



Biom mineralized tissue formation as an archetype of ideal grain growth

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Grain size distribution is a fundamental property of polycrystalline materials and the phenomenon of grain boundary motion has major repercussions for materials processing and in a variety of technological applications. In classical models for microstructural evolution during grain boundary motion, special attention is given to the case of “ideal” grain growth defined by the seemingly unrealistic assumption of homogeneity of the physical properties of the boundaries. Whereas different models were rarely shown to demonstrate ideal microstructural evolution of selected synthetic and geological granular networks, here we present a biogenic polycrystalline material the formation of which is consistently described by all principal predictions of an ideal grain growth behaviour. We show that biomineralization of the prismatic architecture in the shell of the mollusc *Atrina vexillum* is fully quantified by conventional thermodynamic, kinetic and topological considerations, thus making a material formed by a living organism archetypical of ideal grain growth.

Introduction

The properties of grain networks comprising the microstructure of many polycrystalline materials systems, such as metals, alloys, ceramics and bionic composite structures have a significant impact on their physical performance.^{1,2} In particular, the size and shape of the grains and the properties of the boundaries that separate them are linked to numerous materials characteristics, such as mechanical behaviour and electromagnetic performance. In fact, this structure–property relationship in a polycrystalline matter is one of the most fundamental concepts in materials science. Moreover, the grain boundaries are considered to be two-dimensional defects characterized by a certain free energy. The latter introduces a driving force to the system aimed at reducing the total amount of these defects, namely, the grain boundary area. Thermal fluctuations in the

Conceptual insights

We present an intricate 3D biomineralized architecture the formation of which is fully predicted by key thermodynamic, kinetic and topological models that were classically developed to describe an analytically ideal behavior during grain growth of man-made and geological materials. Whereas ideal grain growth was rarely shown to occur even in generic materials systems using some of the theoretical models, the morphogenesis of the prismatic assembly in the mollusc shell of *Atrina vexillum* is the first material that adheres perfectly to all, both qualitatively and quantitatively. Surprisingly, the polycrystalline assembly, that evaded physicists and materials scientists since the early 1950s, is found to be formed by a living organism.

atomic lattice due to elevated temperatures lead to a reduction of free energy by boundary motion and consequently, by coarsening of the grain network. This process is called grain boundary migration, in the case of individual grain boundaries, and grain growth, in the case of polycrystalline microstructures,^{3–6} and it is one of the most important processes in materials science.

Since the early 1950s, many attempts have been made to understand and to predict polycrystalline microstructure evolution during grain growth and coarsening analytically. From a general point of view, this process is rather simple. A polycrystalline microstructure consists of many monocrystalline grains, where the grain boundaries between two neighbouring crystals are usually slightly curved. This curvature is the result of the system striving to achieve an angle of 120 degrees between the three arms at a triple junctions, where three grains meet, necessary to maintain an energetic equilibrium.^{7,8} This configuration results in a curvature-driven boundary motion during which the free energy is reduced by a motion of the boundaries to the centre of their curvature. Since small grains with less than the average amount of edges tend to have convex boundaries, they shrink, whereas large grains with more than the average amount of edges tend to increase their size. As a result, the number of grains decreases and the total grain boundary area and the coupled free energy decreases, while the average grain size increases. Of course, such a transformation

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during production and application can be both wanted or unwanted, but in any case leads to a change of the properties of the material.

A special situation that has been drawing a majority of research efforts is the case of curvature-driven ideal grain growth, where it is assumed—mostly for reasons of simplification—that all grain boundaries in a polycrystalline network are characterized by the same physical properties.⁷ Specifically, by the same value of surface tension, γ , as well as by the same boundary mobility, m . Hence, any possible dependence of the boundary properties m and γ on misorientation between the associated neighbouring crystals is neglected in agreement with the uniform boundary model.⁵ As a result, over the years, many analytical laws have been derived to describe ideal grain

growth of polycrystalline materials in two and three dimensions. Whereas large experimental evidence exists showing that different analytical theories are successful in describing microstructural evolution of a variety of structures, so far not a single materials system has been shown to obey all predictions of ideal grain growth qualitatively nor quantitatively.

