Article

Defining shapes of two-dimensional crystals with undefinable edge energies

Received: 23 February 2022

Accepted: 3 October 2022

Published online: 28 November 2022

Check for updates

Luqing Wang¹, Sharmila N. Shirodkar¹, Zhuhua Zhang ¹ & Boris I. Yakobson ¹²

The equilibrium shape of crystals is a fundamental property of both aesthetic appeal and practical importance: the shape and its facets control the catalytic, light-emitting, sensing, magnetic and plasmonic behaviors. It is also a visible macro-manifestation of the underlying atomic-scale forces and chemical makeup, most conspicuous in two-dimensional (2D) materials of keen current interest. If the crystal surface/edge energy is known for different directions, its shape can be obtained by the geometric Wulff construction, a tenet of crystal physics; however, if symmetry is lacking, the crystal edge energy cannot be defined or calculated and thus its shape becomes elusive, presenting an insurmountable problem for theory. Here we show how one can proceed with auxiliary edge energies towards a constructive prediction, through well-planned computations, of a unique crystal shape. We demonstrate it for challenging materials such as SnSe, which is of C_{2v} symmetry, and even AgNO₂ of C_1 , which has no symmetry at all.

We instantly associate the very word crystal with a shape (and perhaps color, or the lack of it), which has often been perfected through slow geological formation or craftsmanship. Physical systems in equilibrium arrive at a state of minimal energy. Crystals-oblivious to this fundamental principle-achieve their shapes by billions of constituent atoms relentlessly performing a trial and error experiment until they reach the equilibrium shape. For us to predict a crystal shape, such an approach is impossible, and so theories usually reduce the search to the exterior (surface or edge) energy minimization only^{1,2}, whereas the interior-bulk (volume or area) remains invariant. If the exterior energy density, such as the angle-dependent surface energy $\varepsilon(a)$, is given for all direction angles a, this should be sufficient to define the crystal shape, as epitomized by the famed Wulff construction $^{2-5}$ -a geometrical recipe derived from surface energy, in which the answer emerges as an envelope of planes or lines that are distanced by $\varepsilon(a)$ from some point and drawn for all directions a.

One century later, the advent of two-dimensional (2D) materials⁶⁻⁹ made such analysis particularly appealing, helped by a daily growing abundance of shape imagery (it is easier to characterize a 2D rather than a three-dimensional (3D) shape, not to mention improved microscopy). One can learn whether the crystal reached equilibrium

or was shaped kinetically, learn about the edge-structures, and the environment. Furthermore, advances in the first-principles-based computations-notably density functional theory, DFT-nicely complete the Wulff construction by offering $\varepsilon(a)$, at the desired accuracy, to predict a crystal's shape all of the way from its elemental chemical makeup. Such a plan has been successfully realized in numerous cases in which there was a definition for the edge or surface energy. As the primary well-defined quantity is always the total energy E_{t} , one typically resorts to a ribbon (or slab, in 3D) to define the edge energy (per length) as an excess $\varepsilon = (E_t - E_b)/2l$ (where *l* is the lattice constant) over the energy of unbounded bulk material $E_{\rm b}$. This works if the opposite edges are indistinguishable by symmetry, but fails otherwise, yielding a meaningless average ε . In some cases, the approach can be augmented by considering a symmetric polygon or polyhedron with all sides identical, as has been realized for 3D GaAs (ref.¹⁰), more recently for 2D hexagonal boron nitride (hBN) (ref.¹¹) and for metal chalcogenides¹²-a broad family⁶⁻⁸. This method cannot be taken for granted. Many materials lack sufficient symmetry to design a sample with identical edges (or surfaces). Then, the mere definition of surface energy seems to vanish-a disturbing yet simple reality highlighted by Cahn and colleagues^{13,14} as gauge invariance. Their studies show that

¹Department of Materials Science and NanoEngineering, Rice University, Houston, TX, USA. ²Department of Chemistry, Rice University, Houston, TX, USA. Se-mail: biy@rice.edu



Fig. 1 | **The asymmetric 2D crystals. a,b**, The C_1 -symmetry *y*-crystal (**a**) mimics the AgNO₂ monolayer (**b**) with the same lattice constants $l_1 = 3.39, l_2 = 4.93$; angle $\angle \theta = 79.5^{\circ}$ (ref. ¹⁶). Arrows are the normals to eight basic edges (thick solid lines), whereas the red and blue shading indicate two non-equivalent triangles. The left inset in **b** is the side view. **c**, **d**, The C_{2v} -symmetry Y-crystal (**c**) mimics the SnSe monolayer (**d**), with $l_1 = 4.22, l_2 = 4.52; \angle \theta = 90^{\circ}$ (ref. ¹⁸). Thick lines highlight five basic edges, with their normals as arrows. In **d** the small and big atoms distinguish between the top and bottom layers of the SnSe, whereas the right and bottom insets are side views.

certain changes to the angle-dependent surface energy $\varepsilon(a)$ yield an unchanged Wulff shape; hence the latter does not define the surface energy for all directions. A far reaching yet not often appreciated corollary is that the determination of energy for the surface of crystals (of low symmetry) is impossible¹³; the absolute value can never be known in principle¹⁵. The paradox of the Wulff construction is that it states how to obtain the shape from a given edge energy, but the definition of the latter is left out. Cahn and colleagues went further to show that such a definition is indeed fundamentally absent, but did not offer a solution. Yet we know that nature does find the answer, for each crystal–a true shape. This poses a compelling problem: how to find it in theory?

Results

Y- and y-crystals as an abstraction of materials

A fully asymmetric (C_1) gedanken crystal of y vividly illustrates such a challenge (Fig. 1a): no matter how the sample is cut out (ribbon, triangle, circle or any other), it is not surrounded by identical edges. This renders their energies elusive and the equilibrium shape unpredictable by the standard Wulff construction. For a truly 2D planar monoatomic crystal, a necessary and sufficient condition for edge-energy indeterminacy is simply the absence of both inversion C_2 and threefold rotation C_3 . To be clear, we show a fully asymmetric monolayer of silver nitrite^{16,17} (Fig. 1b) and a well-studied 2D SNSe¹⁸⁻²⁴ (Fig. 1c,d)—the latter is of C_{2v} symmetry, which is slightly higher yet insufficient for separating and defining its edge energy. Its sketch-depiction (Y-crystal; Fig. 1c) has an advantage: it is not cluttered with atoms and bonds, and thus

clearly displays the SnSe features, which is essential for the compelling problem of finding the shape.

