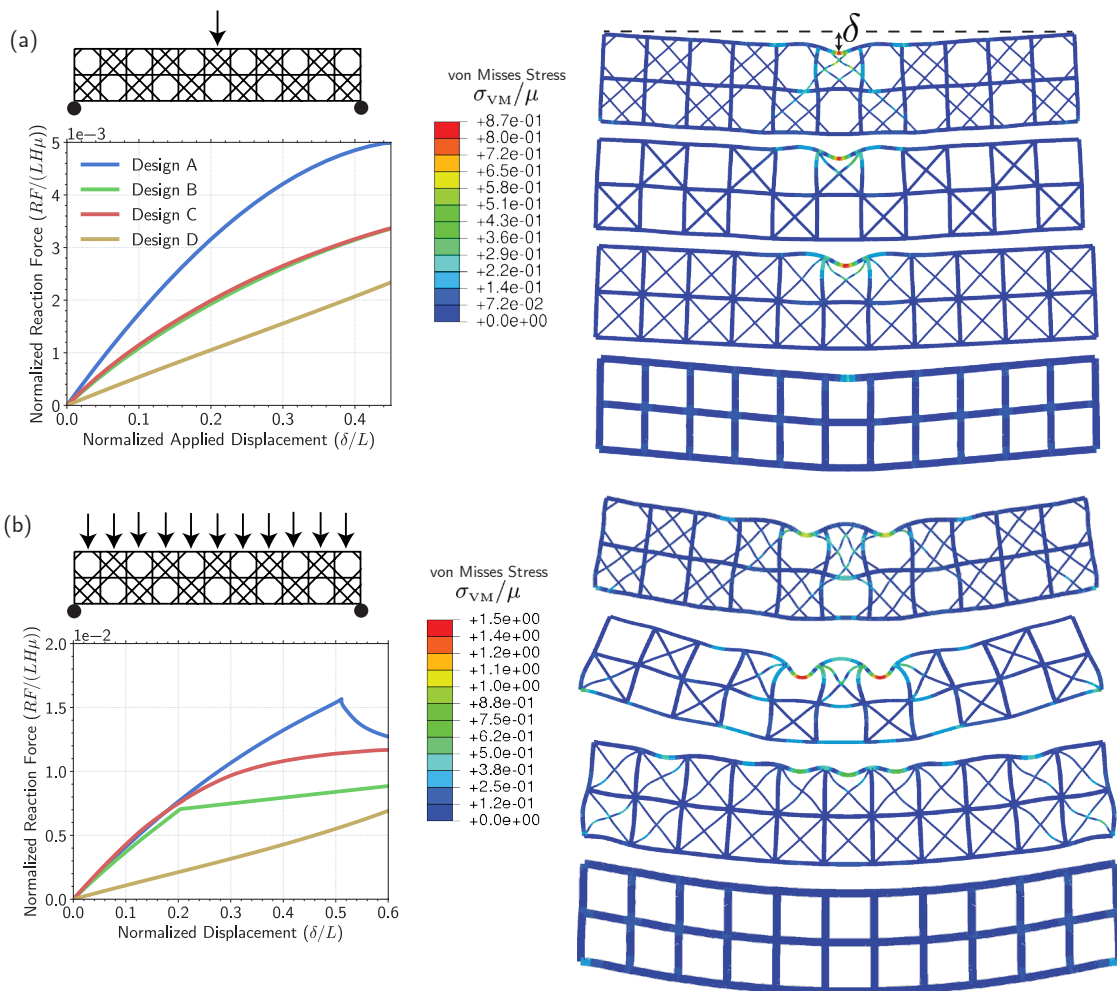


**Supplementary Figure 7: Global versus local instabilities.** In each contour plot, we report the critical strain as a function of  $\theta$  and the size of the super cell. For each of the simulations, periodic boundary conditions are applied along the outer perimeter of the  $M \times M$  structure. This plot conveys that for *Designs A-C* the prominent buckling mode is the local mode, whereas for *Design D*, the prominent mode is a global mode. Choosing a sufficiently large  $M$  allows *Design D* to converge to a finite value for each  $\theta$ .

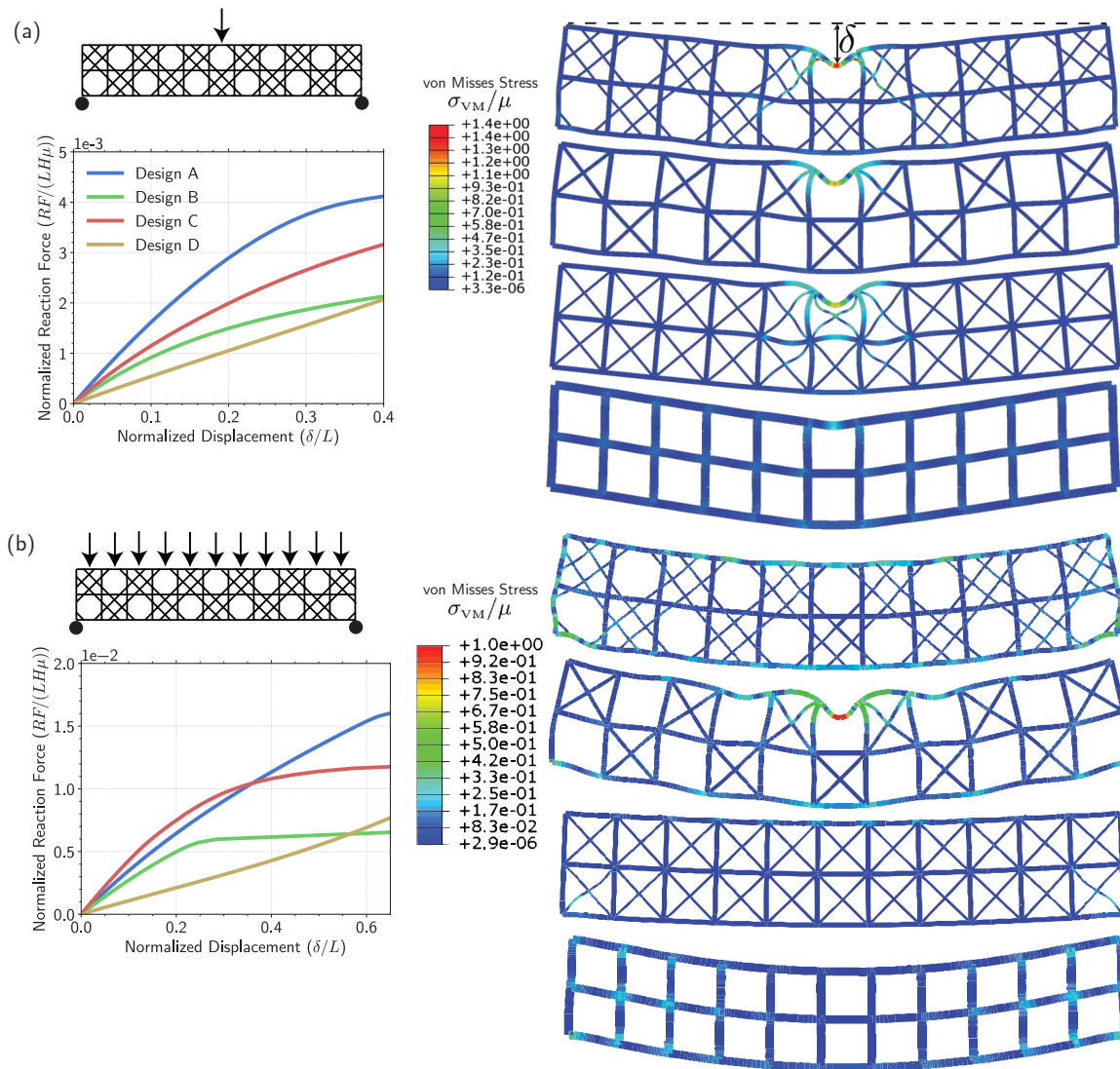


**Supplementary Figure 8:** Critical strain for *Design D* at three selected loading angles. As the number of minimum RVEs  $M$  considered increases, the value for the critical buckling strain asymptotically approaches a constant.