In this work, we present the first microstructure whose morphogenesis consistently fulfils a number of classical thermodynamic and kinetic relationships for ideal grain growth, both qualitatively and quantitatively. Interestingly, the different theories are shown here to converge and describe a biogenic mineralized material formed by a living organism. Namely, the growth of the prismatic architecture in the shell of the bivalve *Atrina vexillum* (Fig. 1). Similar to other bivalves, which are

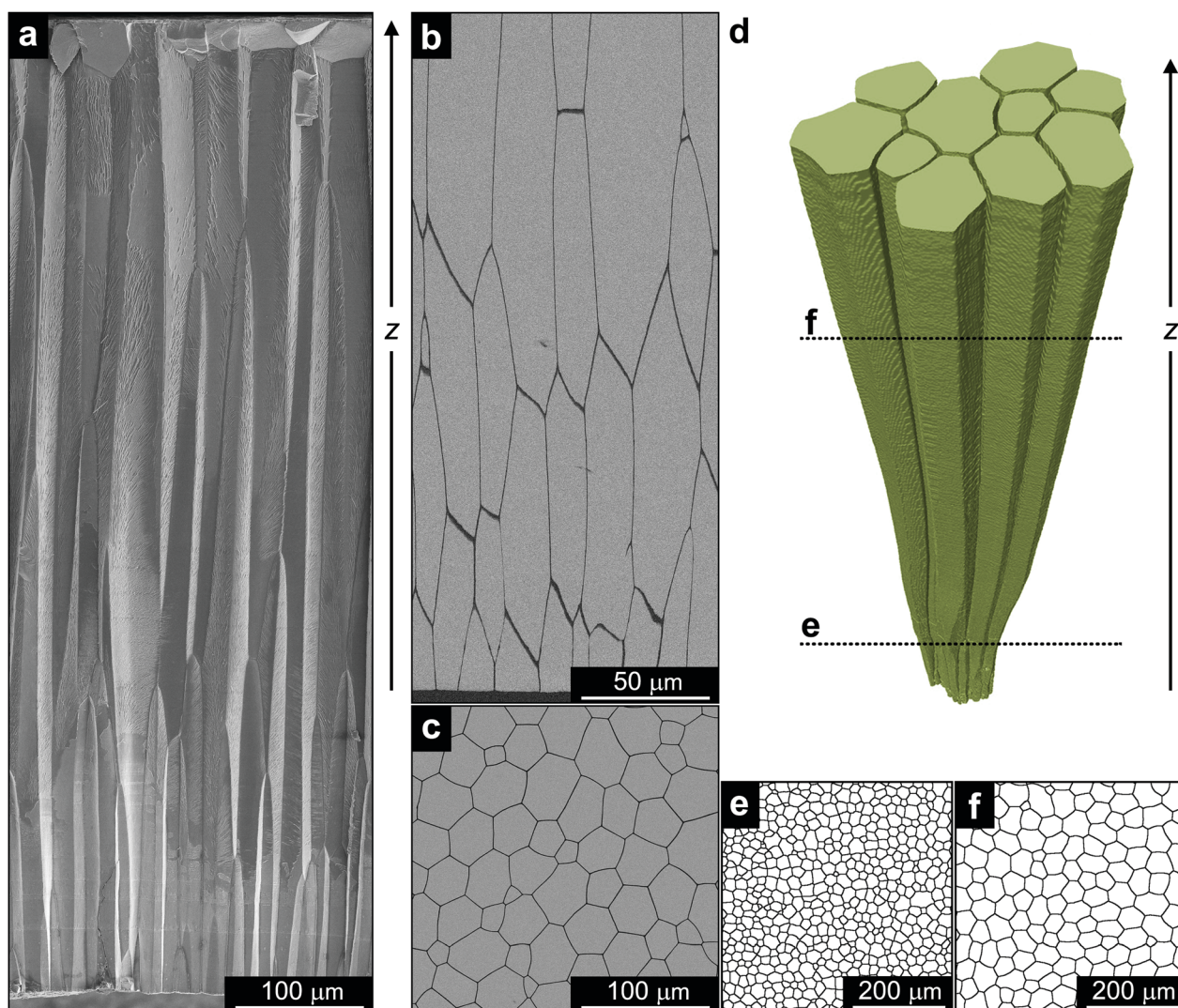


Fig. 1 Structural properties of the prismatic layer. (a) Scanning electron microscopy image of a fractured surface of the prismatic layer in *A. vexillum* obtained by secondary electrons. The growth of the layer starts on the bottom of the image and proceeds upwards. The growth direction is indicated by z . (b) and (c) Scanning electron microscopy images of the polished prismatic assembly obtained in parallel and perpendicular to the growth direction, respectively. The images were obtained using back-scattered electrons. The image in (b) corresponds to the initial stage of growth – bottom part of (a). (d) Representative 3D segment of the prismatic layer reconstructed from the microtomography data. The growth of the layer starts at the bottom of the image and proceeds upwards. (e) and (f) 2D binarized microtomography sections of the prismatic layer, taken perpendicular to the direction of growth, one during the initial stages of layer formation and one at a later stage, respectively, as indicated in (d). The size of the sections is $500 \times 500 \mu\text{m}$.



molluscs that have a shell made of two hinged valves that enclose the soft body of the animal, the shell of *A. vexillum* consists of two mineralized assemblies, which are arranged in layers parallel to the outer surface of the shell. One layer is called the prismatic ultrastructure composed of elongated columns made of calcite (Fig. 1a), and the other layer is a nacreous ultrastructure composed of flat platelets made of aragonite. Earlier studies were successful in demonstrating that physical models have the capacity to describe the morphogenesis of the prismatic architecture in a variety of bivalves^{9–11} and ideal behaviour in *A. vexillum* was recently suggested.¹² However, ideal growth that perfectly adheres to all principal theoretical predictions has not yet been shown.

Results and discussion

Structural analysis of the prismatic layer in the shell of *Atrina vexillum*