Here we offer a solution, demonstrating that the shape of even the lowest-symmetry C_1 crystal (that is, no-symmetry) can be obtained through well-planned calculations (possibly from an ab initio or, for that matter, any other atomistic model permitting total energy evaluation). In all cases, the directions can be chosen along the Bravais lattice vectors-supplemented by the diagonals (see Supplementary Section 1)-to serve as basic edges; we can then try to obtain $\varepsilon(a)$ for all directions (basic edges must be reconstructed to the lowest energy for a real material). The total energies of the selected polygons allow one to relate the basic edge energy by linear algebraic equations, which turn out to be underdetermined and require the introduction of arbitrary parameters. Nevertheless, as we see, the shapes obtained in this way remain unchanged (a manifestation of the above-mentioned gauge invariance¹³) by these auxiliary parameters and thus emerge as true equilibrium shapes. We first demonstrate it for C_{2v} symmetry (using SnSe) and then for a general no-symmetry C_1 case (with AgNO₂, for example). We further include the role of chemical potentials for binary and ternary compositions, analyze hBN to test the method and describe the symmetry classification (Supplementary Table 4).

To see how to arrive at this methodology, consider examples of merely heuristic value. Imagine a material with a single easy-cleavage direction, which, in absence of symmetry, would have two different basic edge energies. Its Wulff construction width is fixed by one equation only ($\varepsilon_1 + \varepsilon_{1'} = E_{11'}$, that is, the total edge energy of a strip), and is otherwise unconstrained, free to move in plane, with its position undetermined but its shape obviously unchanged (Fig. 2a). For a material with two inherently easy cuts in non-equivalent directions (Fig. 2b), or with three cuts and opposite edges pairs (Fig. 2c), the indeterminacy is 2 for both. One learns that an indeterminacy of 2 is the maximum (any symmetry axis would supply one equation, reducing the indeterminacy to 1, or to 0 for high symmetries).

Algebraic master system, indeterminacy and closure equations

We begin from C_{2v} symmetry materials such as SnS, GeS, GeSe²⁴ and many others¹⁶, which have only two determinable edge energies. An example of great current interest¹⁹⁻²⁴ is SnSe, whose orthorhombic cell and buckled hexagonal lattice with parallel grooves (Fig. 1d) resemble the familiar phosphorene⁴, but are distinguished by the off-plane tilt of the Sn–Se bonds. Abstracting from the chemical composition, our Y-crystal is isomorphic (Supplementary Section 3) to SnSe, with both having five non-equivalent basic edges marked by their normals (Fig. 1c), with energies ε_1 and ε_1 , ε_2 , ε_3 and ε_3 , (where the prime symbols note the inverse directions so that $\varepsilon_2 = \varepsilon_2$, by symmetry).

Commonly, the basic edge energies are determined (computed) by choosing a sample enclosed by only one edge type: a ribbon for any inversion-symmetric crystal, or an equilateral triangle for a trigonal symmetry such as hBN. This is impossible for the Y-crystal, whose symmetry is insufficient. Apart from ε_2 (for which a ribbon can be constructed; see equation (2)), all other basic edges cannot be singled out by any cutout. Consequently, for five unknowns (basic edge energies), only four independent equations can be set up, using ribbons and triangles (shaded in Fig. 1c) with different edges:

$$\varepsilon_1 + \varepsilon_{1\prime} = E_{11\prime}/l_1,\tag{1}$$

$$\varepsilon_2 = E_{22}/2l_2,\tag{2}$$

$$\varepsilon_3 + \varepsilon_{3\prime} = E_{33\prime}/l_3,\tag{3}$$

$$\varepsilon_1 l_1 + \varepsilon_2 l_2 + \varepsilon_{3'} l_3 = E_{123'}, \tag{4}$$



Fig. 2 | **Wulff constructions for hypothetic materials with one, two or three easy-cleavage (low-energy fracture) directions. a**-**c**, Materials with one, two or three easy-cleavage (low-energy fracture) directions yield a ribbonstrip (**a**), parallelogram (**b**) or a triangle (shaded gray) (**c**), respectively. The arrows—from the center-asterisks to the edges—are the distances equal to the corresponding edge energies ε_1 , ε_1 , and so on, as lableled. The red color in **c** marks the construction obtained when the (undefined, auxiliary) edge energy value ε_1 is arbitrarily increased. See Methods for details.

where the lengths are measured in ångstroms and energies in electron volts; henceforth, we omit these units for brevity (Supplementary Section 4). The right hand side (RHS) values are all well defined, computable total energies of ribbons or triangles (two or three subscripts, respectively) taken relative to the bulk crystal energy, that is, the chemical potential of the Y-component in the 2D-bulk phase ($\mu_{\rm Y}$). In equation (4), the RHS must be evaluated for larger N-cells-wide/tall triangles and then divided by N. Any other polygon is reducible to a combination of the ribbons and triangle already picked (123'), thus yielding no more linearly independent equations (Supplementary Section 2b). For Y-crystal illustration, we arbitrarily pick reasonable values (such as 0.14, 0.10, 0.10 and 1.11) for the RHS of equations (1-4). Having five unknowns but only four equations, this system is underdetermined and thus one cannot obtain the basic edge energies, the $\varepsilon(a)$ or the Wulff construction. We proceed, however, by adding a closure equation, finding the crystal shape and further seeing that the closure equation has no influence on the shape, which therefore is uniquely defined. The closure can be in the form of constraint on any combination of the basic edge energies (for example, $\varepsilon_3 - \varepsilon_3 = \alpha$) for an auxiliary; then, at each α -value, the system (equations (1-4)) is solved for the basic ε_i .

To predict a shape, the choice of basic edges (facets) is always one of the first tasks, and has little to do with the symmetry whether it is high or low. The a priori motivation to choose low-index edges is that, as they are more densely packed, they probably have weak interplane bonding and lower edge energies. Such a choice can be readily augmented by adding any edge, if suggested empirically: it merely increases the rank of equations (1–4), not changing the way in which to overcome the same indeterminacy (Supplementary Section 2c). Furthermore, formally adding *M*-many edges offers a discretization of a continuum $\varepsilon(a)$ function; it costs little in solving *-M* linear equations, but becomes quite taxing in computing numerous RHS values with DFT. Instead, an economical shortcut seems more practical (even though less rigorous) than discretization with large *M*.

