

## ARTICLE

# Exploring multistability in prismatic metamaterials through local actuation

Agustin Iniguez-Rabago 0 1, Yun Li 0 1 & Johannes T.B. Overvelde 0 1\*

Metamaterials are antificial materials that derive their unusual properties from their periods architecture. Some metamaterials can deform their internal structure to such the tween different properties. However, the precise control of these deformations remains a challenge, as these structures often exhibit non-linear mechanical behavior. We introduce a compartational and experimental strategy to explore the folding behavior of a range of 30 primaritic building blocks that exhibit controllable multifunctionality. By applying focal actuation patterns, we are able to explore and visualize their complex mechanical behavior. We find a vast and discrete set of mechanically stable configurations, that arise from local minima in their elastic energy. Additionally these building blocks can be assembled into metamaterials that exhibit similar behavior. The mechanical principles on which the multistable behavior is based are scale-independent, making our designs candidates for e.g., reconfigurable acoustic wave suides, microselections mechanical systems and energy storage systems.

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n the search for materials with exotic properties, researchers have recently started to explore the design of their mesoscopic architecture. These so-called metamaterials have properties that arise not only from their chemical composition, but rather from the interplay between stimuli and the material's periodic structure. Examples include auxetic behavior , mechanical cloaking<sup>4</sup> and non-reciprocal response. A challenging problem has been to design multifunctional materials, i.e., truseruly that can vary their properties. So far, this has been addressed by e.g., taking inspiration from origami to create internal structures that can be reconfigured along a few degrees of freedom' Finding the structure of such reconfigurable materials it not trivial since the number of degrees of freedom for a general prigarni design grows exponentially, and typically a general design approach 18 ld needed to satisfy required conditions. Once created these materials exhibit highly anisotropic behavior, enabling the change of their properties by applying locally a range of stimuli including air pressure 12.13, pre-stresses and swelling 11. However, the deformed state of these materials becomes dependent on these stimuli, and once they are removed the material will relax to the initial configuration.

A way to overcome this dependency is to introduce multistability 5-26. This can be achieved by having two or more stable states that differ in configuration and are separated by significant energy barriers. Multistability has already been used to create auxetic221 and energy trapping metamaterials22-24 as well as deployable 20,25, morphing 26 or crawling 27 structures, however, most of these materials are assembled from 2D building blocks that can switch between only two stable states. A natural question to ask is whether 3D building blocks with more than two stable configurations exist and if they can be used to form multi-

functional metamaterials.

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As such, here we study a class of prismatic multistable 3D building blocks, that are based on polyhedra templates. These building blocks have previously been studied from an infinitesimal deformation and rigid origami frameworks; however here we assume that these structures can undergo large rotations and deformations of the faces, making the energy of these structures highly non-linear and thus significantly more difficult to explore. To do so, we introduce a numerical method to search for energy minima that correspond to the stable states of the prismatic structures. While a complete description of all possible deformations and stable states is not possible due to the large number of degrees of freedom arising from the elastic description, our method was designed to closely mimic possible experimental implementations of locally actuated metamaterials previously studied for only one prismatic structure<sup>13</sup>. As a result, we are able to shine light on the highly multistable behavior that most of these building blocks exhibit. We start by introducing the design of the 3D building blocks and a numerical model to simulate their behavior. We next validate our numerical approach with centimeter-scale prototypes. In order to gain insight in the problem, we then visualize the non-linear energy landscape of mu tiple prismatic building blocks by applying local actuation to hinges Based on these results, we develop a method to extract all possible unique actuation putterns, allowing us to efficiently scan through the energy landscape and find additional stable configurations. Finally, we show for a few multistable building blocks that they can be tessellated to create multistable metamaterials

Results

Design. The structures investigated here are constructed based on templates of space-filling tessellations of polyhedra B Each polyhedron in the tessellation is used as a basis for a thin-walled building block, that is constructed by extrading the edges of the

polyhedron in the direction normal to the corresponding face (Fig. 1). When assuming rigid origami<sup>28</sup> (i.e., the structure can only fold along predefined hinges), some of the building blocks cannot change shape (Fig. 1a, b), while others can be reconfigured along specific degrees of freedom (Fig. 1c). Interestingly, for all of these examples we found additional stable configurations that are evatisally admissible, but that cannot be reached without temporarily deforming the rigid faces (Fig. 1). Under the assumption of rigid origami, these states correspond to minima in elastic energy that are separated by infinite high barriers, i.e., they are topologically isolated 10. By allowing the faces to stretch or bend (i.e., clastic origami) 17, we lower the energy barrier such that moving between local minima becomes kinetically admissible Note that under the assumption of elastic origami the structure has many degrees of freedom, however, some deformations require significantly less energy than others corresponding to the degrees of freedom obtained when assuming rigid origami. We refer to these deformations as soft modes instead of degrees of freedom. While for some simple origami patterns the energy of the system can be computed analytically 13, 16,31, already a generic degree-four vertex pattern) becomes nearly impossible to deci pher?". The 3D prismatic structures considered in this study are constructed from non-flat degree-six, degree-eight, and degreeten vertices, and therefore an efficient numerical technique is needed to explore the energy landscape and discover new stable

To model the thin-walled prismatic structures, as shown in Fig. 1, we define the elastic energy of the prismatic structures using linear springs similar to previous work\*6.1732 (Methods). Each hinge is modeled as a torsional spring with stiffness  $k_0$ , in which contact is taken into account by constraining the angle between  $-\pi \le \theta \le \pi$ . We account for in-plane stretching of the faces by applying springs with stiffness k, along the edges and the diagonals 12. Bending of the faces is prevented using a set of constraints (Methods). As such, the relation between face deformation and hinge bending is specified by the ratio  $\kappa = k_h/k_s$ . Note that when simulating origami, deformation of the faces is typically modeled using bending instead of stretching16. However, to reduce the computational requirement, the observed deformation in our prototypes can be approximated using only in-plane

stretching that is the result of the stretchability and flexibility of the

Fig. 1 Prismatic structures and some of their stable states. The prismatic structures can be designed by extruding the edges of a convex polyhedron perpendicular to the faces. The multistable examples shown here are based on a a truncated tetrahedron, b a truncated cube and c a cuboctahedron The additional stable states can only be reached by going over a finite energy barrier resulting from deformation of the faces of the structure. The prototypes have square faces of 24 mm made from cardboard (0,4 mm thick) and connected through hinges made from double-sided save<sup>4</sup>.