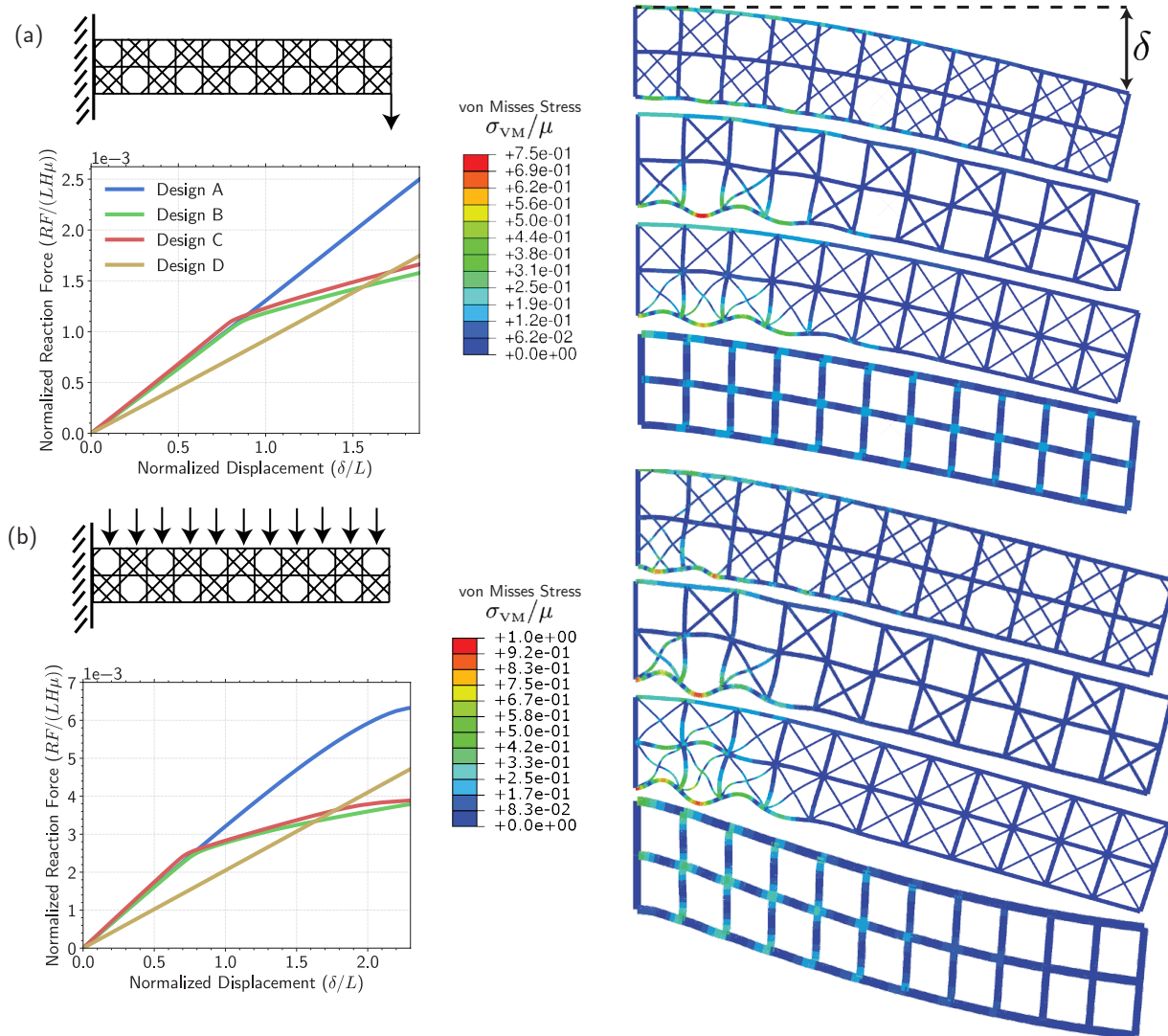
#### S4.1: Additional numerical results



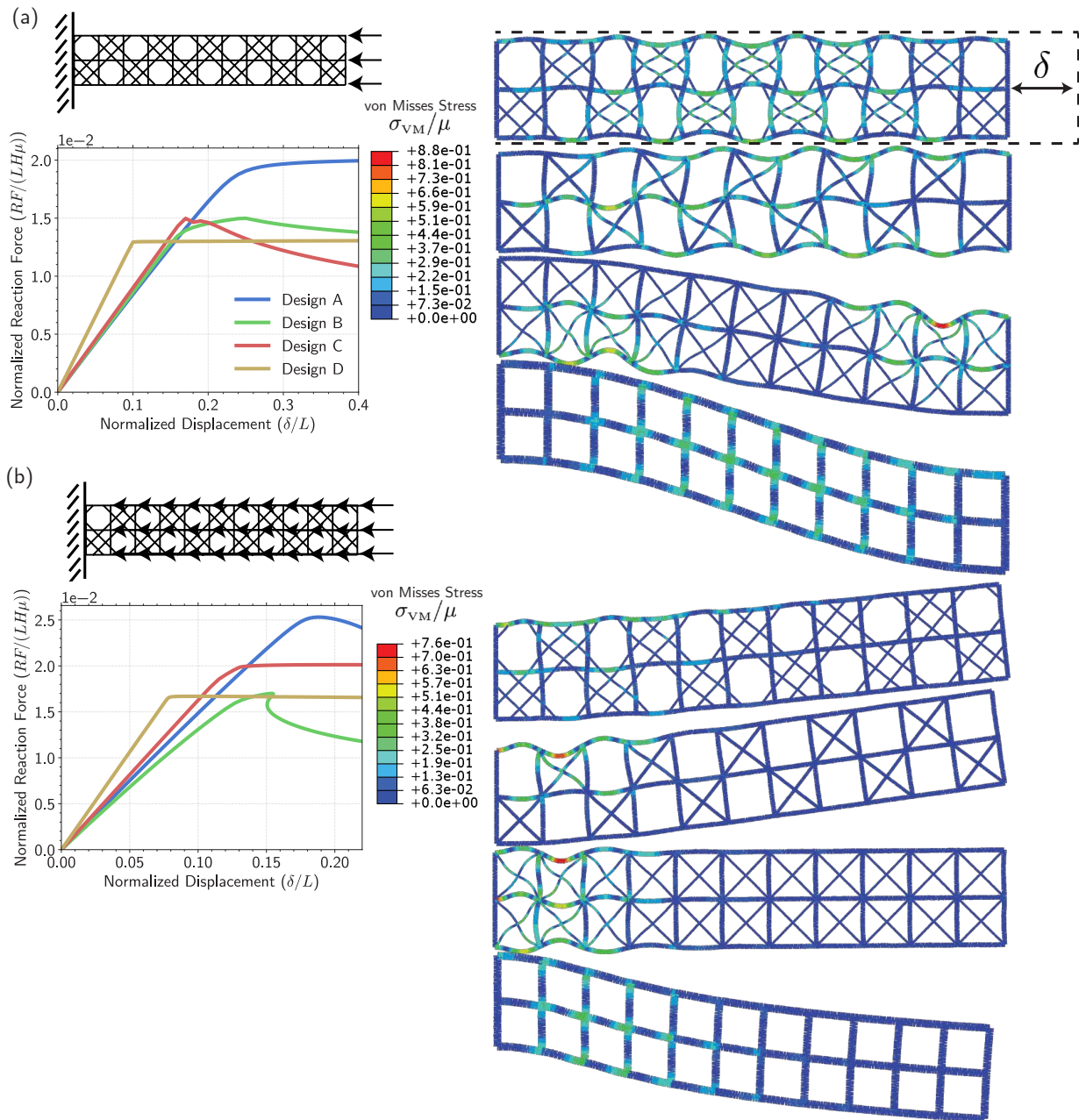
**Supplementary Figure 9:** Mechanical response for different loading conditions. For all cases presented in this figure, we consider a structure with  $11 \times 2$  cells (5.5 RVEs) and hinged boundary conditions applied to cells *with* diagonal reinforcements. (a) In this case, a point deflection  $\delta$  is applied to the top center of the structure while the bottom outside corners have constrained deflections, but unconstrained rotation. The normalized reaction force is plotted as a function of the  $\delta$  for the four considered designs. Moreover, on the right we show numerical snapshots of the four designs for  $\delta/L = 0.45$ . The colors in these pictures provide a measure of the normalized von Mises stress. (b) In this case a distributed load is applied across the top of the structure while the bottom outside corners have constrained displacements, but unconstrained rotation. The normalized total reaction force is plotted as a function of the deflection for the four considered designs. On the right we show numerical snapshots of the four designs for  $\delta/L = 0.6$ , where  $\delta$  is the vertical deflection of the top mid-point from the undeformed configuration. The colors in these pictures provide a measure of the normalized von Mises stress.