To have a full function $\varepsilon(a)$ at arbitrary a, we invoke an ansatz that any slanted, vicinal edge is a sequence of segments projections of the basic edges, and thus its energy is a sum of the basic edge energies, in proper proportions^{25–27}, such as $c_1\varepsilon_1 + c_3\varepsilon_3$ and so on. Simple trigonometry then results in²⁵ the interpolation ansatz: $\varepsilon(a) = \varepsilon |\cos(a + C)|$, with amplitude ε and phase C fully defined by the lattice geometry and the basic edge energies (see Supplementary Section 5). With all of the values of ε_i found above, for any α , the interpolation ansatz gives the complete energy, $\varepsilon^{\alpha}(a)$, and the shape of Y-crystal as the Wulff plot (Fig. 3a). Remarkably, the tangent lines envelope of the Wulff plot merely translates with α or otherwise gives an unchanged (obeying the gauge invariance¹³) well-defined shape. Note that only ε_2 is physically defined and α -independent due to mirror symmetry. All of the other edge energies vary broadly following auxiliary α , having no impact on the shape of the crystal. Regarding the convenient interpolation ansatz, it is reassuring that the minima of piecewise interpolation ansatz function $\varepsilon(a)$ -essential to the Wulff plot-all correspond to the basic edges; any refinements to the remote petals of the $\varepsilon(a)$ in Fig. 3a would not affect the results, that is, the shape that is found is robust to possible interpolation ansatz imprecision. However, for other cases, the number of equations (1-4), their specifics and the closure may vary, they follow the same structure, which can be called the master system (parameters in Supplementary Section 6).

Auxiliaries versus chemical potentials in real materials

Turning to a factual SnSe, one must account for its binary composition. Its five basic edge-directions copy the Y-crystal, but now some edges are non-neutral, with a specific frontier element (such as the zigzag edge of hBN, which can have either boron or nitrogen) accordingly labeled: at 0° (ε_1) the edge is zigzag with selenium ZSe; at 46° (ε_3) the edge is armchair with tin ASn; at 90° (ε_2) the edge is neutral A; at 134° (ε_3) (an inversion of ε_3) the edge is an ASe; and at 180° (ε_1 , an inversion of ε_1) the edge is a ZSn.

The function $\varepsilon(a)$ for SnSe has the same interpolation ansatz form as for the Y-crystal. Its basic edge energies satisfy the master system of equations (1-4). The RHS energies can again be taken relative to the bulk crystal energy $\mu_{SnSe} = \mu_{Se} + \mu_{Sn}$, which is a constant similar to μ_{Y} (at moderate temperatures²⁸). The elemental chemical potentials depend on physical conditions, bringing about a new variable, the imbalance of chemical potential $\mu \equiv 1/2(\mu_{se} - \mu_{sn})$, whose range is limited by the elemental phase's precipitation thermodynamics²⁸ as well as nucleation barriers. Accordingly, for the triangle 123' with extra selenium around the perimeter, we must include $-\mu$ on the RHS of equation (4). For now-specific materials, the RHS values of equations (1-4) are obtained from DFT computations (Supplementary Section 6) of the respective ribbons $E_{11}/l_1 = 0.47\mu + 0.44$, $E_{22}/2l_2 = 0.10$, $E_{33}/l_3 = 0.10$ and the triangle $E_{123'}$ = 1.11 in equation (4). At given conditions (for instance, μ = -0.67) we again complement the algebraic master system with a closure $\varepsilon_3 - \varepsilon_{3'} \equiv \varepsilon_{ASR} - \varepsilon_{ASe} = \alpha$ and compute the shape (Fig. 3a). As we already learned with the Y-crystal, the shape stays well defined at a given μ . To reiterate, although the energy $\varepsilon_2 \equiv \varepsilon_A = 0.10$ is certain, all of the others depend on the auxiliary α , which floats freely with no effect on the observable shape. By contrast, μ can really impact the shape. Tracking this is straightforward: for any value of u, assume an arbitrary α , find the edge energies versus μ (plotted in Fig. 3b) and then the shapes. Not the individual edge energies, but only some combinations are definite, such as $\varepsilon_{ZSe} + \varepsilon_{ZSn}$, $\varepsilon_{ASe} + \varepsilon_{ASn}$ (thick lines), and $l_1\varepsilon_{ZSe} + l_3\varepsilon_{ASe}$ varying with μ at integer slopes. Individual edge energies, however, vary with α , whose choice is arbitrary at each μ , so the functions $\varepsilon(\mu)$ are merely illustrative (thin lines). To emphasize this, Fig. 3c shows how unfixed the edge energies are due to the auxiliary energy α chosen as $\alpha(\mu)l_3 = 0.62\mu + 0.19 \sin 15\mu$, yet the shapes derived from both plots (between Fig. 3b,c) are definite. For $-0.61 < \mu < 0.70$, a rhombus enclosed by ASn and ASe edges agrees with observed synthetic SnSe islands²⁹. As μ increases, the shape becomes a rectangle truncated at two corners, as has also been seen experimentally³⁰ (see the insets to the right of Fig. 3a). Together, such facts (and SnS; Supplementary Section 8) corroborate the auxiliary edge energy approach to predicting the equilibrium shapes of low-symmetry crystals.

Now we turn to the most intriguing—not symmetric at all (C_i) y-crystal (Fig. 1a). The eight basic edges are marked by the normals, with energies ε_i (where i = 1-4, with primes noting the inverse directions), and where general $\varepsilon(a)$ has the same interpolation ansatz form (see Supplementary Table 2). In absence of symmetry, the master system extends relative to equations (1–4). Now for the eight unknowns ε_i there are six relations: four with the RHS energies (E_{ii}) of the ribbons along all basic directions, plus two with the RHS energies E_{ijk} of the triangles shaded in Fig. 1a (Supplementary equation 3). For the abstract y-crystal,



Fig. 3 | The auxiliary ε -plots and Wulff constructions for the Y-crystal or SnS a, The ε -plots (red) and Wulff construction shapes (gray) for the Y-crystal at $\mu = -0.67$, for $\alpha \equiv \varepsilon_3 - \varepsilon_{3'} = -0.03$, 0 or 0.03. The right insets are experimental images: the yellow rhomb²⁹, the violet rectangle³⁰ and two-corner truncated rectangle³⁰. Panel adapted with permission from: **a** (middle) ref.²⁹, Elsevier; **a** (right) ref.³⁰, IOP. **b**, The auxiliary edge energies of SnSe (at $\alpha \equiv \varepsilon_3 - \varepsilon_{3'} = 0.08$, $l_3 = 6.19$ Å; the plotted value is $\alpha l_3 = 0.49$) varying with chemical potential. The corresponding equilibrium polygons, marked by μ -values—where yellow rhomb is for -0.6 to 0.7, violet two-corner truncated rectangle is for 0.84 and violet rectangle is for 0.87–are color-shaded to match experimental photos (Supplementary Section 7) in the inset above **b**. **c**, The auxiliary edge energy chosen at random as $\alpha l = 0.62\mu + 0.19 \sin 15\mu$.

one simply picks RHS values in the master system, for instance, 0.5, 0.7, 0.6, 0.8 for the ribbons (*ii'*) and 5.1, 5.4 for the triangles (*ijk*). To be solvable, an underdetermined system must be complemented by two closure conditions, for example, by assigning arbitrary values (α , α') to two of the eight indeterminate edges or their combinations. After solving it for the basic edge energies, the interpolation ansatz gives $\varepsilon^{\alpha,\alpha'}(a)$ for all directions, to produce the shape of the *y*-crystal using the Wulff plots (Fig. 4a,b). Although the ε -plots vary with auxiliary energies (α, α'), the shape only shifts, remaining the same (see inset). This confirms the validity of the auxiliary edge energy method for the

no-symmetry (C_1) case, even with an increased number of auxiliaries (2, which is also the maximum for 2D).