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Fig. 2 Comparison of multistable behavior between experimental and numerical compression texts, a Average force-displacement response extends by average force-displacement response extends by average force-displacement response extends by a confidence of the confi

hinges as observed in experiments<sup>20</sup>. Additionally, this simplifies the problem by reducing the number of parameters in the simulations (i.e., bending stiffness of the faces is not considered).

Compression experiments. V \*\*\*-def unity the numerical model with compression experiments. We performed experiment and a primatic structure based peak cabocalactions, as the shape of two of the stable states (Fig. (Bpl.)) is compressible with the compression expelled along a specific axis (Supplementary Morrie 1). Note that the structure cability is a specific axis (Supplementary Morrie 1). Note that these of the contract of the state of the s

The results show an initial increase in force (F) due to the elastic deformation of the structure. At u/umax = 0.6 the response reaches a plateau, after which instabilities of the structure start to appear indicated by sudden drops in the reaction force. Importantly, the force reaches negative values after the instability at  $u/u_{max} \approx 0.75$ , implying that the structure has passed an energy barrier reaching a different stable state. When slowly releasing the compression, the structure follows a different path as can be seen from the hysteresis. Simulations of the same loading conditions using our numerical model are shown in Fig. 2b (Methods). While some differences exist between simulations and experiments, the similarity is striking. Both the experimental and numerical response are characterized by the same instabilities and deformation sequences (see insets in Fig. 2). Moreover, additional simulations (Supplementary Fig. 1) reveal that the observed response is mainly due to stretching of the faces and not bending of the hinges, since the stiffness ratio x can be increased by at least one order of magnitude (from  $\kappa = 10^{-4}$  to  $\kappa = 10^{-3}$ ) without seeing any major effect on the response. These experiments show that the simulations can qualitatively predict the behavior of the structure. Therefore, our numerical

models can be used to find stable states for the prismatic

Applying local actuation. To gain insight into the non-linear behavior of these structures when applying local actuation, we next visualize a 2D projection of the energy landscape that can be obtained by actuating hinge-pairs. The actuation is achieved in our simulations by applying torques to the specific hinges, forcing them towards a target angle. Figure 3a shows the energy of a prismatic structure based on a triangular prism, where we first deform the structure by actuating hinge b to  $\theta_b$ , after which we actuate hinge a to  $\theta$ . The energy is normalized by the maximum folding of the hinges and stretching of the faces (Methods). Interestingly, for  $\theta_s + \theta_s < \pi$  deformation is dominated by folding of the hinges, indicating that the structure is rigidly foldable (i.e., deforms along one of the two soft modes). However, for  $\theta_s$  +  $\theta_{\rm c} > \pi$  the faces of the structure start to deform, leading to a dramatic increase in the elastic energy. For larger deformations the projection of the elastic energy becomes discontinuous. indicated by sudden drops, such that the structure undergoes instabilities during loading.

After deforming the structure, we release both torques and the structure relate to a local energy minimum (Sopplementary Moora, It if the configuration sther relaxation is different than the structure relate to the struct

Similarly, we can apply this analysis to different primateir structures, for example one based on a trutacular tetrahedron (Fig. X.-d.). This structure does not enhibit any identification install configuration, as expected from the timal experiments install configuration, as expected from the timal experiments several stable states. Already when sixtuating one hisper-pair, the submissions reset a highly complet energy landscape with pathways that lead to 16 stable states. Some of these are related by authors we create a clustering method based on the values of symmetries we create a clustering method based on the values of stable states (Methods). Following this method, we only obtain

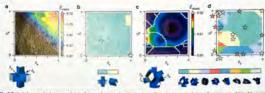


Fig. 3 Projected energy landscapes and state diagrams for two prismatic structures. These landscapes and states diagrams were obtained by running multiple simulations with different loads applied to two hinges. The studied prismatic structures are based on a a triangular prism and c a truncated tetrahedron. Here, we fold the structures in two steps: first we fold flinge 6, after which we fold hinge 8, while keeping 8, fixed. We record the elastic energy of the final state, and repeat this process for all possible combination of angles. The results are then presented as a 20 projection of the energy landscape. The corresponding state diagrams are shown in & and di which are obtained by relaxing the prismatic structure from the folded configurations. The star symbols indicate the values of the angles &, and &, in the final configuration.

eight unique stable states. It is interesting to note that  $(\theta_a, \theta_b) =$ (0, n) (Fig. 3d) describes three different stable configurations. This is a clear indication that we are looking at a 2D projection of a higher dimensional energy landscape. Furthermore, by changing the order of loading (Supplementary Fig. 3), the final deformed shape of the structures varies, indicating pathdependent behavior. Finally, by analyzing all other hinge-pairs (Supplementary Fig. 3), we found a total of 12 unique stable states.

Reducing the search space. Selecting hinge-pairs to scan through the energy landscape is a successful method to find energy minima, however precise control of actuation applied to multiple hinger is difficult to achieve in experiments 12. Therefore, we need a more realistic approach to search for additional states that can be achieved in experiments. To do so, we limit the actuation to either off ( $\theta = 0$ ) or on ( $\theta = \pi$ ). This enables us to explore a larger range of hinge combinations to which local actuation is applied, and broadens our search for other stable configurations. However, before doing so, we first describe a method to reduce the search space in order to significantly reduce the computational needs.

We start by deriving the number of hinge combinations that can be actuated. For these combinations we consider all hinges of the structure, because by definition deformation of the structure requires energy (e.g., actuation) regardless whether the structure exhibits soft modes or not. Each prismatic structure is composed of two hinge types: internal and external. The internal hinge correspond to the edges of the polyhedron that is used as a template, while the external hinges arise from the extrusion process. For example prismatic structure based on a tetrahedron has  $n_{out}$  8 unternal hinges and  $n_{out} = 2n_{out} = 12$  external hinges. If we select one of these hinges for actuation, there are a total of  $\eta_1 = n_{tot} + n_{ext} = n_{tot} = 18$  different possibilities. When selecting two hinges, there are a total of  $\eta_2 =$  $n_{\rm int} 1/(2!(n_{\rm int}-2)!) = 153$  combinations that we can make In general, we can write for a selection of a actuated hinges  $\eta_s = (n_{\rm tot})!/(s!(n_{\rm tot} - s)!)$ , leading to a total number of actuation combinations equal to  $\eta_{\rm tot}=2^{n_{\rm tot}}$ . These combinations grow exponentially with the number of edges of the prematic structure (Supplementary Fig. 4). This makes it nearly impossible to run all different actuations for prismutic structures based on larger polyhedra, such as a cuboctahedron ( $n_{int} = 24$ ) that has more than 1021 combinations.