The morphology and the growth process of the calcitic prismatic architecture in *A. vexillum*¹³ is reminiscent of columnar architectures formed by various vapour deposition techniques.^{14,15} It consists of elongated calcitic columns joined together by an organic interprismatic phase (dark boundaries in Fig. 1b). It is deposited by cellular tissue on the external organic membrane covering the entire shell (periostracum) and grows unidirectionally towards the inner part of the animal with the long axis of the columns being parallel to the direction of growth, *z*. In a transverse cross-section, the prismatic layer exhibits a honeycomb-like morphology characteristic of a polycrystalline material (Fig. 1c). Whereas in classic materials the grain boundaries are described by a crystallographic misorientation between two neighbouring grains, in the case of the prismatic ultrastructure the boundaries are the mineral–organic interfaces. However, in both cases, the driving force for grain growth is the reduction in the amount of boundary area. Indeed, such a coarsening of the prismatic ultrastructure with the direction of growth has already been shown in a variety of bivalve shells.^{9–11}

To obtain a complete history of microstructural evolution of the prismatic layer in *A. vexillum*, we performed a microtomography experiment at beamline ID19 of the European Synchrotron Radiation Facility (ESRF). The organic interfaces, having the thickness of approximately 1 μm, were easily resolved using an effective voxel size of 0.649 μm. The measurement covered a total thickness of approximately 1 mm from the main body of the prismatic layer. A representative 3D segment reconstructed from these data clearly shows the coarsening behaviour of the prismatic ultrastructure along the direction of growth, *z* (Fig. 1d). In addition, when comparing 2D slices, taken from the microtomography data perpendicular to the direction of growth, one during the initial stage of the prismatic layer formation (closer to the periostracum) (Fig. 1e) and one at a later stage (Fig. 1f), the reduction of the amount of the boundary and the number of prisms is evident. To follow this behaviour as a function of the growth direction quantitatively, similar 2D sections throughout the entire thickness of the prismatic layer were analysed. It is important to note that in this

study, the time parameter, *t*, that is commonly used to follow the coarsening process, was substituted with the direction of growth, *z*. Here we assume a linear correlation between the two and, essentially, reduce the three-dimensional growth in space into a two-dimensional temporal process.^{9–11}