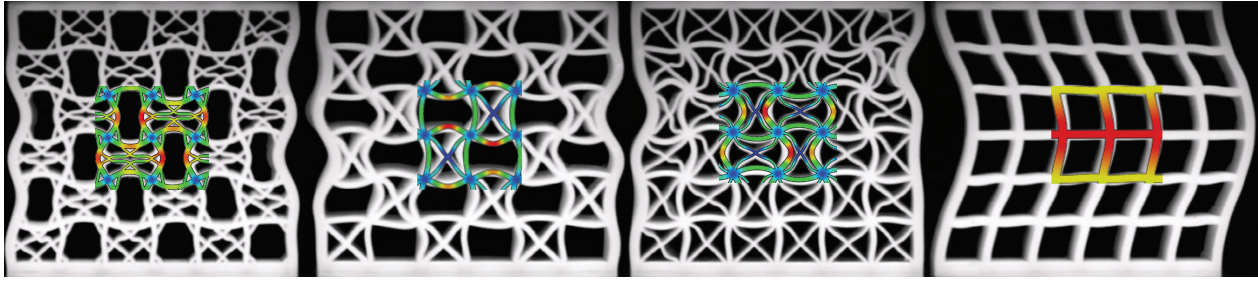
**Supplementary Figure 10: Mechanical response for different loading conditions.** For all cases presented in this figure, we consider a structure with  $11 \times 2$  cells (5.5 RVEs) and hinged boundary conditions applied to cells *without* diagonal reinforcements. (a) In this case, a point deflection  $\delta$  is applied to the top center of the structure while the bottom outside corners have constrained deflections, but unconstrained rotation. The normalized reaction force is plotted as a function of the  $\delta$  for the four considered designs. Moreover, on the right we show numerical snapshots of the four designs for  $\delta/L = 0.45$ . The colors in these pictures provide a measure of the normalized von Mises stress. (b) In this case a distributed load is applied across the top of the structure while the bottom outside corners have constrained displacements, but unconstrained rotation. The normalized total reaction force is plotted as a function of the deflection for the four considered designs. On the right we show numerical snapshots of the four designs for  $\delta/L = 0.6$ , where  $\delta$  is the vertical deflection of the top mid-point from the undeformed configuration. The colors in these pictures provide a measure of the normalized von Mises stress.



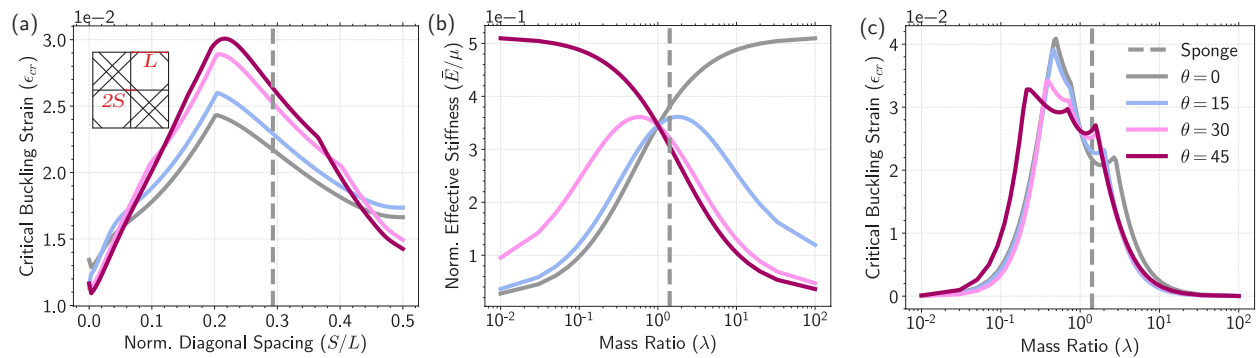
**Supplementary Figure 11: Mechanical response for different loading conditions.** For all cases presented in this figure, we consider a long slender realization of each design consisting of  $11 \times 2$  cells (5.5 RVEs). (a) In this case, a point deflection  $\delta$  is applied to the bottom right of the structure while the left edge of the structure is fixed. The normalized total reaction force is plotted as a function of the deflection for the four considered designs. Moreover, on the right we show numerical snapshots of the four designs for  $\delta/L = 1.9$ . The colors in these pictures provide a measure of the normalized von Mises stress. (b) In this case a distributed load is applied across the top of the structure while the left edge of the structure is fixed. The normalized total reaction force is plotted as a function of the deflection for the four considered designs. On the right we show numerical snapshots of the four designs for  $\delta/L = 2.3$ , where  $\delta$  is the vertical deflection of the top right edge-point from the undeformed configuration. The colors in these pictures provide a measure of the normalized von Mises stress.



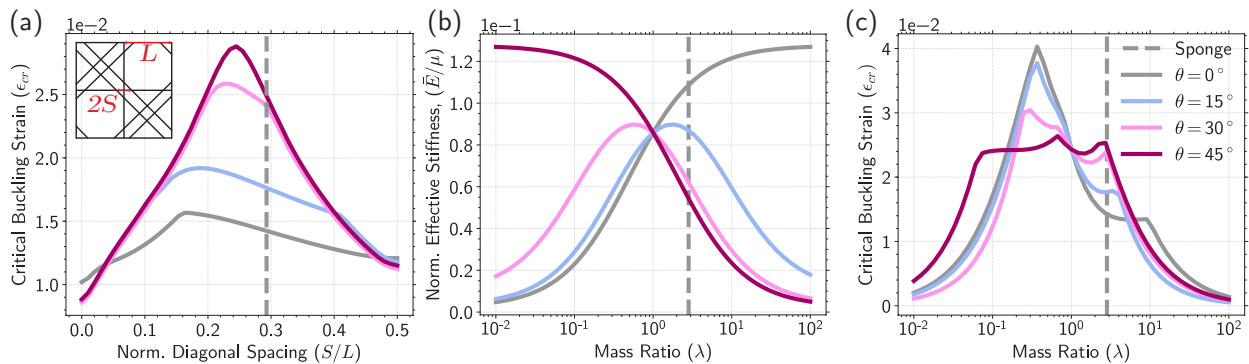
**Supplementary Figure 12: Mechanical response for different loading conditions.** For all cases presented in this figure, we consider a long slender realization of each design consisting of  $11 \times 2$  cells (5.5 RVEs). (a) In this case a deflection  $\delta$  is applied to the right edge of the structure while the left edge of the structure is fixed. The normalized total reaction force is plotted as a function of the applied deflection for the four considered designs. Moreover, on the right we show numerical snapshots of the four designs for  $\delta/L = 0.4$ . The colors in these pictures provide a measure of the normalized von Mises stress. (b) In this case a distributed load is applied across each level of the structure while the left edge of the structure is fixed. The normalized total reaction force is plotted as a function of the deflection for the four considered designs. On the right we show numerical snapshots of the four designs for  $\delta/L = 0.22$ , where  $\delta$  is the horizontal deflection of the right mid-point from the undeformed configuration. The colors in these pictures provide a measure of the normalized von Mises stress.