By focusing only on the internal hinges of the prismatic structures  $(n_{int})$ , we reduce the number of combinations  $\eta_{int}$  to 224. Note that e.g., for a cuboctahedron template this is approximately a reduction of 14 orders of magnitude (Supplementary Fig. 4). However, we still need to reduce y further to be able to efficiently scan the energy landscape. We therefore exploit the symmetries of the prismatic structures to remove the combinations of hinges that can be rotated or mirrored leading to exactly the same actuation patterns. To find symmetric' actuation patterns, we first convert the polyhedron into a directed graph, mapping all the internal hinges to nodes on the graph: Depending on the two faces of the original polyhedron that are connected by the hinge, we give each corresponding node in the graph a specific type. For example, a hexagonal prism has the types triangle-square and square-square, while a tetrahedron only has the type triangle-triangle. We then construct the graph by connecting a directed line between two nodes if both hinges share one vertex and the internal polyhedron can rotate clockwise to the normal of the face that both hinges share. Next, we determine the minimum distance matrix between nodes33, in which we keep track of the node type encountered when traveling along the shortest path. We extract all principal sub-matrices from the distance matrix and compare their eigenvalues and vectors to identify and remove hymmetric loading cases (Methods). Using this method we can further reduce the number of hinge combinations (n\_\_\_) by approximately two orders of magnitude

#### (Supplementary Fig. 4). hexagon

Applying the actuation patterns to find stable states. We next use these unique hinge combinations to apply discrete (i.e. on/ off) actuation to the prismatic structures in order to find their stable states. As before, for each load case we first apply a torque to the corresponding hinges, after which we release the torque and let the structure relax to equilibrium. We then follow a clustering method to find the unique stable states (Methods). Additionally, we characterize the stability of these unique stable states by stepwise increasing the stiffness of the hinges by changing x in our numerical model, pushing the structure back to its original undeformed state. We record the last value (Kneet) for which the prismatic structure remains in the stable configuration.





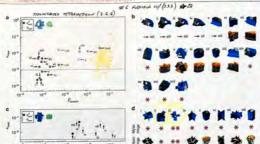


Fig. 4. Compution of stable states found with our manifold algorithm and experimental verification. The normalized interin energy (E<sub>max</sub>) and maximum affilmes a found. You found with multiplines for the insign statells states of a phrantice structure state of a phrantice structure are stated in a "function state and invalidation for the insign states found or phrantice structure states of a phrantice structure and invalidation of the states of the structures based on a function of the state of the states of the structures based on a function of the state of the states of the structures based on a function of the state of the states of the structures based on a structure state of the state of the structure based on a structure state of the state of the state of the structure based on a structure of the state of the

In Fig. 4a we show the results for the prismatic geometry based on a truncated tetrahedron, in which we plot the maximum value of the hinge stiffness, xmax, against the normalized stretch energy.  $\hat{E}_{annula}$ , for all the stable states that we found. While we previously found 12 stable states for this structure when actuating only hinge-pairs (Fig. 3c, d), by running all the unique hinge combinations ( $\eta_{com}$ ) we find a total of 213 stable states (where we already removed the duplicate and symmetric stable states). To verify these results, we performed experiments on a prototype made with the same fabrication method discussed previously (Fig. 4b). We tried to obtain the 17 states that can be reached by actuating up to 3 hinges simultaneously ( $\eta_{nem}^3$ ). While seven states can be found directly, we observe two important differences between simulations and experiments. First, the stable states (i-v) characterized by  $\kappa_{max} < 10^{-3}$  cannot maintain their stable configuration after releasing the actuation, and instead relax to states vii and xi (Supplementary Movie 3). We deduce from this observation that the value of  $\kappa$  in our experiments is equal to  $\kappa \approx 10^{-3}$  (dotted line in Fig. 4a). Second, the stable states viii and xiv-xvii cannot be reached in experiments due to a limitation of the maximum stretch that the hinges of the prototypes can undergo. This difference is expected, as these constraints have not been taken into account in the simulations to maximize the search space.

To highlight the influence of the maximum stretch that we observe in experiments, we also performed experiments on a primartic geometry based on a cube. While we find a total of eight stable states in our simulations (Fig. 4c.), we were not able to reach any of these configurations with the current fishication method.

However, replacing the Myles hinges with strenchable elastomers, hinges (0.5 mm almon rabber) enabled us to overcome higher sprinds energy harriers, such that we were able to find six of the stands are sent organizations. Note that we were allot not offer stands are sent organizations. The stretch to obtain state it is all larger than the capabilities of our prototype, while state it is larger than the capabilities of our prototype, while state it is till has non-adjacent faces crossing that are not accounted for in our numerical model furthermore, we find that the elastomic hinges result in a lower is in the prototype, such that we were able to achieve state leasts with m<sub>eas</sub> = 0.71

Finally, we applied the same analysis to the other 16 primitary structures based on regular polybedra that either have up to  $m_{\rm m}=80$ , or that can be used to construct uniform space-filling remainization. Note that for polybeds are combinations, and have limited ourselves to continuous combinations, and have limited ourselves to combinations of up to three bings, i.e.,  $m_{\rm pol}$ . Supplementary Fig. 4). The number of stable states from the student structures ranges from 2 to 418, as reported in Supplementary Fig. 8. Furthermore, we have some of the pushform as truncated cube and a frombiculo-ctahedron in Supplementary Fig. 8.

Multistable metamaterials. We have shown that by local actuation we are able to effectively explore the non-linear energy landscape of prismatic structures and find additional minima. We next show that our method can also be applied to find stable states in prismatic metamaterials assembled from these building blocks, by using periodic boundary conditions (Methods). Note

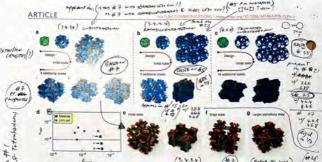


Fig. 5 Simulations and experiments of multitable metamaterials. The invalided measurements are based on cubic trasslations of primatic structures beard on a significant production of the structure of the structure of the unit cell and metamaterial based on a subcontained on. Stand for metamaterial based on a subcontained on. Stand for metamaterial based on a subcontained on Stand for metamaterial based on standard and standard structure based on a subcontained on the subcontained

that provide buredary conditions, introduce additional contraints that consolerably limit be stable states that can be activated that consolerably limit be stable states that can be activated and has a large effect on the non-linear repoons of the material. In fact, many of the asymmetric stable states that we found for the unit cells can so longer be achieved in the materials. Therefore, the challenge here is to design materials that are capable of being mechanically stable in additional states. To perform a first exploration, we focus on cube resultations that can be constructed from a study primate structure. We consider 10 fr the polybeins that were previously found to be maintable, which results in a total of 15 materials Supplementary Fig. 7). In a creationin patterns to the material that proviously resulted in actuation patterns to the material that proviously resulted in stable combiguration for the primate formular controls and the stable configuration for the primate formular controls.