Average growth law

In the early 1950s, Burke and Turnbull¹⁶ established one of the first physically inspired models for grain growth that describes the change of the average grain radius, $\langle R \rangle$, as a function of annealing time, *t*, such that $\langle R \rangle^{1/n} \propto t$. Ever since, it has been shown that this correlation works for different materials, such as zone-refined tin with a growth exponent of $n = 0.5$ ¹⁷ or polycrystalline ice with growth exponents of $n = 0.25$ and $n = 0.30$.¹⁸ In particular, an exponent $n = 0.5$ represents ideal grain growth.

Assuming that the migration of the boundaries within a grain network is driven by transport of matter under pressure because of curved interfaces between the grains, the direction of migration of a boundary is always directed towards the centre of its curvature. This leads to a reduction of the total inner interface area of the microstructure and, therefore, of the total interface energy. The associated velocity of a segment of any grain boundary is given by $v = m\gamma\kappa$, thus, introducing the curvature κ . The velocity is always directed to the centre of curvature. In ideal growth, assuming that all boundaries are characterized by a unique value of surface tension, γ , and mobility, *m*, and that a grain can be described in average by a spherical shape, the curvature relates directly to a corresponding average radius, $\langle R \rangle$, calculated as a grain-volume-equivalent sphere resulting in $\kappa \propto \langle R \rangle^{-1}$.

Recently, the subsequent relation for the change of the average grain size with annealing time, *t*, was derived with the same result but using a completely different ansatz.¹⁹

$$\frac{d\langle R \rangle}{dt} = \frac{m\gamma}{\Gamma\langle R \rangle}, \quad (1)$$

where Γ is a growth constant. Integration of eqn (1) yields the growth law for the average grain radius that is well-known in classical materials science:

$$\langle R \rangle(t) = \left(\frac{2m\gamma}{\Gamma}t + \langle R \rangle_0^{1/n} \right)^n. \quad (2)$$

$\langle R \rangle$ increases with annealing time, *t*, starting at an initial value of $\langle R \rangle_0$. For ideal grain growth, the growth exponent in eqn (2), *n*, should be 0.5. Furthermore, it has been shown that while the growth constant Γ may take values between 3 and 8 for different types of grain growth kinetics, ideal two-dimensional grain growth can be characterized by $\Gamma = 6.8639$.²⁰

In the prismatic ultrastructure of *A. vexillum*, the average grain size indeed follows the well-known growth law, eqn (2), in terms of $\langle R \rangle = \langle R \rangle(z)$ (Fig. 2a) and the growth exponent is $n = 0.4976 \pm 0.0027$. Here, the calculations were performed every 20 sections, corresponding to a step size of 12.98 μm and the area of each section is 973.5 μm × 973.5 μm (1500 pixels × 1500 pixels). The radii were calculated as prism-area-equivalent circles using $R = \sqrt{(A/\pi)}$, where *A* is the measured prism area. The growth factor is $b = 2m\gamma/\Gamma = 0.2369 \pm 0.0011$ μm, from