A no-symmetry (C_1) material example – a monolayer of silver nitrite AgNO₂ salt^{16,17} with a triclinic unit cell-can be viewed as a silver lattice with NO₂ groups inserted between the silver atoms of the sparse direction of l_2 (Fig. 1b). The normals of all eight basic edges are at $a = 0^\circ$, 48.5°, 79.5°, 117.2°, 180°, 228.5°, 259.5° and 297.2°. For AgNO₂, the use of energy expression $\varepsilon(a)$ for the arbitrarily oriented edge, as well as the master system relating the eight basic edge energies, are all like the y-crystal above. What is new for an actual material is that the RHS values in the master system can now be provided as DFT-computed values: 0.82, 0.01, 0.52, 0.64 for the ribbons, and near 3.15 for the triangles. The tri-elemental composition can still be treated as bi-elemental Ag and NO₂. With $\mu_{Ag} + \mu_{NO_2} = \mu_{AgNO_2}$ being invariant, only one physical parameter must be specified, for example, the chemical potential of silver, $\mu_{\rm Ag}$. It enters the RHS of the master system (Supplementary equation 4) in the following ways (as seen by inspection of Fig. 1b). The μ_{Ag} is subtracted from E_{11} , E_{33} and E_{44} for the ribbons naturally containing extra silver, but not from $E_{22'}$. Similarly, for the triangles (shaded in Fig. 1b) we subtract μ_{Ag} from both $E_{123'}$ and $E_{12'4}$ to account for the extra silver atom per primitive cell.

At a given μ_{Ag} , for some conditions, the master system requires a closure with two auxiliaries (for example, $\alpha = \varepsilon_1 - \varepsilon_{1'}$ and $\alpha' = \varepsilon_2 - \varepsilon_2$) to solve the now-complete master system of eight equations, to determine all ε_i and the entire edge energy function $\varepsilon(a)$. We do not explore here how μ_{Ag} affects the crystal shape (this aspect was already covered for SnSe), but assign its value to the bulk silver, and proceed to predict the shape by solving the master system and finding the Wulff plots. This reveals a shape that is extreme and surprising at first (Fig. 4c). We were able to find confirmation in rather scarce AgNO₂ experimental evidence³¹ (Fig. 4g,h), in which the crystal shapes are fairly irregular yet strikingly resemble what theory predicts: a highly elongated needle–of no symmetry at all–with one end slanted while another is nearly straight.

Ranking the definability

Having now shown that the equilibrium crystal shape can be exactly predicted, even for a low-symmetry crystal with an undefinable edge energy, it is useful to briefly rank all 2D materials in this regard. The most common is (1) the trivial-definable case, that is, when inversion symmetry allows for all edge energies to be obtained directly from the total energies of sample-ribbons (for example graphene, phosphorene, SnS₂). If this is not possible (2), a less obvious regular polygon cutout can be found, and thus we call this case non-trivial-definable: all edge energies can be unambiguously computed and the crystal shape predicted (for example, hBN, MoS₂, GaS). There are then two levels among undefinable edge energies: (3) when only a pair of opposite edges permit direct definition while all others remain undefinable (as with SnSe, SnS, GeSe, GeS); and (4) the limit of having no symmetry at all as a foothold (as with AgNO₂) when none of the edge energies give way to definition. In the last two situations, the shape of the crystal can still be theoretically predicted without resorting to empirical data by using the auxiliary edge energy approach (see Supplementary Table 3). An additional test (Supplementary Section 10), with a crystal type such as hBN (2), is to predict its shape through the auxiliary edge energy protocol as if unaware of the existing solution based on equilateral triangles; we arrive at identical results.

Discussion

Predictions or explanations of equilibrium crystal shapes-traditionally performed through geometrical Wulff construction-relied on the known energy of the surfaces or, in the case of intensely researched 2D materials, their edges. However, for materials of low symmetry, the edge energy cannot be computed or even conceptually defined, and thus one seemingly cannot foresee the shapes without invoking



Fig. 4 | **The auxiliary ε-plots and Wulff constructions for** *y***-crystal and AgNO₂. a,b,** For the *y*-crystal, $(\alpha, \alpha') \equiv (\varepsilon_1 - \varepsilon_1, \varepsilon_2 - \varepsilon_2) = (0, 0, 3), (0, 0), (0, -0, 3)$ (**a**) and $(\alpha, \alpha') = (-0.3, 0), (0, 0), (0, 3, 0)$ (**b**). Black lines are the *ε*-plots, red and blue lines are the Wulff shapes, and the inset shows the invariant Wulff shape with edge colors as in Fig. 1a. **c**, The *ε*-plot and Wulff constructions for AgNO₂ at $\mu_{Ag} = \mu_{Ag-bulk}$ with blue, gray and red lines for $(\alpha, \alpha') = (-0.42, 0), (-0.02, 0)$ and (0.38, 0), respectively. **d**–**f**, Magnifications of **c**. **g**,**h**, Experimental images³¹ of synthesized AgNO₂, confirming its needle-like structure as computed. The thin red lines highlight the angles at the sample-needle tips in **h**, matching well with those computed in **d** and **f**. Panel **g** adapted from ref. ³¹, Politechnica University of Bucharest. Credit: **h**, Wikipedia.

empirical data from experiments¹⁵. Through a well-planned set of total energy computations, augmented by a concept of auxiliary energies, we demonstrated how one can restore the utility of the Wulff construction and accurately predict the equilibrium shapes of any material. This allowed us to easily include the role of the chemical potential, to explore materials such as SnSe and fully asymmetric AgNO₂, and to predict their shapes (in accordance with observations).

It is straightforward to generalize this method for 3D crystals, where our master system would grow up to 23 linear algebraic equations (Supplementary Section 11), plus the three constraints with auxiliary parameters needed, still easily solvable for predicting their shapes from first principles. We note a singular attempt³² for 3D wurtzite shape, was insightful in considering combinations of surfaces, although relied on experimentally known facets.