We find that most (11) of the materials above additional stable states (Supplementary Fig. 7). In Fig. 5-x-1 and Supplementary Movie 4 we show three of those multistable materials and some of the missing of the materials of the stable states. Note that the energy of the material is stable states do not have to be equal to the primate building block. This can be seen for example from the stretch energy of the stable state of the unit cell example from the stretch energy of the stable state of the unit cell examples the stable stable stable state of the unit cell examples the stable stable stable state of the unit cell examples the stable stable stable state of the unit cell examples the stable stable stable state of the unit cell examples the stable stable stable stable state of the unit cell examples the stable stable stable stable stable state of the unit cell examples the stable stable

To validate these findings, we fabricated a material assembly haved on a cobordaderion, that contains 2 + 2 v 2 building blocks. As expected, we are only able to achieve one of the stable state (Fig. 5c), since taste it and it like bloom the ears, and 10-3 frenchold as previously predicted. To verify this, we also tablected a second ample with thinker Mysia wheres of 125 jurn, and we found that this metamaterial does not exhibit any stable states (Supplementary Morie S).

While here we have limited our analysis to periodic boundary conditions applied to the unit cells, similar as in rigid origant<sup>1</sup>, sable state can appear on the edges and corners of the materials, sable takes can appear on the edges and corners of the materials, are also able to observe additional table nature with wavelength longer than the unit cells (Fig. 5g). In order to capture these in our model, larger unit cells would have to be considered. Therefore, additional mades have to be performed to continued the experimental control of the control of the control of the control of the relations that can be constructed.

### Discussion

In summary, we have introduced a computational strategy to visualize and efficiently explore the complex energy landscape of 3D prismatic structures. We revealed the vast multistability of these structures, and despite that our numerical approach only explores part of the configuration space, by basing our method on local actuation we were able to find stable states that can be achieved experimentally. Additionally, by tessellating these prismatic structures, we find multistable metamaterials that can reconfigure their architecture and therefore tune their properties. Importantly, these materials do not require energy to maintain their stable configurations, and will be robust to external variations as significant energy barriers have to be overcome to alter their structure. Moreover, by varying the relation between hinge and face stiffness, the stability of states can be tuned20.22.34. We believe that our local actuation strategy can also be applied to other origami-inspired metamaterials

While we have only validated our experiments at the centimeter-scale using relatively simple fabrication techniques, the mechanical behavior of our systems is theoretically scaleindependent. However fabricating useh intricate structures at the microfrano scale is not trivial. More advanced 3D-fabrication techniques such as two-photon lithography<sup>15</sup> or stereolithography 6 could lead this innovation. Additionally, scaling of these structures will introduce environmental influences such as capillary effects. It is not known how such forces influence the (multistable) behavior of our structures, and additional research is required to explore this direction. Moreover, instead of manually deforming the structure, they can be made responsive by applying local actuation to the hinges. For our prototypes, this can be achieved by applying pneumatic pouches to some of the hinges12. As an example, already by discrete actuation of two pouches applied to the prismatic structure based on a truncated tetrahedron, we were able to achieve four of the stable states (Supplementary Movie 6). Similar strategies could be applied to actuate our designs at smaller length scales, using e.g., localized swelling of hydrogels for actuation. However, individually addressable local actuation patterns become difficult to apply at small scales and therefore a particular interesting future direction is the application of global stimuli to trigger the multistable behavior, e.g., heat or pH variations. Global stimuli can potentially lead to different folding behavior for a single structure by incorporating multiple materials into the design that each respond differently to changes in their environment or to different loading rates. Therefore, we believe that these prismatic multistable materials could lead to the next generation of multifunctional metamaterials that can be applied as e.g., reconfigurable acoustic wave guides<sup>37</sup>, microelectronic mechanical systems38 and energy storage devices39

COMMUNICATIONS

## Methods

Minimization of energy. To simulate the folding and deformation behavior of our structures, we implemented a numerical method that minimizes the elastic energy using gradient information. First, we create the prismatic structures by extrading the faces of an internal convex polyhedron<sup>6</sup>. The resulting structure has F rectangular faces, each surrounded by four edges  $(S_g)$  and divided by two diagonals  $(S_0)$  defined by the four vertices (V) of each face. Edges that connect two faces are defined as hinges (H). We describe the complete shape of the prismatic structure by the coordinates of its vertices  $\mathbf{z} = [x_{1,1}, x_{2,1}, x_{3,1}, \lambda_{1,2}, \dots, x_{3,F}].$  In this section, we first derive the elastic energy associated with face stretching and hinge folding, and the work applied to deform the structure. Second, we derive the required face bending, stretch and angle constraints, and the periodic boundary conditions. Third, we discuss how we normalise the energy to allow us to compare between different prismatic structures, and finally we describe the implementation of our

algorithm in Matlab First, two types of elastic energies are assigned to the structure the burge folding energy Room modeled as personal springs placed at the hinges, and the face strends energy F<sub>symb</sub> modeled as green springs placed at the edges and the diagonals of each face. We assume that the structure has zero elastic energy in its unital extruded state with coordinates X, such that the total elastic energy of the structure is given by

$$E_{\rm dum} = E_{\rm they} + E_{\rm point}$$

The gradient of  $E_{\text{nines}}$  with respect to the displacement of the vertices at wx - X is then equal to

$$dE_{\rm dens} = dE_{\rm loop} + dE_{\rm meab} = \frac{dE_{\rm loop}}{\partial a} da + \frac{dE_{\rm max}}{\partial a} da$$
(6 model such bloom as a loop trained cover with an audit  $\theta$  in the coll