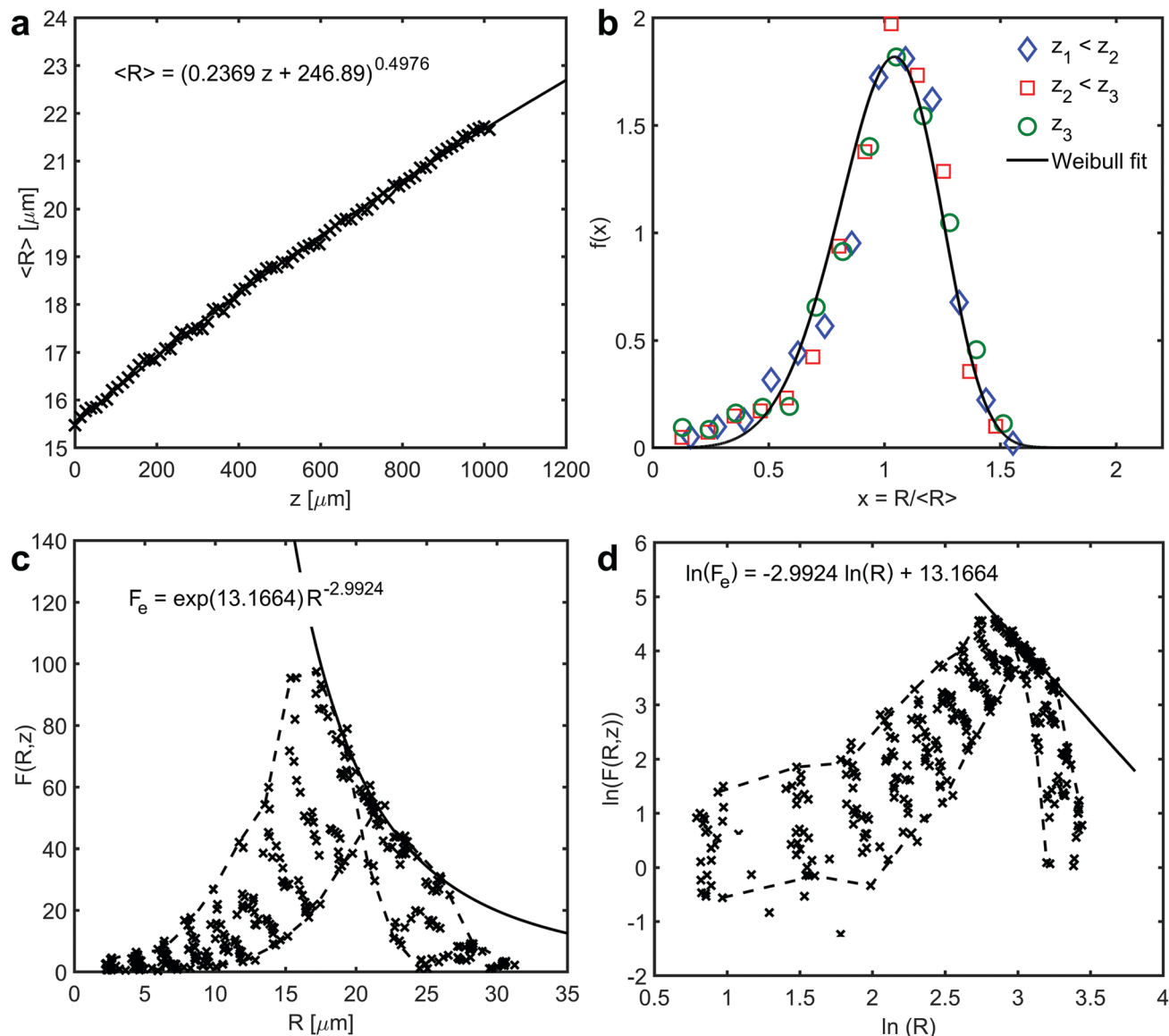


Fig. 2 Average growth law and self-similarity. (a) The relationship between average prism radii, $\langle R \rangle$, and the growth direction, z . The curve represents a fit to eqn (2) – average growth law (the regression coefficient R^2 is 0.9985). (b) Scaled prism size distributions showing self-similarity at three different sections, $z_1 < z_2 < z_3$, along the growth direction of the prismatic layer. The curve represents a fit to Weibull distribution function (the regression coefficient R^2 is 0.9345). (c) and (d) Prism size distribution and a corresponding natural double logarithmic plot of different sections along the growth direction, respectively. Solid curves represent a fit to the envelope of the numerical data (the regression coefficient R^2 is 0.8822). Dashed curves outline the first and the last data set along the direction of growth. The data have been put into 13 bins.

which the reduced mobility, $m\gamma$, can be calculated under the assumption that the growth constant is the same as in the above mentioned case for ideal grain growth with $\Gamma = 6.8639$ resulting in $m\gamma = 0.8130 \pm 0.0038 \mu\text{m}$.