**Supplementary Figure 13: Comparison between experimental and numerical results.** This figure shows experimental snapshots of the experimental specimens at an applied 8% compressive strain overlaid with a cutout of the representative deformation predicted by our FE analyses. The close agreement between the experiments and simulations suggests that the FE simulations are accurately capturing the physical deformation of the specimens.

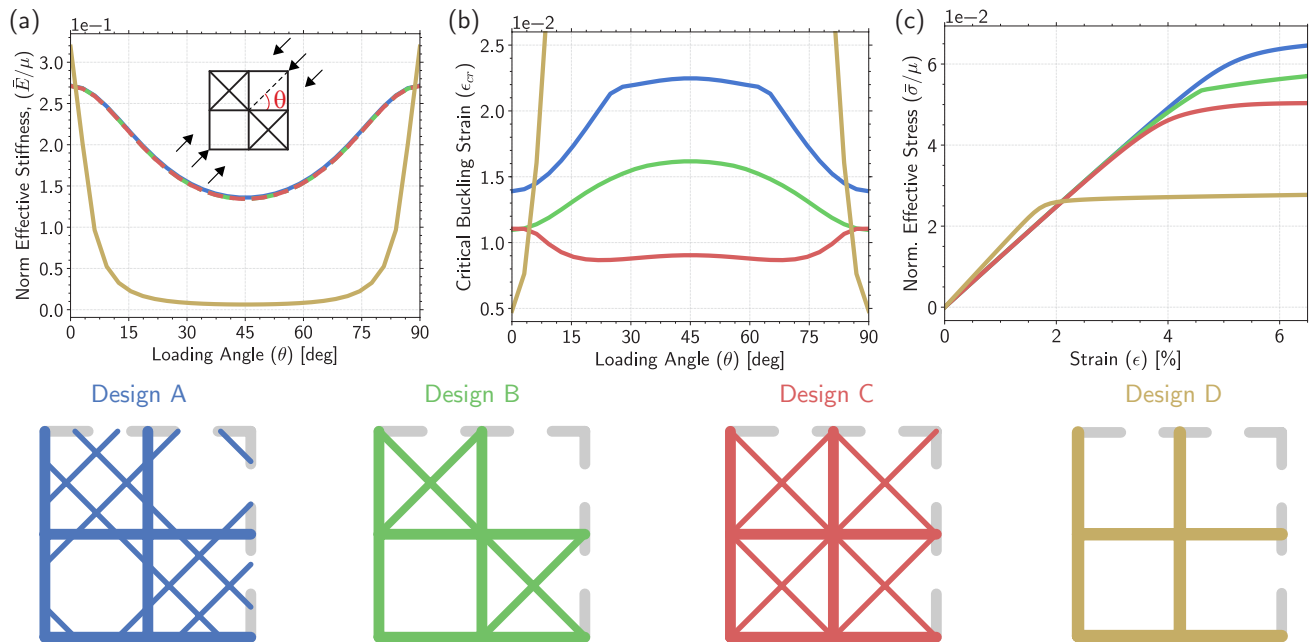


**Supplementary Figure 14: Effect of diagonal spacing and mass ratio on the response of Design A with rectangular cross-section.** (a) Evolution of the critical strain as function of the spacing between diagonals. (b) Evolution of structural stiffness as a function of the mass ratio  $\lambda = V_{nd}/V_d$ . (c) Evolution of critical strain as a function of the mass ratio  $\lambda$ . For each of the plots, the gray dashed vertical line indicates the parameter of Design A. These results demonstrate that Design A, the sponge design, is very close to the optimal one, when considering each parameter individually. All designs are characterized by the same total volume.

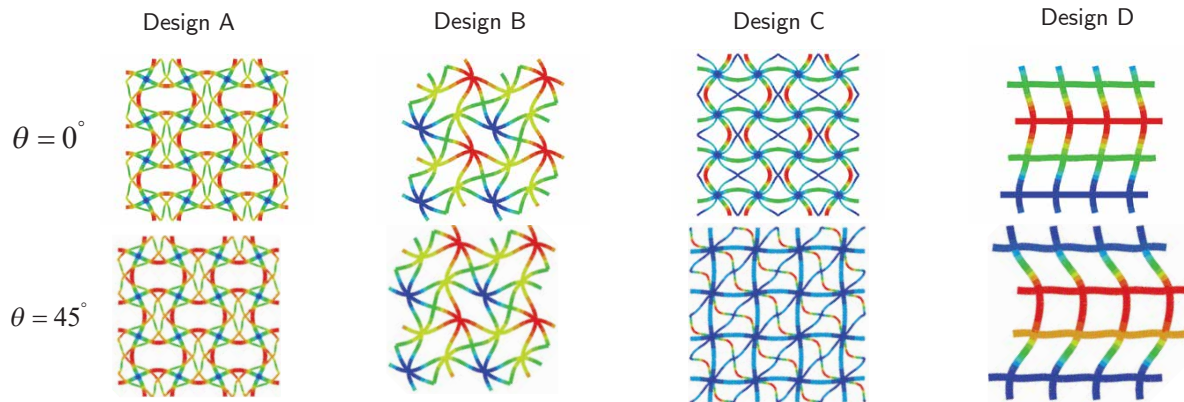


**Supplementary Figure 15: Effect of diagonal spacing and mass ratio on the response of Design A with circular cross-section.** (a) Evolution of critical strain as function of the spacing between diagonals. (b) Evolution of structural stiffness as a function of the mass ratio  $\lambda = V_{nd}/V_d$ . (c) Evolution of critical strain as a function of the mass ratio  $\lambda$ . For each of the plots, the gray dashed vertical line indicates the parameter of Design A. These results demonstrate that the shape of the cross-section does not have a significant role, as these results are similar to those presented in Supplementary Fig. 14 for a lattice with rectangular cross-section. All designs are characterized by the same total volume.