We model each hinge as a linear torsional spring with an angle  $\Theta$  in the initial state,  $\theta$  in the deformed state and stiffness  $k_n$ . The hinge energy  $E_{\rm input}$  is defined as  $\hat{E}_{homs}(\theta) = \sum_{i=1}^{N} \hat{\lambda}_{h}(\theta_{i} - \Theta_{i})^{i} = \frac{1}{2} \hat{\lambda}_{h}(\theta - \Theta) \cdot (\theta - \Theta).$ 

$$\hat{E}_{\text{tamp}}(\theta) = \sum_{i=1}^{n} \frac{1}{2} \hat{b}_{i} (\theta_{i} - \Theta_{i})^{i} + \frac{1}{2} \hat{b}_{i} (\theta - \Theta) \cdot (\theta - \Theta),$$
 (3)  
Let  $\theta = [0, 0, ..., \theta_{i-1}]$  and  $\Theta = [0, 0, ..., \theta_{i-1}]$  for hings angle can be

where  $\theta = [\theta_1, \theta_2, \dots, \theta_M]$  and  $\Theta = [\Theta_1, \Theta_2, \dots, \Theta_M]$ . Each hange angle can be found from the coordinates of the vertices according to

$$\theta = \tan^{-1}\left(\frac{a_{s} \cdot (B_{s} \circ a_{s})}{a_{s} \cdot a_{s}}\right)$$

in which is, and is, are the normal vectors of the two faces connected by the hings. and the vector a, lies along the hinge axis (Supplementary Fig. 8a). Note that we use the function  $\tan^{-1}$  (instead of e.g., using  $\theta = \cos^{-1}(n_s - n_s)$ ) since its domain is defined for  $(-\infty,\infty)$  and the angle can be defined between  $[-\pi,\pi]$  using a Four quadrant inverse tangent. Partial derivatives of the hinge angles with respect to

vertex displacement case then he found according to

 $\frac{\partial \mathcal{E}_{large}}{\partial u} = \frac{\partial \mathcal{E}_{large}}{\partial (\theta - \Theta)} \frac{\partial (\theta - \Theta)}{\partial u} = \delta_{\lambda}(\theta - \Theta)J_{large}$ in which I<sub>toops</sub> is a Jacobian matrix with entries

Inspirences - de

$$h_{\text{ingris}(0,0)} = 0.00$$
  $dx_{j,r}$ .

2.3 and  $r = 1$ .... (V. For a more detailed explanation in

for  $i=1,\ldots,H,j=1,2,3$  and  $v=1,\ldots,V$  . For a more detailed explanation and

description of the Jacobian see ref. \* Strending of each face is modeled using linear springs placed along the edgeand diagonals. While Filipov et al. 10 derived specific expressions for the stiffness of each spring, given the constraints on our-of-plane bending of the face we simplify out model and assume that all springs have stiffness k. As a result, the ratio between hinge bending and face stretching is set by a single parameter  $\kappa = k_h/k_c$ 

between large persons are law manufactured as the strong term of the first stretching energy 
$$E_{metab}$$
 can be found according to 
$$E_{metab} = \sum_{i=1}^{k-1} \frac{1}{2} k_i ((i-L_i)^2 = \frac{1}{2} k_i (i-L) \cdot (i-L),$$

in which  $L_i$  and  $l_i$  correspond to the initial and deformed length of the i-th edge respectively,  $L = [L_1, L_2, \dots, L_{k_i + k_i}]$  and  $l = [l_i, l_i, \dots, l_{k_i + k_i}]$ . Furthermore, the change in length of each edge can be found from the displacement of the two

respectively, 
$$L = [L_1, L_2, \dots, L_{k_1+k_2}]$$
 and  $1 = [l_1, l_2, \dots, l_{k_1+k_2}]$ . Furthermose change in length of each edge can be found from the displacement of the toperusponding vertex displacements (Supplementary Fig. 3b)

 $l-L = \sqrt{\sum_{i=1}^{3} (u_{i,k} - u_{i,k})^2}$ 

The partial derivative of the face stretching energy then equals 
$$\frac{\partial E_{\rm match}}{\partial u} = \frac{\partial E_{\rm match}}{\partial (l-L)} \frac{\partial (l-L)}{\partial u} = \xi_1(l-L)J_{\rm shock},$$

where J<sub>ment</sub> is a Jacobian with cettries

$$I_{\text{mend}(3) \leftarrow i, |\alpha|} = \frac{\lambda_i^i}{2\epsilon_i}$$
 (10)

in which

for  $i=1,\dots,S_0+S_{0r}$ , j=1,2,3 and  $v=1,\dots,V$ . In order to deform the structure, we specify a target angle for A hanges, and apply a penalty method to increase the energy by  $E_{\rm inst}$ , seen as work energy, in case the target angles are not satisfied. The total energy of the system E that includes both the elastic deformation and the loads is then equal to

$$E = E_{tange} + E_{tanah} + E_{tanah}$$
 (1)

$$E_{\rm land} = \sum_{i=1}^{d} k_{\rm p} (\theta_i - \dot{\theta}_i)^2. \tag{13}$$

 $k_a$  arm the stiffness of the applied penalty and  $\theta_b$  is the target angle of the i-th hange to which a load has been applied. Note that for  $k_a \gg k_b$  we are practically constraining the angles to the target angles of the leaded hinges, while for smaller values of k, the target angles might not be reached.

Second, while with the derivation of  $E_{\rm same}$ , we have specified the energy landscape of our primatic structures, certain deformations are not admissible. We resurt five different constraints that we implemented to limit the deformation Specifically we discuss how to: fix vertices to remove rigid body translations and rotation, prevent face bending, limit the hinge angle to implement contact, limit the edge stretching to prevent numerical convergence problems, and simulate infinite periodic tilings of the primutic structures using periodic boundary condition To prevent neid body reanslations we relect one vertex from the first face of the matic structure X, and fix the displacement to  $u_1 = \{0,0,0\}$ . Moreover, to award rigid body rotations we fix two other vertices on the same face X2 and X5

$$u_i \cdot (\mathbf{X}_i - \hat{\mathbf{X}}_i) * (\mathbf{X}_i - \mathbf{X}_i) = 0.$$
 (1)

$$u_j \cdot (X_j - X_j) \times (X_j - X_j) = 0,$$
 (14)

$$\mathbf{u}_{j}\cdot (\mathbf{X}_{j}-\mathbf{X}_{i})=0 \tag{6}$$

To ensure that no face bending can occur, we impose that the out-of-plane. displacement of each vertex on a face remains zero  $(z_i = 0 \text{ for } i = 1, 2, ..., V_j)$ , in which V, is the total number of vertices of the f-th face). To determine the out-ofplace deformation we use two vectors w, and w, on a face to get its normal and project the remaining edge vectors (w, for  $i=3,...,V_j-1$ ) owns the face. For each face, we then have (Supplementary Fig. 8c)

$$z_1 = \mathbf{w}_1 \cdot (\mathbf{w}_1 \times \mathbf{w}_2) = 0.$$
 (14)

for  $i = 3, ..., V_j - 1$ . If we write  $s = [z_1, z_2, ..., z_{N_p}]$ , in which  $Y_0 = \sum_j (Y_j - 3)$ , the partial derivative of the face bending constraints with respect to the vertex displacement

3 optimization steps.