Self-similar size distributions

Curvature driven ideal grain growth follows not only a growth law in terms of eqn (2), but the underlying coarsening process is in a quasi-stationary state that demonstrates statistical self-similarity.^{21,22} This means that the grain size distribution function, $F(R, t)$, can be written in a scaling form:

$$F(R, t) = g(t)f(x). \quad (3)$$

The time-dependent function that follows from volume conservation yields $g(t) = N/\langle R \rangle \propto \langle R \rangle^{-(d+1)}$,²³ where the dimension of the structure is $d \in \{2, 3\}$ and $N = N(t)$ is the number of grains, which decreases with time. In contrast, the function $f(x)$ is time-independent function that scales the grain radii of all the grains in the microstructure by the average radius such that $x = R/\langle R \rangle$ and $\int f(x)dx = 1$.

Time-independence of $f(x)$ and therefore, self-similarity of the prismatic ultrastructure in *A. vexillum* is shown in Fig. 2b. Identical scaled size distributions are obtained at three randomly selected sections along the direction of growth, in $z_1 = 25.96 \mu\text{m}$, $z_2 = 376.42 \mu\text{m}$ and $z_3 = 726.88 \mu\text{m}$. The evolution of the



distribution function $F(R,z)$ is presented in Fig. 2c and also in Fig. 2d in a double-logarithmic plot showing the changes of the distribution with the direction of growth every 60 sections (corresponding to a step size of 38.94 μm). In both figures, the data points of the first and the last size distribution are connected by dashed lines. The linear least squares fit in Fig. 2d represents an envelope to the numerical data.²⁴ In Fig. 2c, this unique curve, $F_e(R)$, touches every single size distribution in exactly one point. It is very interesting to note that theoretically the envelope $F_e(R)$ is proportional to $R^{-(d+1)}$. In the present case, the exponent is -2.9924 ± 0.0838 , which represents a two-dimensional microstructure ($d = 2$). Moreover, the Weibull distribution function, which was previously proposed to describe two-dimensional grain growth, perfectly describes the scaled size distribution (Fig. 2b).²⁵ Although the Weibull distribution is not physically motivated, it fits the numerical data of 2D grain growth.^{20,25}

Aboav–Weaire-law

The self-similar state of ideal grain growth can be described by additional time-independent relationships. The Aboav–Weaire-law, derived in the early 1970s, offers a purely topological correlation between neighbouring crystals showing how grains in a polycrystalline network are arranged in space.^{26–28} It was successfully shown to describe a variety of cellular systems, such as nanocrystalline metals,²⁹ colloidal soap froth structures³⁰ and vegetable tissues.³¹

The law states that the number of edges, n , of a grain is related to the average number of edges of all neighbouring grains, \bar{n} , by the approximation $\bar{n}n = 5n + 8$. Based on Euler's theorem for planar graphs,³² Weaire²⁷ extended this consideration taking the central second moment of the neighbour distribution, $\mu_2 = \langle n^2 \rangle - \langle n \rangle^2$, into account, thus yielding $\bar{n}n = 5n + (6 + \mu_2)$. This extension takes into account that every two-dimensional cellular network can be characterized by its

own distribution of the number of edges. Further studies formed what is known today as the Aboav–Weaire-law:²⁸

$$\bar{n} \cdot n = (\langle n \rangle - \alpha)n + (\langle n \rangle \alpha + \mu_2). \quad (4)$$

Here, α is a geometrical constant close to unity and $\langle n \rangle$ is the average number of edges of the entire microstructure, which is 6 in the case of ideal grain growth. In fact, $\langle n \rangle = 6$ is a direct consequence of a two-dimensional cellular tessellation, which is trivalent, *i.e.*, where the boundaries meet in a triple junction. Such a tessellation is always a planar graph.³² While this is the case for a number of different tessellations, it is also true for ideal grain growth. Of course, in practice slight deviations could be measured due to a limited number of cells taken into account as well as due to the existence of higher order junctions like quadruple junctions.