At finite temperatures, replacing the RHS of our master system and the $\varepsilon(a)$ with Gibbs free energies, that is adding entropy terms to DFT-based values, would account for crystal roughening (and round its vertices), well studied and not interfering with our approach. Extended capability to predict shapes of arbitrary crystals is important due to the numerous properties that shapes and edges control in catalysis, light-emission, electronics, sensing, magnetism, plasmonics and so on. The presence of a substrate³³ reduces the symmetry of 2D-layers; solvent and ligands can be included in calculations, further expanding the utility of the proposed method. Furthermore, recent interest in shift-twisted bilayers, with often low joint symmetry, makes their equilibrated shape a tantalizing target. Crystals of low-symmetry proteins and biomolecules³⁴ also offer broad application to understanding their morphology, which is beyond the scope of this work but certainly intriguing. The strategy described above provides a foundation for computational materials science approach to solving the broad range of crystal shape prediction problems that were previously unmanageable.

Methods

Methodology of the crystal shape prediction

To arrive at our constructive methodology one should first be clear about the fundamental lack of the surface energy definition. First alluded to in one example¹⁴ and soon proven to originate from general gauge invariance¹³, undefinable energy still goes against one's intuition. For uninitiated readers-or, in Cahn's own terms¹⁵, "those that are uncomfortable with this"-it is helpful to begin from basic examples. First, imagine a material with a single easy-cleavage direction, which (in absence of symmetry) would have two different basic edge energies. Its Wulff construction width is fixed by one equation only $(\varepsilon_1 + \varepsilon_{1'} = E_{11'})$ total edge energy of a strip), and is otherwise unconstrained, free to move in plane, with its position undetermined but its shape obviously unchanged (Fig. 2a). Second, if there are two inherently easy cuts in non-equivalent directions, the edge energy equations $\varepsilon_1 + \varepsilon_{1'} = E_{11'}$ and $\varepsilon_2 + \varepsilon_{2'} = E_{22'}$ leave the indeterminacy as 4 - 2 = 2, permitting both ribbons' translations but preserving their overlap-parallelogram shape (the Wulff construction; Fig. 2b). Third, with three cuts and opposite edge pairs (Fig. 2c), one, accordingly, has six unknown edge energies, and three (for ribbons 11', 22', 33') plus one (for triangle 123) to make a total of four equations; the indeterminacy is thus 6 - 4 = 2 again; the Wulff construction remains a triangle that can shift in plane without its corners truncated, an invariant shape (Supplementary Section 2a). This hints that, to deal with undefined energies, one can simply formulate all available relations (based on total energies of independent polygons) and repair the indeterminacy by adding any closure equations, which is the strategy we follow. One further learns from these examples that every extra cut adds 2 unknown edge energies but also exactly two non-trivial equations: one for a newly added ribbon and one for a new triangle, and thus the indeterminacy of 2 remains unchanged. Any symmetry axis would supply one equation, reducing the indeterminacy to 1, or to 0 for high symmetries.

Algorithm for shape determination

In terms of practical steps for the determination of equilibrium shapes for 2D materials, our approach is illustrated as a work-flow chart (Supplementary Fig. 12) and summarized as follows. For any 2D material, one should first judge whether it has undefinable edge energies by its symmetry space group (in practice, it is usually apparent from simply eyeballing the crystal lattice). If it does, examine and determine the basic edges, including the lowest energy reconstructions for each. Second, list an underdetermined set of equations for ribbons and triangles, and perform DFT calculations for the RHS values (DFT calculations of different levels, or even classical empirical potentials of sufficient accuracy, such as ReaxFF, for some elements are equally suitable, depending on the precision versus cost tradeoffs). Third, complement this underdetermined set by the (one or two, as needed) closure equations, and choose and fix the values of the auxiliary energies, solving the equation set to obtain basic edge energies. From which the complete edge energy as a function $\varepsilon(a)$ of direction-angle a can be obtained by the interpolation ansatz equation. Once this is known, one can perform conventional Wulff construction to determine the shape.

It is rather convenient to use the interpolation ansatz as an elegant shortcut, but is not unavoidable: one may prefer instead to merely increase the number of edges to sufficiently many (M), enough to achieve an accurate discretization for a continuous function $\varepsilon(a)$, for the cost of increased rank of the master system. See the important corollary in Supplementary Section 2c.

DFT parameters

To obtain numerical values for specific materials, as the RHS of the master system, such as in equations (1-4), the first-principles DFT calculations and structural optimization were performed using the Vienna ab initio simulation package (VASP v.5.4.4)³⁵, adopting generalized gradient approximation with the Perdew-Burke-Ernzerhof (PBE)³⁶ exchange-correlation functional along with the projectoraugmented wave (PAW) potentials. The pseudopotential versions for each element are PAW_PBE tin (08Apr2002), sulfur (17Jan2003), selenium (06Sep2000), silver (06Sep2000), nitrogen (08Apr2002), oxygen (08Apr2002) and boron (06Sep2000). Electronic wave functions were expanded in a plane wave basis set with a kinetic energy cutoff of 400 eV, and, for the Brillouin zone integration, a 9 × 1 × 1 Monkhorst-pack k-point mesh was used for ribbon structures. The energy convergence criterion for electronic wave function was set to be 10⁻⁵ eV. A vacuum layer of about 10 Å in *z*-direction was chosen to guarantee negligible spurious interaction between layers in monolayer simulations using periodic boundary conditions.

Reporting summary

Further information on research design is available in the Nature Research Reporting Summary linked to this article.

Data availability

The DFT data that support the findings of this study are available in Zenodo³⁷. Source Data are provided with this paper.

Code availability

The MATLAB codes used for Wulff plots are available in Zenodo³⁷.