(19)

(20)

$$C_{\text{South},Ni-i,rel} = \frac{\partial z_i}{\partial x_i}$$

for  $i = 1, ..., V_p, j = 1, 2, 3$  and v = 1, ..., V

We need to limit rotation of the hange union each hange contracts to each faces which some into contact when \$ = - n is, is injuriently a listly closed hinge Because we use a four-quadrate investor ranging on Japaneses the ought of the hinges between two adjacent facts (2 ) 110. The stight con early between  $-a \le \theta \le a$ . However, when the pro-face, user and other, the improved well have a real value that lies outside the runter of the surveys taxon of To around this problem, we ensure that the faces never cross by applying a cigins constraint to the hinge angles

where the limits have been determined by running several simulations. Note that the gradient for this constraint is given by Eq. (4).

We also implemented two other precautionary measurements to avoid adjacent face crossing. First, we keep track of the angles of pervious stemation step such that a sudden change in angle larger than # indicates the crossing of the two faces. If this occurs, depending on the sign of the step, we add or subtract 2st to have the real value outside the range  $-\pi \le \theta \le \pi$ . Second, we are limiting the step size of the minimization function so that the difference in angles between steps cannot become greater than n if no adjacent face cressing occurs

While stretching is permitted in both simulations and experiments, our simulations shows convergence problems when higher stretches occur. For example, when the flat face becomes concave, the normal of the initially rectangul face becomes III-defined. This could occur when the maximum strain of an edges of the faces become larger than 0.17. Nevertheless, we found this constraint too tight as it was prohibiting large deformations on the structure and the search for stable states. Therefore, we loosen this constraint in our simulations to a maximum strain of edges according to

$$-0.30 \le \frac{l_i - l_i}{l} \le 0.30$$
.

where I, and I, are the deformed and original length of an edge or diagonal respectively. For all simulations, this value did not produce ill-defined normals. The gradient for this communit is given by the normalized Jacobian of Eq. (10), and equals

for  $i = 1, \dots, S_k + S_k$  and  $j = 1, \dots, V$ 

To create metamaterials represented by infinite large tessellations of the primate structures, we apply periodic boundary conditions along the lattice vectors  $A_i$  for  $i = 1, \dots, n_{dis}$ . Depending on the number of lattice vectors  $\{a_{dis} \in [1, 2, 5]\}$ , they can upon the material in one, two or three dimensions. For the undeformed structure, two vertices are periodically located when

$$X_k-X_k=\sum_{i=1}^{N_{\rm tot}}\alpha_iA_i.$$

where  $X_a$  and  $X_b$  are the initial positions of the vertices, and  $a_i \in [-1,0,1]$ expensents the possible linear combination of the lattice vectors for tiling the unit cell to space. Then, periodic boundary conditions can be applied to these periodically located vertes pairs according to

$$\dot{u}_{b}-\dot{u}_{a}=\sum^{c_{bb}}c_{c}\dot{a}_{c}.$$

in which a, represents the deformation of the lattice vector. Third, to compare the results between primaric structures based on differe polyhedra, we normalize the elastic energy. The elastic energy of any structure is given by Eq. (1). Note that the constraints Eq. (18) and Eq. (19) limit the deformation of the hinge angles ft and the edge length f, and therefore we can define a total maximum energy when all the angles and edge lengths are at their maximum, respectively  $\theta_{i}^{mn}$  and  $\theta_{i}^{mn}$ . The maximum large energy is then equal to

$$\Sigma_{\text{loop}}^{\text{max}}(\theta) = \sum_{i=1}^{N} \frac{1}{2} k_i (\theta_i^{\text{max}} - \Theta_i)^2 = \frac{1}{2} k_i (\theta_i^{\text{max}} - \Theta) \cdot (\theta_i^{\text{max}} - \Theta)$$
 (23)

Similarly, the miximum energy us a result of in-plane face deformation equals

$$E_{mask}^{mas} = \sum_{i=1}^{k-k_0} \frac{1}{2} k_i (\xi^{mas} - k_i)^2 = \frac{1}{2} k_i (\xi^{mas} - k) \cdot (\xi^{mas} - k).$$
 (24)  
We then define the total normalized elastic energy  $\hat{E}_{demas}$  according to

We then define the total normalized elastic energy 
$$E_{those}$$
 according 
$$E_{those} = \frac{E_{those}}{E_{those}^{those}} = \frac{E_{those}}{E_{those}^{those} + E_{those}^{those}}.$$

and the individual components of the elastic energy are given by

$$=\frac{E_{cont}}{E^{max}}$$
. (27)

(26)

Last, we implement the absenuentioned set of equations in MATLAR, and use the helid in non-linear constrained optimization function called 'fmincon', to minimize the elastic energy (Eq. (11)) given a set of linear (Eqs. (13), (14), (15) and (22)) and non-linear (Eqs. (16), (18) and (19)) constraints. Specifically, we choose the 'Active-set' algorithm for the simulations of the energy landscape (Fig. 2. Supplementary Fig. 2 and Supplementary Fig. 3) and the compression test simulation (Fig. 3 and Supplementary Fig. 1) since a maximum step size can be defined that makes the tracking of all the hinge angles more reliable. The other simulations are performed using the 'SQP' (Sequential Quadratic Programming) algorithm. In this algorithm the step size is not limited and therefore converges faster to the energy manimum. Note that for this algorithm we fold the structures in

Compression test. To verify the numerical model we performed an experimental compression test on a prismatic structure based on a cubocrahodron. Here, we describe the simulation of the compression test that we used as a comparison. In our simulations, we use a stiffness ratio of  $\kappa=10^{-4}$ . We select two opposite faces on the structure, and apply constraints to the vertices that manic the clamping in experiments. To do so, we only allow deformation of the vertices along the compression usis. We then create two additional edges (5 parallel to the loading axis, and use them to connect both clamped faces. We use these adject to compress the structure by stepwise reducing their length and penalizing the energy according

$$\mathcal{L}_{int} = \sum_{j=1}^{n} \frac{1}{2} k_{p} (l_{i} - l_{i})^{2},$$
 (28)

where  $\hat{s}_{\alpha}$  is the stiffness of the edges used to compressed the structure. We assign a suffices that is much larger than the edge stretching stiffness and the hings stiffness  $(k_{\mu} \gg k_{\mu}, k_{\mu})$ , so that effectively we are performing a displacement controlled

In the simulation, we compress the structure in 1000 steps (a\_\_\_\_), after which we stepwise remove the loading in the same number of steps. For each increment we allow the structure to relax with the specified constraints, while using previously ntioned optimization tool with the "Active-set algorithm.