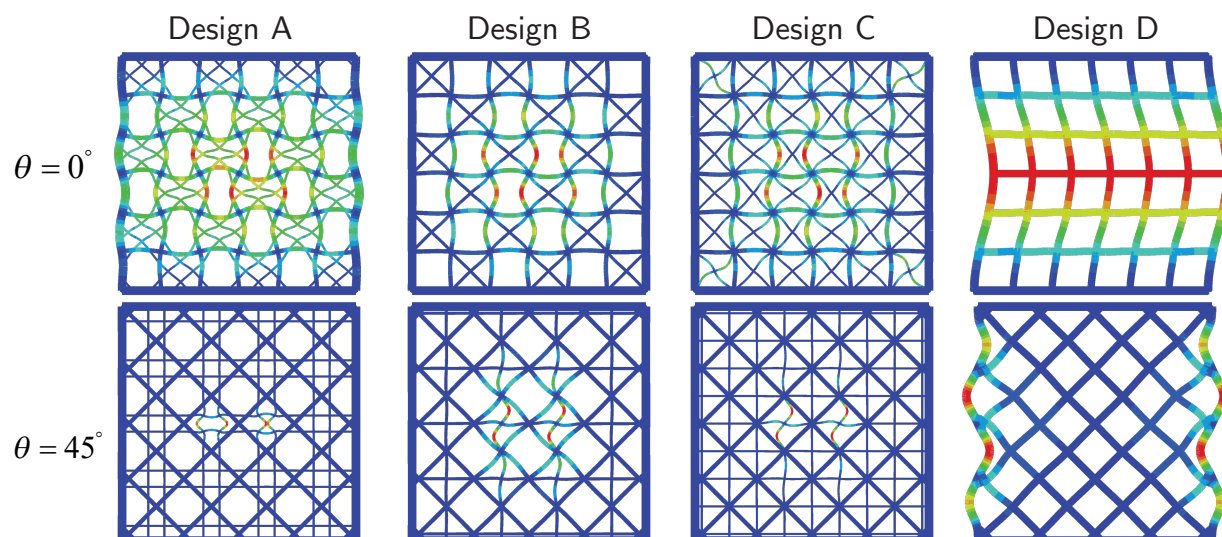




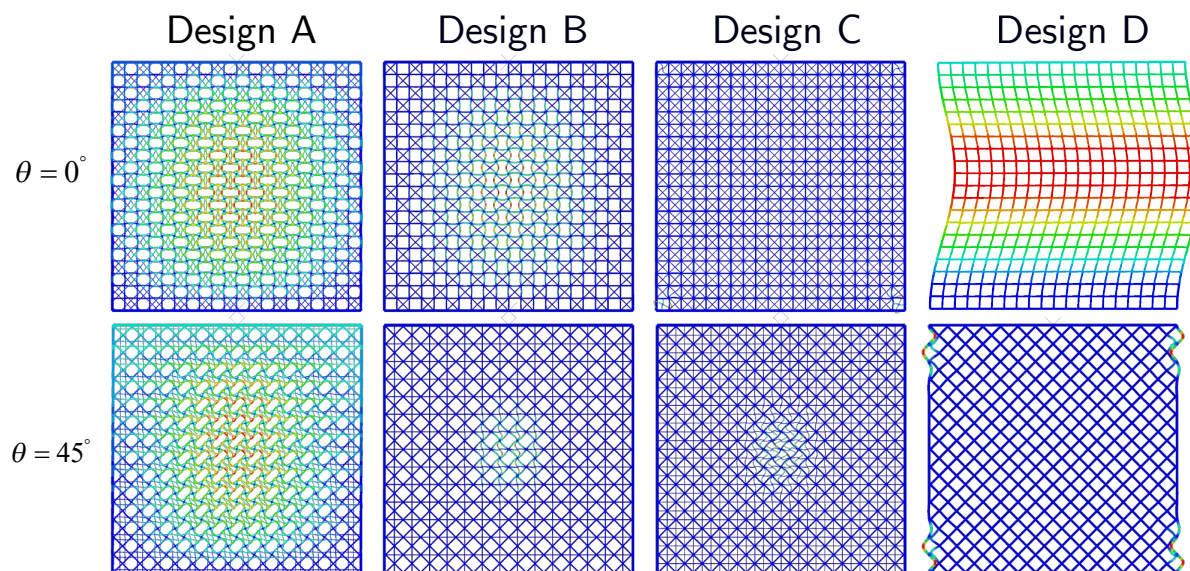
**Supplementary Figure 16: Response of Design A-D with circular cross-section.** (a) Evolution of the structural stiffness as a function of loading angle  $\theta$  for lattices of infinite size. (b) Evolution of the effective buckling stress for the different lattice designs as a function of loading angle  $\theta$ . Results are obtained by simulating a super-cell with 10 by 10 units and periodic boundary conditions. (c) Numerically predicted stress-strain curves for the 4 considered lattices when compressed with  $\theta = 0$ . For all plots, the color of the line corresponds to the respective design color depicted on the bottom.



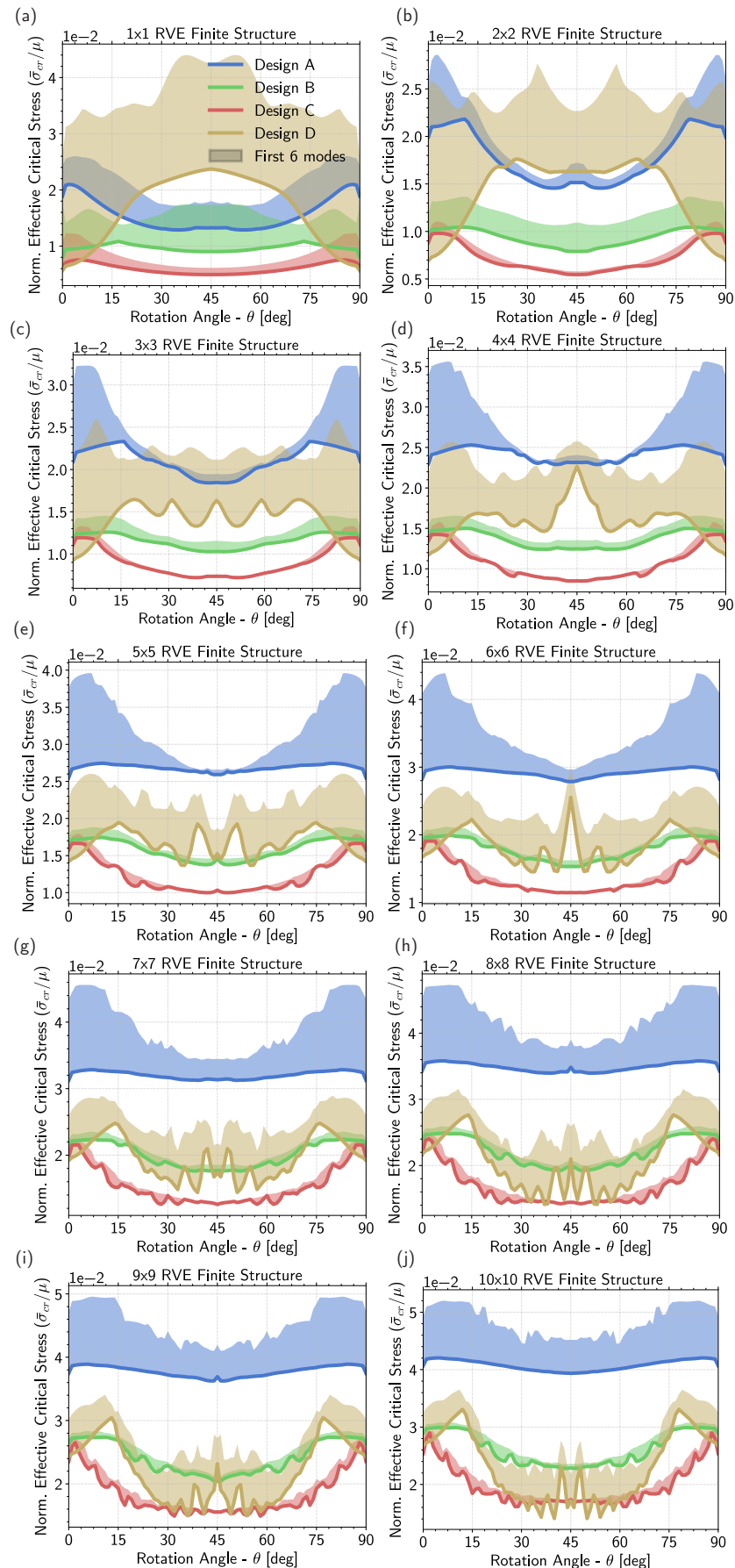
**Supplementary Figure 17: Critical modes of Design A-D at  $\theta = 0^\circ$  and  $\theta = 45^\circ$ .** These critical buckling modes were calculated using a 10 by 10 super-cell and the snapshots shown here are the center 2x2 cells of the full 10x10 model. Designs A-B in this figure exhibit a similar deformation pattern when loaded at  $0^\circ$  or  $45^\circ$ . However, for Design C-D, different buckling patterns are triggered when loaded at  $0^\circ$  and  $45^\circ$ .