References

- 1. Gibbs, J. W. On the equilibrium of heterogeneous substances. *Trans. Conn. Acad. Arts Sci.* **3**, 108–248 (1874).
- Landau, L. D. & Lifshitz, E. M. Statistical Physics 3rd edn, 155 (Pergamon, 1980).
- Wulff, G. Zur frage der geschwindigkeit des wachsthums und der auflösung der krystallflächen. Z. Kryst. Mineral. 34, 449–530 (1901).
- 4. Herring, C. Some theorems on the free energies of crystal surfaces. *Phys. Rev.* **82**, 87–93 (1951).
- Ringe, E., Van Duyne, R. P. & Marks, L. D. Kinetic and thermodynamic modified Wulff constructions for twinned nanoparticles. J. Phys. Chem. C. 117, 15859–15870 (2013).
- Wang, Q. H., Kalantar-Zadeh, K., Kis, A., Coleman, J. N. & Strano, M. S. Electronics and optoelectronics of two-dimensional transition metal dichalcogenides. *Nat. Nanotechnol.* 7, 699–712 (2012).
- 7. Geim, A. K. & Grigorieva, I. V. Van der Waals heterostructures. *Nature* **499**, 419–425 (2013).
- Zhou, J. et al. A library of atomically thin metal chalcogenides. Nature 556, 355–359 (2018).
- 9. Carvalho, A. et al. Phosphorene: from theory to applications. *Nat. Rev. Mater.* **1**, 16061 (2016).
- Rapcewicz, K., Chen, B., Yakobson, B. I. & Bernholc, J. Consistent methodology for calculating surface and interface energies. *Phys. Rev. B* 57, 7281–7291 (1998).
- Liu, Y., Bhowmick, S. & Yakobson, B. I. BN white graphene with *colorful' edges: the energies and morphology. Nano Lett.* **11**, 3113–3116 (2011).

- Cao, D., Shen, T., Liang, P., Chen, X. & Shu, H. Role of chemical potential in flake shape and edge properties of monolayer MoS₂. *J. Phys. Chem. C.* **119**, 4294–4301 (2015).
- Arbel, E. & Cahn, J. W. On invariances in surface thermodynamic properties and their applications to low symmetry crystals. *Surf. Sci.* 51, 305–309 (1975).
- Lee, J. K., Aaronson, H. I. & Russell, K. C. On the equilibrium shape for a non-centro-symmetric γ-plot. Surf. Sci. 51, 302–304 (1975).
- Cahn, W. J. & Handwerker, C. Equilibrium geometries of anisotropic surfaces and interfaces. *Mater. Sci. Eng. A* 162, 83–95 (1993).
- Mounet, N. et al. Two-dimensional materials from highthroughput computational exfoliation of experimentally known compounds. *Nat. Nanotechnol.* 13, 246–252 (2018).
- 17. Merck, E., Schenck, H. & Krauch, C. Chemical Reagents Their Purity and Tests (Archibald Constable, 1907).
- Jain, A. et al. Commentary: the materials project: a materials genome approach to accelerating materials innovation. *APL Mater.* 1, 011002 (2013).
- 19. Zhao, L.-D. et al. Ultralow thermal conductivity and high thermoelectric figure of merit in SnSe crystals. *Nature* **508**, 373–377 (2014).
- 20. Zhao, L.-D. et al. Ultrahigh power factor and thermoelectric performance in hole-doped single-crystal SnSe. *Science* **351**, 141–144 (2015).
- 21. Chang, C. et al. 3D charge and 2D phonon transports leading to high out-of-plane ZT in *n*-type SnSe crystals. *Science* **360**, 778–783 (2018).
- 22. He, W. et al. High thermoelectric performance in low-cost SnS_{0.91}Se_{0.09} crystals. Science **365**, 1418 (2019).
- 23. Sutter, E. et al. Electron-beam induced transformations of layered tin dichalcogenides. *Nano Lett.* **16**, 4410–4416 (2016).
- Fei, R., Li, W., Li, J. & Yang, L. Giant piezoelectricity of monolayer group IV monochalcogenides: SnSe, SnS, GeSe, and GeS. *Appl. Phys. Lett.* **107**, 173104 (2015).
- 25. Liu, Y., Dobrinsky, A. & Yakobson, B. I. Graphene edge from armchair to zigzag: the origins of nanotube chirality? *Phys. Rev. Lett.* **105**, 235502 (2010).
- 26. Najafabadi, R. & Srolovitz, D. J. The effect of surface relaxation and atomic vibration on the equilibrium shape of gold and copper crystallites. *J. Comput. -Aided Mater. Des.* **1**, 187–197 (1994).
- 27. Einstein, T. L. in *Handbook of Crystal Growth, Fundamentals* 2nd edn, Vol. 1a (ed. Nishinaga, T.) Ch. 5, 215–264 (Elsevier, 2015).
- Qian, G.-X., Martin, R. M. & Chadi, D. J. First-principles study of the atomic reconstructions and energies of Ga- and As-stabilized GaAs(100) surfaces. *Phys. Rev. B* 38, 7649–7663 (1988).
- Wang, Z. & Pang, F. A facile way to control phase of tin selenide flakes by chemical vapor deposition. *Chem. Phys. Lett.* **702**, 90–95 (2018).
- 30. Jiang, J. et al. Two-step fabrication of single-layer rectangular SnSe flakes. *2D Mater.* **4**, 021026 (2017).
- 31. Stroia, A. et al. A new route for synthesis and characterization of macroporous granular silver. *UPB Sci. Bull. Ser. B.* **74**, 7–18 (2012).
- Li, H., Geelhaar, L., Riechert, H. & Draxl, C. Computing equilibrium shapes of wurtzite crystals: the example of GaN. *Phys. Rev. Lett.* 115, 085503 (2015).
- Artyukhov, V. I., Hao, Y., Ruoff, R. S. & Yakobson, B. I. Breaking of symmetry in graphene growth on metal substrates. *Phys. Rev. Lett.* **114**, 115502 (2015).
- 34. Auyeung, E. et al. DNA-mediated nanoparticle crystallization into Wulff polyhedra. *Nature* **505**, 73 (2013).
- Kresse, G. & Furthmüller, J. Efficient iterative schemes for ab initio total-energy calculations using a plane-wave basis set. *Phys. Rev. B* 54, 11169–11186 (1996).

- Perdew, J. P., Burke, K. & Ernzerhof, M. Generalized gradient approximation made simple. *Phys. Rev. Lett.* 77, 3865–3868 (1996).
- Wang, L. Data and Codes (Zenodo, 2022); https://doi.org/10.5281/ zenodo.7130224

Acknowledgements

B.I.Y. acknowledges an extensive conversation with the late John W. Cahn, which ultimately motivated this study. This work was primarily supported by the Department of Energy, the Basic Energy Sciences program (DE-SC0012547, B.I.Y.) and in part—thermo-piezoelectric SnSe by the Army Research Office, the Electronics Division (W911NF-16-1-0255, B.I.Y.). The funders had no role in the study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Author contributions

B.I.Y. formulated the concept and goal for this project and the idea of solution. L.W. performed all of the DFT calculations, crystal structure design including the edge reconstructions and symmetry analysis. L.W. generated all the figures for the manuscript. L.W., S.N.S. and B.I.Y. wrote the manuscript. Z.Z. helped with computations at the early stage.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s43588-022-00347-5.

Correspondence and requests for materials should be addressed to Boris I. Yakobson.