To obtain the reaction force, F, during loading, we take the derivative of the elastic energy with respect to the displacement along the loading sais (r-axis), and

$$F = \frac{dE}{dz} = \sum_{i} \frac{E_{i+1} - E_i}{E_{i+1} - E_i}$$
 (29)

where we iterate through all the steps of the simulation to obtain the numerical gradient. Furthermore, we normalize the force by the weighted average of the stiffnen defined by

$$\dot{k} = \frac{k_a(S_T + S_D) + k_BH}{S_L + S_D + H}$$
, (30)

where S., S., and H are the total number of edges, disgonals and hinges, respectively.

Hinge selection reduction. The primaric structures studied here are highly symmetric, resulting from the underlying uniform polyhedra used as templates Therefore, we developed a method to exploit these symmetries in order to reduce the search space to find stable states. Note that to determine unique selections of actuated hinges we consider only the edges of the internal polyhedron. In this section we will start from the polyhedron, and create a directed graph that represents the edges and their connectivity. Next, we determine the minimum distance metrix from the graph, from which we extract all principal sub-matrices that represent the hinge selections. In the remaining part of this section we explain our method in more detail, and as an example, apply it to a prismatic structure based on a triangular prises.

First, to determine symmetric hinge selections for the actuation of the prismatic success, we start by constructing a graph of the internal polyhedron. Supplementary Fig. 9a shows an example of the graph belonging to a triangular prism, in which we have mapped the edges of the polyhedron to nodes in the graph. We then designate a type to each node in the graph, depending on the faces

of the polyhodron that are connected to the corresponding edge, e.g., for a mangular prism there are two types: (a) triangle-square (depoted in red) and (b) aguare-aquare (denoted in purple).

We create directed connections between nodes in the graph. For this, we sider all the faces of the polyhedron, and define an outward-pointing normal such that we can follow edges of each face using the right-fitted rule. For each pair of consecutive edges a connection is extensible between nodes in the graph, where the direction points from the first to the second node. For example, as Supplementary Fig. 9a, the edges numbered 8, 1,7, and 4 forms a four and are connectine according 90 the described method, therefore directional connections from  $\theta = 1, 1, \dots, 7$ .

7 — 4 and 4 — 8 are cremed.
Section4, once the graph is creased, we compare the sharmed discussed distance between the models. We use this distance to compare all the roofs selections, respectively of their original flucions on the primaria: formations: Primarian and expenditure of their original flucions on the primaria; formation of their compared to the compared of their compared or compared to the promotion of the promotion primaria. It is compared to the promotion primaria or compared to the promotion primaria.

path in the minth, which is typically done in graph theory, we have an every of the noder types passed along that path (Regispensules  $p^2$   $p_0$ , k). It is not not of-differentiate between equal length paths, we using a numerical value to each non-depending on the types of nodes and select the smallest number for consistency. For example, for a tringular priors the function enumerator the jaths between node 1 and 3. A few of the recoaling nearly see  $p_0 = p_0 = p_0 = p_0$ . If  $p_0 = p_0 = p_0$ .

node j and j. A few of the possible paths set  $1 - 7^{j} - 3$ ,  $1 - 2^{j} - 3$  and j an

Late, from the shortest datance matrix we can compute the unique hinge selections after assigning values to the paths, by considering the eigenvalues of all the principal sub-matrices. We trart by considering actuating one bings, and short finding all unique hinge selections, increase the number of actuated hinges by one

until the total number of hinges has been reached.

Since the distance between a tools and miff is green by just the one by repoted them one of an hyper just one of a transagen just when a book just 2 will have been seen as the properties a selection of one made. We go through at the mode expansing the previous selection of one made. We go through at the mentioning models exceeding the proposed and benefition. These sub-manifest contains the selection of the properties of the mention of the mention of the selection. Of the selection of their segmentation are extended to the laws different approximate and morne deplaces. Of selection of the selection of the selection of the selection of the selection (Supplementary Fig. 62). Seen that we only send to consider large electronic filection of the selection patch of a selection of the selection of the highest and vice wreat). For example, no shower light touch for a transgular prompt or severest the sense of the selection gained 2 and 1-424 with the law of the reservetion of the selection gained 2 and 1-424 with the law of the reserve-

Solds states cheering, in our is often the solds can take are using an above and the company of the company of the company of the first insert of the first insert of the first insert of the first insert of the company of the compan

#### Data availability

The data that support the findings of this mody are available from the corresponding unther upon resecutive request.

#### Code availability

All computer algorithms necessary in reproduce the figures are available from the corresponding author upon resonable request.

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## References

Bernidi, K., Vitelli, V., Christensen, I. & Van Hecke, M. Fleighte mechanical metamaterials. Nat. Rev. Mater. 2, 1-11 (2017). Yessells, H. & Yang, J. Remtrant origami-based metamaterials with negative Possion I ands and Seability. Phys. Rev. Lett. 114, 185502 (2005). Overwide, J. T. B., Shan, S. & Berndid, K. Gemperation through buckling in 2D periodic, soft and person structures: Effect of pore shape. Adv. Mater. 24, 2337–2342 (2012).

Bickmann, T., Kalic, M., Schimay, R. & Wegener, M. Mechanical closk design by direct lartice rearellownation. Proc. Natl. Acad. Sci. 112, 4930–4934 (2015). Crollini, C., Soutus, D. & Abb, A. Static non-reciprocity in mechanical metamaterials. Nature 542, 461–464 (2017).

 Overvelde, J. T., Weaver, J. C., Hoberman, C. & Bertoldi, K. Rational design of reconfigurable prismatic architected materials. Nature 341, 347–352 (2017).
 Söverberg, J. L. et al. Using origansi design principles to fold reprogrammable.

mechanical metamaterials. Science 345, 647-650 (2014). 8. Florijn, B., Ciodaia, C. & Van Hecke, M. Programmable mechanical metamaterials. Phys. Rev. Lett. 113, 175003 (2014).