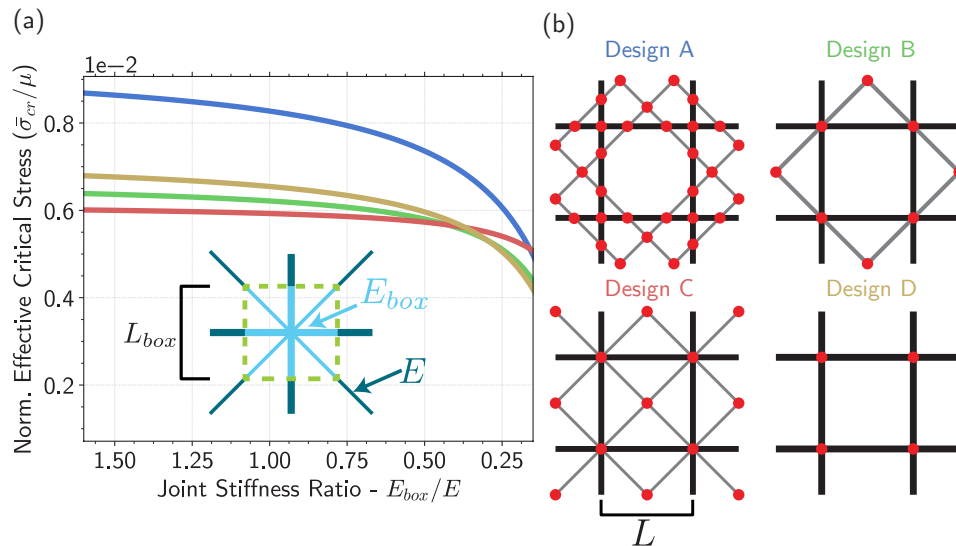
**Supplementary Figure 18: Modes of finite size structure comprised of 3x3 unit cells.** This figure shows the critical buckling modes obtained for finite geometries for *Design A-D* loaded in uniaxial compression. The top row corresponds to a structure angled at  $0^\circ$ , as in the experiments. The second row corresponds to the same structure however rotated by  $45^\circ$  and cut to maintain the same size as the row above. Each column in this figure corresponds to a different design. For each of the geometries, a slightly thicker frame is constructed to localize most of deformation away from the edges of the structure. These results convey that the diagonally reinforced geometries are not susceptible to edge effects when using at least 3 unit cells, whereas the non-diagonally reinforced structure is more susceptible to edge effects.



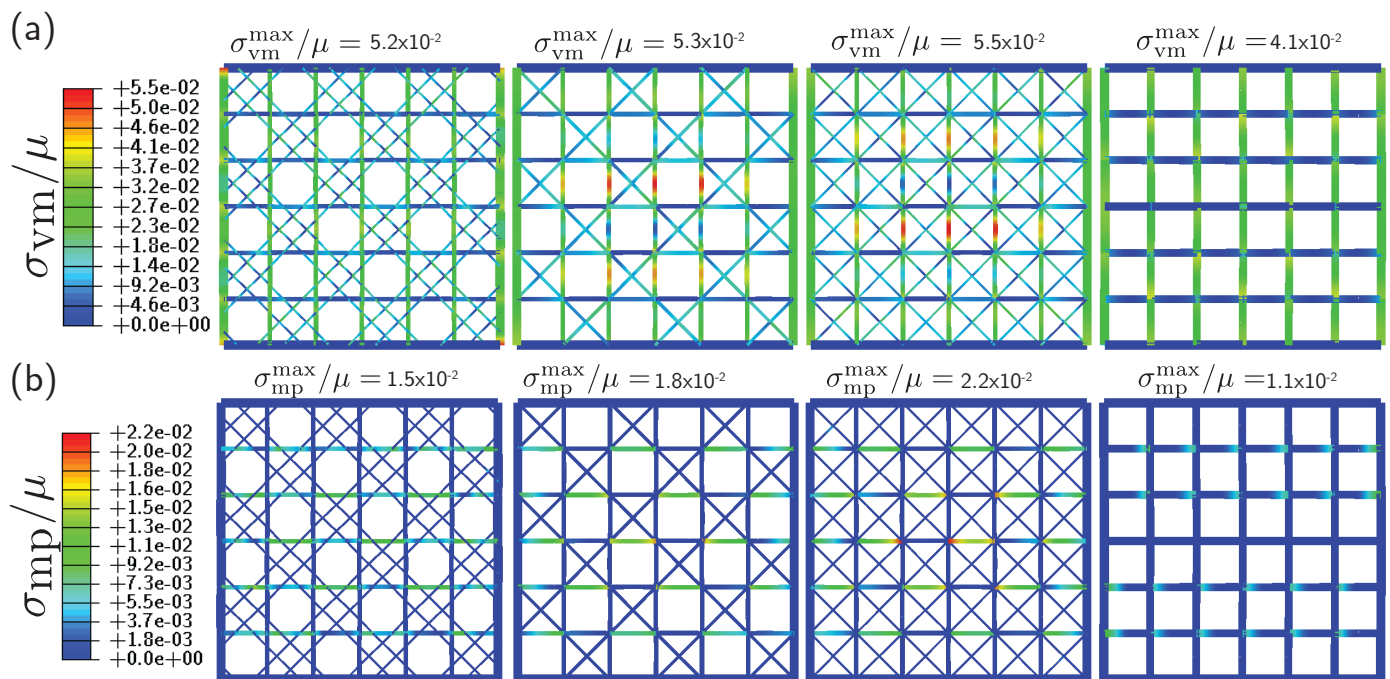
**Supplementary Figure 19: Modes of finite size structure comprised of 10x10 unit cells.** This figure shows the critical buckling modes obtained for finite geometries of *Design A-D* loaded in uniaxial compression. The top row corresponds to a structure angled at  $0^\circ$ , as considered in the experiments. The second row corresponds to the same structure however rotated by  $45^\circ$  and cut to maintain the same size as the row above. Each column in this figure corresponds to a different design. For each of the geometries, a slightly wider frame is constructed to minimize edge effects.



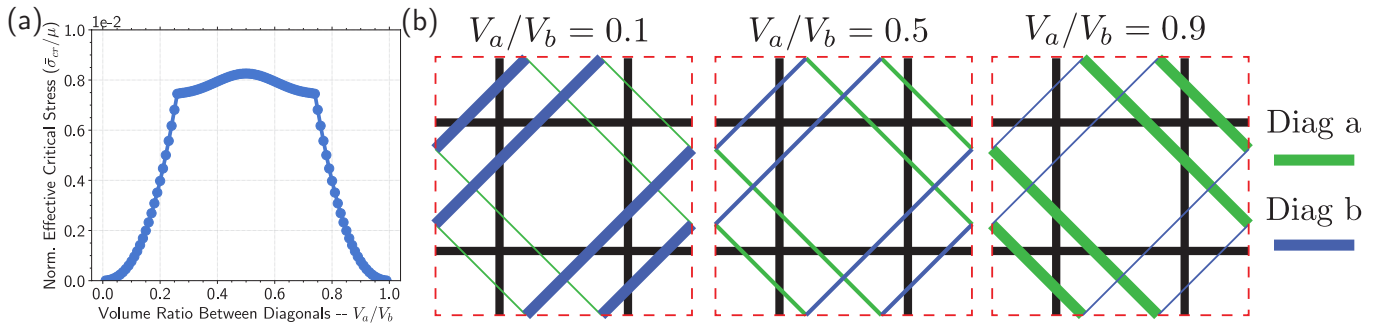
**Supplementary Figure 20: Effect of sample size on critical stress.** Evolution of the effective buckling stress as a function of the loading angle  $\theta$  for finite-size lattice structures comprising  $M$  by  $M$  unit cells, where  $M$  ranges from (a) 1 to (j) 10. The shaded parts in (a) - (j) represent the lowest six buckling modes range. All plots provide a clear indication on the superior performance of *Design A* when comparing to *Designs C-D*, when  $M > 2$ .