Peer review information *Nature Computational Science* thanks the anonymous reviewers for their contribution to the peer review of this work. Handling editor: Jie Pan, in collaboration with the *Nature Computational Science* team.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons. org/licenses/by/4.0/.

© The Author(s) 2022, corrected publication 2022

nature research

Corresponding author(s): Boris I. Yakobson

Last updated by author(s): Sep 23, 2022

Reporting Summary

Nature Research wishes to improve the reproducibility of the work that we publish. This form provides structure for consistency and transparency in reporting. For further information on Nature Research policies, see our <u>Editorial Policies</u> and the <u>Editorial Policy Checklist</u>.

Statistics

For	all st	atistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.
n/a	Cor	nfirmed
	\boxtimes	The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement
	\boxtimes	A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly
\ge		The statistical test(s) used AND whether they are one- or two-sided Only common tests should be described solely by name; describe more complex techniques in the Methods section.
\ge		A description of all covariates tested
\ge		A description of any assumptions or corrections, such as tests of normality and adjustment for multiple comparisons
\ge		A full description of the statistical parameters including central tendency (e.g. means) or other basic estimates (e.g. regression coefficient) AND variation (e.g. standard deviation) or associated estimates of uncertainty (e.g. confidence intervals)
\boxtimes		For null hypothesis testing, the test statistic (e.g. <i>F</i> , <i>t</i> , <i>r</i>) with confidence intervals, effect sizes, degrees of freedom and <i>P</i> value noted Give <i>P</i> values as exact values whenever suitable.
\boxtimes		For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings
\times		For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes
\ge		Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated
	1	Our web collection on <u>statistics for biologists</u> contains articles on many of the points above.

Software and code

Policy information about <u>availability of computer code</u>		
Data collection	VASP, Vienna Ab Initio Simulation Package (version 5.4.4), was used to obtain numerical data. VASP is a well known and BIY lab has the license.	
Data analysis	Analysis and plotting used MATLAB (version R2011b, University school's license) based code, which is provided with submission.	

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Research guidelines for submitting code & software for further information.

Data

Policy information about availability of data

All manuscripts must include a data availability statement. This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A list of figures that have associated raw data
- A description of any restrictions on data availability

There is no original raw data, except the numerical values obtained by DFT computations with VASP (above). No data availability restrictions. Data availability statement: The DFT data that support the findings of this study are available from the corresponding author upon reasonable request. VASP input files examples are available in Zenodo as DOI: 10.5281/zenodo.7080216 and the link is https://zenodo.org/record/7080216. Source Data for Figures 3 and 4 are available with this manuscript.

Code availability: The MATLAB code used for Wulff plots is available from the corresponding author upon reasonable request, and also in Zenodo as DOI: 10.5281/ zenodo.7080216 and the link is https://zenodo.org/record/7080216.

Field-specific reporting

K Life sciences

Please select the one below that is the best fit for your research. If you are not sure, read the appropriate sections before making your selection.

Behavioural & social sciences Ecological, evolutionary & environmental sciences

For a reference copy of the document with all sections, see nature.com/documents/nr-reporting-summary-flat.pdf

Life sciences study design

All studies must disclose on these points even when the disclosure is negative.

Sample size	n/a
Data exclusions	n/a
Replication	n/a
Randomization	n/a
Blinding	n/a

Reporting for specific materials, systems and methods

Methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Materials & experimental systems

		-	
n/a	Involved in the study	n/a	Involved in the study
	Antibodies		ChIP-seq
	Eukaryotic cell lines		Flow cytometry
	Palaeontology and archaeology		MRI-based neuroimaging
	Animals and other organisms		
	Human research participants		
	Clinical data		
	Dual use research of concern		

Antibodies

Antibodies used	Describe all antibodies used in the study; as applicable, provide supplier name, catalog number, clone name, and lot number.
Validation	Describe the validation of each primary antibody for the species and application, noting any validation statements on the
	manufacturer's website, relevant citations, antibody profiles in online databases, or data provided in the manuscript.

Eukaryotic cell lines

Policy information about <u>cell lines</u>		
Cell line source(s)	State the source of each cell line used.	
Authentication	Describe the authentication procedures for each cell line used OR declare that none of the cell lines used were authenticated.	
Mycoplasma contamination	Confirm that all cell lines tested negative for mycoplasma contamination OR describe the results of the testing for mycoplasma contamination OR declare that the cell lines were not tested for mycoplasma contamination.	
Commonly misidentified lines (See <u>ICLAC</u> register)	Name any commonly misidentified cell lines used in the study and provide a rationale for their use.	

Palaeontology and Archaeology

Specimen provenance

Provide provenance information for specimens and describe permits that were obtained for the work (including the name of the issuing authority, the date of issue, and any identifying information).

Specimen deposition	Indicate where the specimens have been deposited to permit free access by other researchers.
Dating methods	If new dates are provided, describe how they were obtained (e.g. collection, storage, sample pretreatment and measurement), where they were obtained (i.e. lab name), the calibration program and the protocol for quality assurance OR state that no new dates are provided.

Tick this box to confirm that the raw and calibrated dates are available in the paper or in Supplementary Information.

Ethics oversight Identify the organization(s) that approved or provided guidance on the study protocol, OR state that no ethical approval or guidance was required and explain why not.

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Animals and other organisms

Policy information about studies involving animals; ARRIVE guidelines recommended for reporting animal research

Laboratory animals	For laboratory animals, report species, strain, sex and age OR state that the study did not involve laboratory animals.
Wild animals	Provide details on animals observed in or captured in the field; report species, sex and age where possible. Describe how animals were caught and transported and what happened to captive animals after the study (if killed, explain why and describe method; if released, say where and when) OR state that the study did not involve wild animals.
Field-collected samples	For laboratory work with field-collected samples, describe all relevant parameters such as housing, maintenance, temperature, photoperiod and end-of-experiment protocol OR state that the study did not involve samples collected from the field.
Ethics oversight	Identify the organization(s) that approved or provided guidance on the study protocol, OR state that no ethical approval or guidance was required and explain why not.

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Human research participants

Policy information about studies involving human research participants

Population characteristics	Describe the covariate-relevant population characteristics of the human research participants (e.g. age, gender, genotypic information, past and current diagnosis and treatment categories). If you filled out the behavioural & social sciences study design questions and have nothing to add here, write "See above."
Recruitment	Describe how participants were recruited. Outline any potential self-selection bias or other biases that may be present and how these are likely to impact results.
Ethics oversight	Identify the organization(s) that approved the study protocol.

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Clinical data

Policy information about <u>clinical studies</u> All manuscripts should comply with the ICMJE <u>guidelines for publication of clinical research</u> and a completed <u>CONSORT checklist</u> must be included with all submissions.