 Chen, B. G.-g. & Santangelo, C. D. Branches of triangulated origans sear the unfolded state. Phys. Rev. X 8, 011034 (2018).
 Finson, M. B. et al. Self-folding origans at any energy scale. Nat. Commun. 8, 13477 (2017).

 Tachi, T. and Hull, T. C. In Volume Sh: 40th Mechanisms and Robotic Conference, vol. 9, VISSTWARDS. (American Society of Mechanical

Engineeri, vo. 7, vicinityono, (Allerical Scorty of Micratical Engineeri, 2016).

12. Overvide, J. T. et al. A three-dimensional actuated originis-inspired transformable metamaterial with multiple degrees of feedows. Nat. Communication and Commun

 Joy29 (2016).
 Yang, D. et al. Phase-transforming and switchable metamaterials. Extrem Mech. Lett. 6, 1–9 (2016).

 Kang, S. H. et al. Bushing-induced reversible symmetry breaking and amplification of claratity using supported cellular structures. Adv. Mater. 23, 3306–3385 (2013).
 Fang, H., Wang, K. W. & LL. S. Asymmetric energy barrier and mechanical

 Fang, H., Wang, K. W. & Li. S. Asymmetric energy barries and mechanical diode effect from folding multi-make excited-origans. Extrem. Mark. Lett. 17, 7-15 (2017).
 Mann, R. W. Land, L. M. Lann, P. L. Mandalo, S. P. & Housell, L. L.

 Hanns, R. H., Lund, J. M., Lang, R. J., Magleby, S. P. & Howell, L. L. Waterbomb base: a symmetric single-veries hazable origans rocchamiten. Smart Mater. Struct. 23, 094009 (2014).

 Shvetberg, J. L. et al. Original structures with a critical transition to bintability uniting from hidden degrees of freedom. Nat. Matter. 14, 389–393 (2015).
 Lechennali, F. & Addis Bella, M. Generic bintability in created central surfaces. Phys. Rev. Lett. 115, 235501 (2015).

 Warnshams, S., Mennet, R., Chen, R. G. G. & Van Hecke, M. Origami audistrability: from single vertices to menubests. Phys. Rev. Lett. 114, 055803 (2015).

 Faber, I. A., Arriera, A. F. & Studier, A. R. Bioinspired spring origansi. Science 359, 1386-1391 (2018).
 Zafanquni, A. & Fanni, D. Biotable agrees: mechanical metamaterials impired

by ancient geometric motifs. Extrem. Mech. Lett. 9, 291-296 (2016).
 Shin, S. et al. Multitable architected materials for trapping elastic strain energy. Adv. Mater. 27, 4396-4301 (2015).
 Haghwand, B. et al. Multitable share-reconfigurable architected materials.

Hagiptani, E. et al. Soutistore stage-recompanion arctimetes normals.
 Afr. Mater. 28, 7913–7920 (2004).
 M. S. Fang, H. & Wang, K. W. Recoverable and programmable collapse from fidding pressured original collapse shifts. Phys. Rev. Lett. 117, 114001 (2004).

 Sains, K., Tsukalkora, A. & Olaho, Y., New deployable structures based on an charic originat model. J. Merk. Des. 187(teh), 021402 (2015).
 Daynes, S., Trask, R. S. & Wyserer, F. M. Bio-impried intrustrial biotability imploying discrements original for morphing applications. Smart Mater. Series 2, 8, 12001 (2016).

 Pagano, A. et al. In ASME Conference on Smart Materials, Adaptive Structures and Intelligent Systems, V002T06A005, (ASME, 2016).
 Gerabauera, B. Uniform Sillings of Evapous, Commissioneri 4, 49-56 (1994).

Tach, T. Smrátnion of rigid origami. Originni 4, 175-187 (2009).
 Liu, B. et al. Topological kinematics of origami metanisterials. Nat. Phys. 14, 811 (2018).
 Brunck, V., Lechensult, F., Ried, A. & Adda-Bedia, M. Elastic theory of

 Brunck, V., LeCtroman, F., Steil, A. & Acknowled, M. Caster, onescy of origami-based measurements for Phys. Rev. B 98, 033002 (2016)
 Filipov, E. T., Tachi, T. & Paulino, G. H. Origanii tubes assembled into stiff.

Jupper, E. L., Jacks, J. O. Calando, G. Y. Organia may see enconfigurable emocraters and metameterals. Proc. Natl Acad. Sci. USA. 112, 12321–12336 (2015)
 Even, S.Graph Algorithms. 2nd odn (Combridge University Press, 2011)

 Shang, X., Liu, L., Rafamjani, A. & Pasini, D. Domble bitable assertio made of rigid solids. J. Mater. Res. 23, 300–308 (2018).
 Vrankhild, A. et al. Nat. Commun. 9, 993 (2018).

 Vystakith, A. et al. Nat. Commun. 9, 593 (2018).
 Ling, C., Gernischi, A., Güchrist, M. D. & Cardiff, P. Mechanical behaviour of additively-manufactured polymeric order muss lattice structures under quan-

additively-enamification polymeric octor-mais lattice structures under quantitatic and dynamic compressive loading, Mater. Do. 162, 106–118 (2019).
37. Yu, X. Fang, H., Cui, F., Gheng, I. B. Lu, Z. Origansi-inspired felddale sound barrier designs. J. Sound Vil. 442, 514–526 (2019).

- Rogers, J., Huang, Y., Schmidt, O. G. & Gracias, D. H. Origami MEMS and NEMS. MRS Bull. 41, 123–129 (2016).
- Xu, C., Gallant, B. M., Wunderlich, P. U., Lohmann, T. & Greer, J. R. Threedimensional Au microlattices as positive electrodes for Li-O<sub>2</sub> batteries. ACS Nano 9, 5876–5883 (2015).
- 40. Müllner, D. Modern hierarchical, agglomerative clustering algorithms. *Mathematics, Computer Science* (2011).

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## **Author contributions**

A.I. and J.T.B.O. designed research; A.I., Y.L., and J.T.B.O. performed research; A.I. and J.T.B.O. analyzed data; and A.I. and J.T.B.O. wrote the paper.

# **Competing interests**

The authors declare no conflict of interest.

# **Additional information**

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Correspondence and requests for materials should be addressed to J.T.B.O.

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