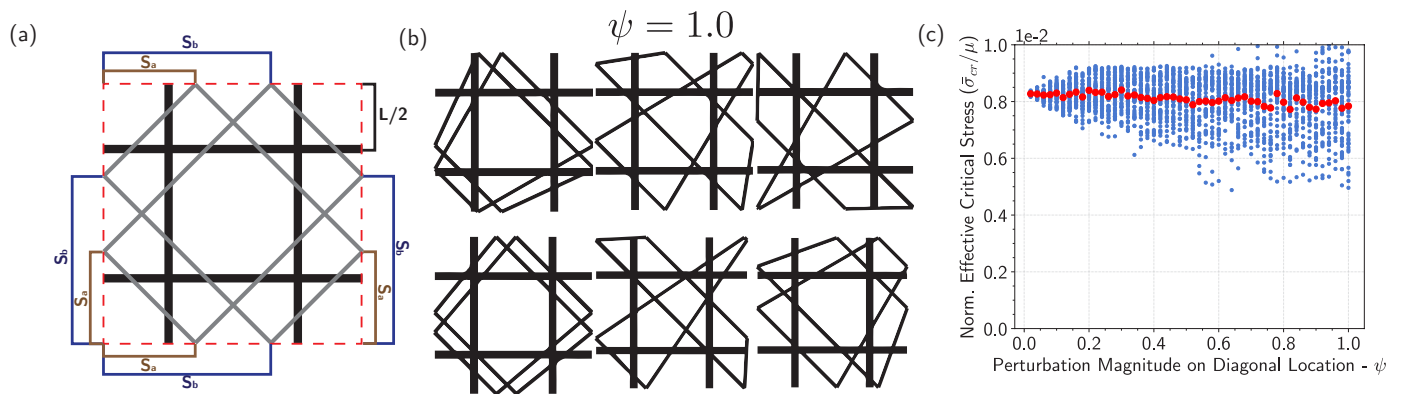
**Supplementary Figure 21: Effect of joint stiffness analysis on critical stress.** To evaluate the influence of the joints on the effective buckling stress of *Designs A-D* we conduct FE analysis on a period unit cell with modified stiffness on elements near the joints. In particular, we set the material stiffness to  $E_{box}$  for the elements within a box of edge length  $L_{box} = 0.02L$  (see inset schematic in (a)). (a) Evolution of the normalized effective critical stress for varying the joint stiffness ratio  $E_{box}/E$ . (b) Schematic of *Design A-D* unit cells with the location of the joints highlighted by red dots.



**Supplementary Figure 22: Stress Analysis.** Numerical snapshots extracted from non-linear FE analysis (with first mode imposed imperfection) at an imposed strain  $\epsilon = 0.001$ . (a) The color indicates the normalized von Mises stress  $\sigma_{vm}$  with the maximum value for each structure indicated above each figure. (b) The color indicates the normalized maximum principle stress  $\sigma_{mp}$  with the maximum value for each structure indicated above each figure.



**Supplementary Figure 23: Effect of disorder on critical stress.** To evaluate the influence of disorder on the effective buckling stress of *Design A*, we conduct FE analysis on a period unit cell on which we vary the mass allocated between diagonals going in different directions. For all analysis presented, the total volume allocated between diagonals and non-diagonals remains constant, namely  $\lambda = \sqrt{2}$ .  $V_a/V_b$  defines the ratio between the volume allocated to the two families of diagonals (with  $V_a + V_b = V_{nd}/\sqrt{2}$ ). (a) Evolution of the effective buckling stress as a function of  $V_a/V_b$  for  $\theta = 0$ . We find that for  $0.25 < V_a/V_b < 0.75$  disorder has a minor effect on the effective buckling stress. (b) Schematics of selected unit cell with different diagonal volume allocations  $V_a/V_b$ .



**Supplementary Figure 24: Effect of disorder on critical stress.** To evaluate the influence of disorder on the effective buckling stress of *Design A* we conduct FE simulations on a periodic unit cell in which we vary the location and orientation of individual diagonals, while maintaining periodicity of the structure. For all analysis presented, the total volume of the diagonals remains constant and equal to  $V_{nd}/\sqrt{2}$ . (a) Schematic illustrating the spacing  $S_a$  and  $S_b$ , defining the position of each diagonal. (b) Schematics of unit cell with varying  $S_a$  and  $S_b$  (with  $S_a, S_b \in [0, 2L]$ ). (c) Effective buckling stress for 2,500 unit cell simulations, in which we perturb the sponge strut spacings  $S_a$  and  $S_b$  using a Gaussian  $\mathcal{N}$  with mean  $\mu = 0$ , standard deviation  $\sigma = 0.3$  and magnitude  $\psi$ , namely,  $S_a/L = 1 - 1/(\sqrt{2} + 2) + \psi\mathcal{N}(0, 0.3)$  and  $S_b/L = 1 + 1/(\sqrt{2} + 2) + \psi\mathcal{N}(0, 0.3)$ . The red markers indicate the mean for each considered  $\psi$  containing  $n = 50$  simulations per discrete value of  $\psi$ . We find that the applied perturbation does not alter the mean effective critical stress and that the variation of  $\bar{\sigma}_{cr}$  is bounded between  $0.6 \times 10^{-2}\mu$  and  $1.0 \times 10^{-2}\mu$ .

## S5: OPTIMIZATION ANALYSIS

In an effort to identify the diagonal reinforcement resulting in a square lattice with the highest critical load, we used a Python implementation of the Covariance Matrix Adaptation Evolution Strategy (CMA-ES)<sup>[S11]</sup>. CMA-ES is an evolutionary algorithm that is used to solve optimization problems by iteratively solving several forward problems to adjust a covariance matrix of the solution. Since it is a derivative free algorithm, CMA-ES is well suited for optimization problems of high dimensionality and non-linear parameter topology. In this study we used CMA-ES to identify

- the number of diagonals,  $N$
- the volume ratio of non-diagonal to diagonal members,  $\lambda = V_{nd}/V_d$ . Note that, since for a lattice with  $N$  diagonal members

$$V_{nd} = 8T_{nd}LH, \quad (39)$$

$$V_d = 4\sqrt{2}NT_dLH, \quad (40)$$

for a given  $\lambda$   $T_{nd}$  and  $T_d$  are given by

$$T_{nd} = \frac{1}{2} \frac{\lambda}{1 + \lambda} (0.2L + 0.1\sqrt{2}L), \quad (41)$$

$$T_d = \frac{1}{\sqrt{2}} \frac{1}{N(1 + \lambda)} (0.2L + 0.1\sqrt{2}L), \quad (42)$$

where we have enforced [Eq. \(1\)](#) and [Eq. \(9\)](#).

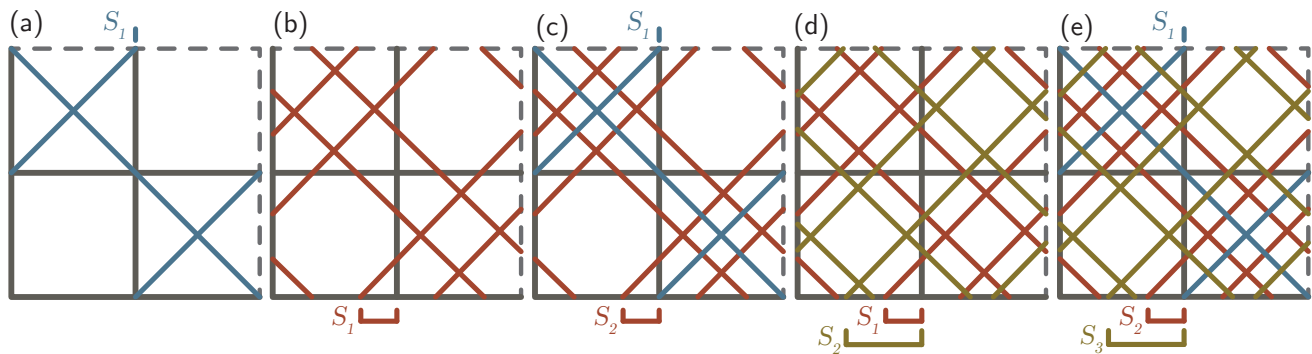
- the separation between each even set of diagonals,  $S_i$  for  $i \in [1, 7]$  ([Supplementary Fig. 25](#))

resulting in a lattice structure with the largest critical load. For such an optimization problem, the number of optimization variables increased with the number of diagonals incorporated in the model (i.e. the total number of parameters are  $1 + \frac{1}{2}(N - (N \bmod 2))$  for a given optimization instance with  $N$  number of diagonals). In all of the runs we assumed that all diagonals are oriented at  $45^\circ$  with respect to the non-diagonal members and that  $V_d$  and  $V_{nd}$  were distributed equally among the diagonal and non-diagonal elements, respectively. Furthermore, to ensure the symmetry, we assumed that  $S_{2i-1} = S_{2i}$  ( $i = 1, 2, \dots, N/2$ ) if  $N$  is an even number and  $S_1 = 0$  and  $S_{2i-1} = S_{2i}$  ( $i = 2, 3, \dots, (N - 1)/2$ ) for odd values of  $N$  ([Supplementary Fig. 25](#)).