In the present case, the predicted linear relation between the product of the average number of edges of all neighbouring prisms, \bar{n} , and the number of edges of the corresponding central prism, n , *versus* n is indeed fulfilled in the three different sections (z_1, z_2, z_3) in the prismatic layer (Fig. 3a). A linear least squares fit of the data from the section at z_1 to eqn (4) yields $\alpha = 1.2028 \pm 0.0217$ and $\alpha = 1.2039 \pm 0.0264$ extracted from the first and the second term, respectively. This result is perfectly consistent considering that the two terms were fitted independently. Furthermore, the obtained average number of edges is $\langle n \rangle = 5.9930 \pm 0.0217$, which is again fully consistent with ideal growth.

Lewis-law

The relationship between grain size and grain topology is likewise expected to be time-independent during self-similar grain growth. Such a correlation is known as the Lewis-law:³³

$$\rho = \frac{A}{\langle A \rangle} = \alpha' n + (1 - 6\alpha'), \quad (5)$$

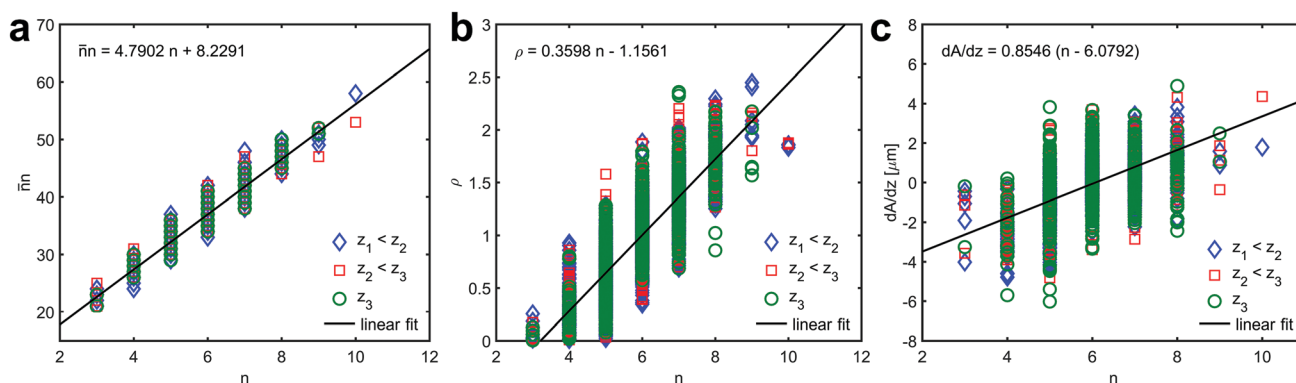


Fig. 3 Aboav–Weaire-law, Lewis-law and von Neumann–Mullins-law. (a) The relationship between the average number of edges in all neighbouring prisms, \bar{n} , the number of edges, n , of the central prism at three different sections, $z_1 < z_2 < z_3$, along the growth direction of the prismatic layer. The curve represents a fit of the data from the section at z_1 to eqn (4) – Aboav–Weaire-law (the regression coefficient R^2 is 0.9210). (b) The relationship between the scaled grain area, $\rho = A/\langle A \rangle$, and the number of edges, n , at three different sections, $z_1 < z_2 < z_3$, along the growth direction of the prismatic layer. The curve represents a fit of the data from the section at z_1 to eqn (5) – Lewis-law (the regression coefficient R^2 is 0.6996). (c) The relationship between prism area change rate and the number of edges, n , at three different sections, $z_1 < z_2 < z_3$, along the growth direction of the prismatic layer. The curve represents a fit of the data from the section at z_1 to eqn (6) – von Neumann–Mullins-law (the regression coefficient R^2 is 0.3832). It is important to note, that the deviation from the predicted behaviour observed for $n = 3, 9$ and 10 is due to the limitation in data size and that the small values of the obtained regression coefficients are the result of naturally occurring vertical data spread.