Clinical trial registration	Provide the trial registration number from ClinicalTrials.gov or an equivalent agency.
Study protocol	Note where the full trial protocol can be accessed OR if not available, explain why.
Data collection	Describe the settings and locales of data collection, noting the time periods of recruitment and data collection.
Outcomes	Describe how you pre-defined primary and secondary outcome measures and how you assessed these measures.

Dual use research of concern

Policy information about <u>dual use research of concern</u>

Hazards

Could the accidental, deliberate or reckless misuse of agents or technologies generated in the work, or the application of information presented in the manuscript, pose a threat to:

 No
 Yes

 Public health

 National security

 Crops and/or livestock

 Ecosystems

 Any other significant area

Experiments of concern

Does the work involve any of these experiments of concern:

No Yes
Demonstrate how to render a vaccine ineffective
Confer resistance to therapeutically useful antibiotics or antiviral agents
Enhance the virulence of a pathogen or render a nonpathogen virulent
Increase transmissibility of a pathogen
Alter the host range of a pathogen
Enable evasion of diagnostic/detection modalities
Enable the weaponization of a biological agent or toxin
Any other potentially harmful combination of experiments and agents

ChIP-seq

Data deposition

Confirm that both raw and final processed data have been deposited in a public database such as GEO.

Confirm that you have deposited or provided access to graph files (e.g. BED files) for the called peaks.

Data access links May remain private before publication.	For "Initial submission" or "Revised version" documents, provide reviewer access links. For your "Final submission" document, provide a link to the deposited data.
Files in database submission	Provide a list of all files available in the database submission.
Genome browser session (e.g. <u>UCSC</u>)	Provide a link to an anonymized genome browser session for "Initial submission" and "Revised version" documents only, to enable peer review. Write "no longer applicable" for "Final submission" documents.

Methodology

Replicates	Describe the experimental replicates, specifying number, type and replicate agreement.
Sequencing depth	Describe the sequencing depth for each experiment, providing the total number of reads, uniquely mapped reads, length of reads and whether they were paired- or single-end.
Antibodies	Describe the antibodies used for the ChIP-seq experiments; as applicable, provide supplier name, catalog number, clone name, and lot number.
Peak calling parameters	Specify the command line program and parameters used for read mapping and peak calling, including the ChIP, control and index files used.
Data quality	Describe the methods used to ensure data quality in full detail, including how many peaks are at FDR 5% and above 5-fold enrichment.
Software	Describe the software used to collect and analyze the ChIP-seq data. For custom code that has been deposited into a community repository, provide accession details.

Flow Cytometry

Plots

Confirm that:

The axis labels state the marker and fluorochrome used (e.g. CD4-FITC).

The axis scales are clearly visible. Include numbers along axes only for bottom left plot of group (a 'group' is an analysis of identical markers).

All plots are contour plots with outliers or pseudocolor plots.

A numerical value for number of cells or percentage (with statistics) is provided.

Methodology

Sample preparation	Describe the sample preparation, detailing the biological source of the cells and any tissue processing steps used.
Instrument	Identify the instrument used for data collection, specifying make and model number.
Software	Describe the software used to collect and analyze the flow cytometry data. For custom code that has been deposited into a community repository, provide accession details.
Cell population abundance	Describe the abundance of the relevant cell populations within post-sort fractions, providing details on the purity of the samples and how it was determined.
Gating strategy	Describe the gating strategy used for all relevant experiments, specifying the preliminary FSC/SSC gates of the starting cell population, indicating where boundaries between "positive" and "negative" staining cell populations are defined.

Tick this box to confirm that a figure exemplifying the gating strategy is provided in the Supplementary Information.

Magnetic resonance imaging

Experimental design

Design type	Indicate task or resting state; event-related or block design.
Design specifications	Specify the number of blocks, trials or experimental units per session and/or subject, and specify the length of each trial or block (if trials are blocked) and interval between trials.
Behavioral performance measures	State number and/or type of variables recorded (e.g. correct button press, response time) and what statistics were used to establish that the subjects were performing the task as expected (e.g. mean, range, and/or standard deviation across subjects).

Acquisition

Imaging type(s)	Specify: functional, structural, diffusion, perfusion.	
Field strength	Specify in Tesla	
Sequence & imaging parameters	Specify the pulse sequence type (gradient echo, spin echo, etc.), imaging type (EPI, spiral, etc.), field of view, matrix size, slice thickness, orientation and TE/TR/flip angle.	
Area of acquisition	State whether a whole brain scan was used OR define the area of acquisition, describing how the region was determined.	
Diffusion MRI Used	Not used	
Preprocessing		
Preprocessing software	Provide detail on software version and revision number and on specific parameters (model/functions, brain extraction, segmentation, smoothing kernel size, etc.).	
Normalization	If data were normalized/standardized, describe the approach(es): specify linear or non-linear and define image types used for transformation OR indicate that data were not normalized and explain rationale for lack of normalization.	
Normalization template	Describe the template used for normalization/transformation, specifying subject space or group standardized space (e.g. original Talairach, MNI305, ICBM152) OR indicate that the data were not normalized.	
Noise and artifact removal	Describe your procedure(s) for artifact and structured noise removal, specifying motion parameters, tissue signals and physiological signals (heart rate, respiration).	

5

Define your software and/or method and criteria for volume censoring, and state the extent of such censoring.

Statistical modeling & inference

Model type and settings	Specify type (mass univariate, multivariate, RSA, predictive, etc.) and describe essential details of the model at the first and second levels (e.g. fixed, random or mixed effects; drift or auto-correlation).		
Effect(s) tested	Define precise effect in terms of the task or stimulus conditions instead of psychological concepts and indicate whether ANOVA or factorial designs were used.		
Specify type of analysis: Whole brain ROI-based Both			
Statistic type for inference (See <u>Eklund et al. 2016</u>)	Specify voxel-wise or cluster-wise and report all relevant parameters for cluster-wise methods.		
Correction	Describe the type of correction and how it is obtained for multiple comparisons (e.g. FWE, FDR, permutation or Monte Carlo).		

Models & analysis

n/a Involved in the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the study Image: State of the s	is
Functional and/or effective connectivity	Report the measures of dependence used and the model details (e.g. Pearson correlation, partial correlation, mutual information).
Graph analysis	Report the dependent variable and connectivity measure, specifying weighted graph or binarized graph, subject- or group-level, and the global and/or node summaries used (e.g. clustering coefficient, efficiency, etc.).
Multivariate modeling and predictive analysis	Specify independent variables, features extraction and dimension reduction, model, training and evaluation metrics.