The algorithm's initial values were chosen to be in the center of the design space, namely,  $\lambda = 1$  and diagonal separation for the even set of diagonals  $S_i = 0.5L$ . The covariance matrix was initialized uniformly with a standard deviation half of the domain space, which was normalized and constrained to remain between 0 and 1. The optimization was evaluated in a uniaxial loading condition aligned parallel to the vertical elements with a population size of 30.

For the optimization results presented in the Main Text, we sought to maximize the critical buckling load of a finite size structure using a single objective target function. The resultant parameter values from the optimization can be found in [Supplementary Tab. 2](#) and a convergence analysis for the case of  $N = 2$  can be found in [Supplementary Fig. 26](#). Note

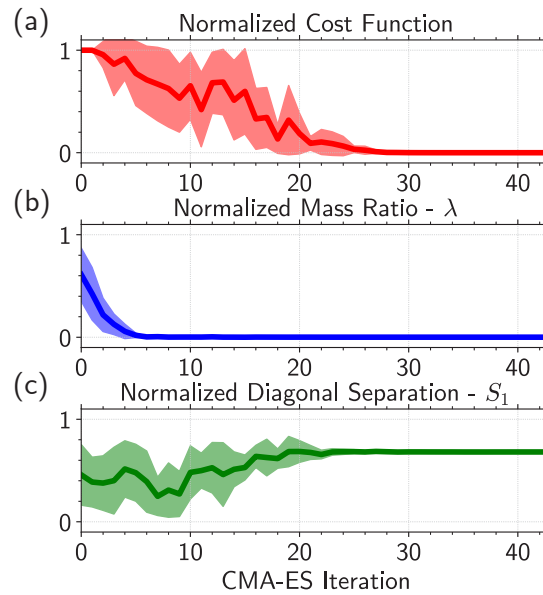
that we also performed the same optimization analysis on an infinite periodic structure and the obtained results are shown in [Supplementary Fig. 27](#), and [Supplementary Tab. 3](#).



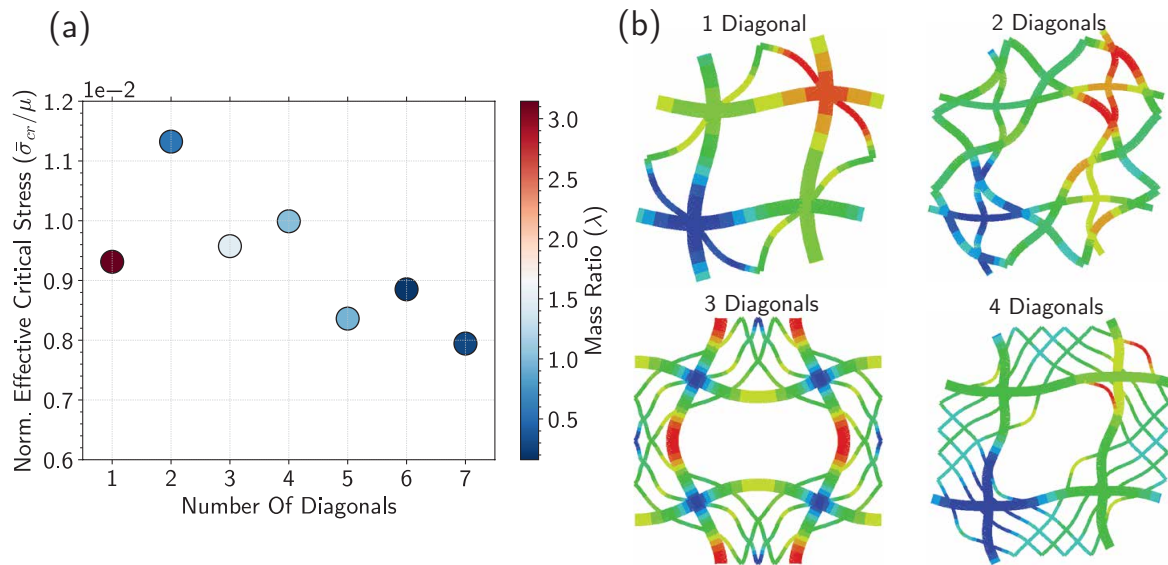
**Supplementary Figure 25: Schematic.** Schematics highlighting the geometric parameters considered in our optimization analysis.

	$\lambda$	$S_1$	$S_2$	$S_3$	$S_4$
$N = 1$	3.1890	0			
$N = 2$	0.6778	0.1800			
$N = 3$	0.8028	0	0.3044		
$N = 4$	0.7640	0.1912	0.3720		
$N = 5$	0.3874	0	0.3881	0.7811	
$N = 6$	0.5036	0.1910	0.5189	0.8712	
$N = 7$	0.3561	0	0.2899	0.5512	0.8779

**Supplementary Table 2: Optimal  $3 \times 3$  finite-sized structures.** Geometric parameters defining the  $3 \times 3$  structures with highest critical stress identified by CMA-ES for different numbers of diagonals. In each row we report the optimal parameter identified for a given number of diagonals  $N$ . For odd  $N$ ,  $S_1$  is constrained to 0, meaning it is not allowed to move from the non-diagonal elements junction. As the number of diagonals is increased  $\lambda$  decreases, indicating that the algorithm allocates more mass to the diagonal elements.



**Supplementary Figure 26: Evolution of the objective function and design parameters during CMA-ES iterations.** This figure shows the evolution of (a) the cost function, (b) the normalized mass ratio  $\lambda$ , and (c) the normalized diagonal separation  $S_1$  over the course of each iteration of the optimization analysis for a lattice with  $N = 2$ . The solid line represents the mean value for the evolutionary optimization iteration (with population size  $n = 30$  samples per iteration) and the shaded bounds represent the standard deviation from the mean. In this figure, it is apparent that the optimal value for  $\lambda$  is quickly identified by the algorithm.



**Supplementary Figure 27: Optimization analysis for infinite periodic structures.** (a) Optimal value of critical buckling stress for varying number of diagonals. The color of each point represents the optimal mass ratio  $\lambda$ . (b) Optimal deformed geometries for designs including one to four diagonals. The color in each structure represents the magnitude of the displacement.



	$\lambda$	$S_1$	$S_2$	$S_3$	$S_4$
$N = 1$	3.1454	0			
$N = 2$	0.5614	0.3390			
$N = 3$	1.4784	0	0.2440		
$N = 4$	1.0151	0.0989	0.3358		
$N = 5$	0.9509	0	0.1733	0.3260	
$N = 6$	0.2009	0.2628	0.5827	0.8881	
$N = 7$	0.2962	0	0.4197	0.6917	0.9126

**Supplementary Table 3: Optimal structures of infinite extent.** Geometric parameters defining the infinite structures with highest critical stress identified by CMA-ES for different numbers of diagonals. Each column of the table corresponds to the optimal value of a parameter. Each row corresponds a determined  $N$  number of diagonals. For odd  $N$ ,  $S_1$  is constrained to 0, meaning it is not allowed to move from the non-diagonal elements junction.  $\lambda$  on average decreases as a function of  $N$ , which as expected, means the algorithm is allocating more volume to the diagonals as they are being spread too thin. The distribution of  $S$  as a function of  $N$  shows that the algorithm is attempting to evenly distribute the diagonal spacing, such that the length of the vertical elements without diagonal bracing is kept the shortest.

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