relating the scaled grain area of all grains, $\rho = A/\langle A \rangle$, to the corresponding number of edges. Here, again, a geometrical factor α' has been introduced. The fulfilment of eqn (5) during the formation of the prismatic ultrastructure is demonstrated in Fig. 3b at the same three sections (z_1, z_2, z_3) that were analysed above. A linear least squares fit of the data from the section at z_1 produces $\alpha' = 0.3598 \pm 0.0051$ and $\alpha' = 0.35935 \pm 0.0052$, extracted from the first and the second term of eqn (5), respectively, showing again a perfect consistency.

von Neumann–Mullins-law

In the same year in which Burke and Turnbull established their grain growth theory, von Neumann derived a fundamental equation for two-dimensional soap froth relating the rate of area change to the number of edges.³⁴ Later Mullins generalized this idea to ideal grain growth in two dimensions³⁵ yielding what is well-known today as the von Neumann–Mullins-law:

$$\frac{dA}{dt} = \frac{\pi}{3} m\gamma (n - 6). \quad (6)$$

This relationship suggests that all grains within a microstructure with more than six edges grow, while grains with fewer than six edges shrink. Only grains with exactly six edges are stable, *i.e.*, they do not change their size. The fulfilment of the von Neumann–Mullins law in the three different sections (z_1, z_2, z_3) is presented in Fig. 3c. Here, dA/dz was calculated as $\Delta A/\Delta z$ with a fixed $\Delta z = 12.98 \mu\text{m}$ and averaged over five succeeding values around the corresponding section to smooth out fluctuations. A least-squares fit of the data from the section at z_1 to eqn (6) is also shown. The resulting critical number of edges is indeed six and the slope of the fit yields a reduced mobility of $m\gamma = 0.8161 \pm 0.0390 \mu\text{m}$. Astonishingly, this is fully consistent with the corresponding value of $m\gamma = 0.8130 \pm 0.0038 \mu\text{m}$ that was obtained from the average growth law using eqn (2).

Conclusions

To conclude, the prismatic ultrastructure in the shell of *A. vexillum* is formed following thermodynamic, kinetic and topological models that were developed to describe the mechanism of ideal grain growth. The different considerations not only perfectly analytically describe the process of biomineralization of this morphology, but also independently yield similar thermodynamic parameters, such as the reduced mobility, $m\gamma$, and critical/average number of edges, $\langle n \rangle$. This consistency was never previously observed even in classical materials systems. This outcome not only provides key insights into biomineral morphogenesis, but is also of fundamental importance to the field of physics of materials. It is surprising that the epitome of a physically “ideal” construct is found in a living organism.

Experimental section

Electron microscopy

Samples of the shell *A. vexillum* from the Caubian deep in the Philippines (purchased from Concology, Inc.) were imaged

using Scios Dual Beam FIB/SEM (FEI). For fracture analysis, a segment of the shell was suspended in liquid nitrogen and then manually broken. For cross-section analysis, the samples were embedded in PMMA and then cut and diamond polished parallel and perpendicular to the direction of growth. The samples were sputtered with palladium before imaging.

Synchrotron-based microtomography

The 3D spatial arrangement of the prismatic architectures was imaged by synchrotron-based microtomography at beamline ID19 of the ESRF in Grenoble (France). A part taken from the main body of the shell was grinded into a 3 mm long cylinder with a diameter of approximately 1 mm. The cylinder was mounted inside the measurement chamber with the long axis of the prisms co-aligned with the rotation axis of the stage, perpendicular to the incident X-ray beam. The samples were scanned using an X-ray photon energy of 34 keV at a sample-detector distance of 91 mm. A total of 5000 radiographic projection images were recorded over 180 degrees with an exposure time of 0.1 s and an effective pixel size of 0.649 μm . ESRF in-house code (PyHST2) was used to reconstruct the data. Prism boundaries were enhanced by means of Paganin-based filtering with a delta/beta ratio of 300.

Image analysis

Two-dimensional microtomography sections were analysed using MatLab. The digital images were converted into binary images using a watershed algorithm separating the grains from the boundary network. The areas of the prisms as well as the number of edges and neighbouring prisms were measured using an in-house MatLab code. The code can be made available upon request.

Conflicts of interest

There are no conflicts to declare.

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