# First-principles investigation of strain effects on the stacking fault energies, dislocation core structure, and Peierls stress of magnesium and its alloys

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Taking pure Mg, Mg-Al, and Mg-Zn as prototypes, the effects of strain on the stacking fault energies (SFEs), dislocation core structure, and Peierls stress were systematically investigated by means of density functional theory and the semidiscrete variational Peierls-Nabarro model. Our results suggest that volumetric strain may significantly influence the values of SFEs of both pure Mg and its alloys, which will eventually modify the dislocation core structure, Peierls stress, and preferred slip system, in agreement with recent experimental results. The so-called "strain factor" that was previously proposed for the solute strengthening could be justified as a major contribution to the strain effect on SFEs. Based on multivariate regression analysis, we proposed universal exponential relationships between the dislocation core structure, the Peierls stress, and the stable or unstable SFEs. Electronic structure calculations suggest that the variations of these critical parameters controlling strength and ductility under strain can be attributed to the strain-induced electronic polarization and redistribution of valence charge density at hollow sites. These findings provide a fundamental basis for tuning the strain effect to design novel Mg alloys with both high strength and ductility.

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# I. INTRODUCTION

Magnesium (Mg-based) alloys are attractive for extensive automobile [1], aerospace [2,3], and biomedical applications [4] due to their high strength-to-weight ratio, low density, and biodegradability [4]. However, the trade-off dilemma between strength and ductility and the poor workability and formability are two longstanding bottlenecks for the development of novel Mg alloys. It is generally believed that the strong crystallographic anisotropy and the lack of slip systems of hexagonal close packed (hcp) Mg alloys [5] are the main reasons for the poor plasticity and ductility, which identify the workability and formability, while the low slip resistance to dislocation movement leads to the low strength.

Solution strengthening of Mg alloys is generally used in practice and has been well investigated by many research groups [6–11]. Its ability to enhance the energy barrier of dislocation movement without profound loss of ductility can be explained by the fact that the number of slip systems is not changed by alloying particular elements [12]. By introducing solutes, the slip resistance in the basal (0001) plane can be effectively increased, while simultaneously, the critical stress for cross-slip from the basal plane to the secondary prismatic ( $10\overline{10}$ ) planes is decreased. For example, Al and Zn are two typical solute elements which are experimentally found to lower the critical stress for cross-slip [13].

In ductilizing Mg alloys, slip in both basal and nonbasal planes must be active (as governed by the von Mises criterion [14]) to achieve appreciable ductility. However, the stress required to plastically deform Mg alloys along its (easy) basal slip plane is 2 orders of magnitude lower than that of the (hard) nonbasal plane. To solve this problem, recent theoretical investigations suggest that the addition of effective solutes (e.g., the rare earth elements may play a role to randomize the texture [15]) may distinctly modify the energy of the I<sub>1</sub>-type stacking fault, and thus promote the heterogeneous nucleation of pyramidal  $\langle c + a \rangle$  dislocations, which will in turn benefit the ductility of Mg alloys [16]. Usually, the major role of the added different solutes is to activate more than five independent slip systems for an appreciable ductilization. The solute effect on the dislocation core structure and Peierls stress has been recently systematically studied by Pei et al. [17] and Yasi et al. [18] in order to underline the slip mechanism controlling the ductility. These studies have shown that different elements may indeed influence the slip behavior, cross-slip, and dislocation reaction.

Although the introduction of an appropriate solute provides an effective pathway for strengthening and ductilizing Mg alloys [12,13,19–22], the strain effects must also be included to account for the strength and ductility of Mg alloys. At equilibrium, a pure geometrical analysis indicates that the plasticity should be accommodated by the slip along five independent slip systems activated in ascending order (i.e., the easiest slip system in Mg is basal slip along {0001} $\langle \overline{1210} \rangle$ , followed by prismatic slip along {1010} $\langle \overline{1210} \rangle$ , and the next easy slip systems are pyramidal plane type I along {1011} $\langle \overline{1210} \rangle$  and {1011} $\langle \overline{1123} \rangle$ , as well as type II along {1122} $\langle \overline{1123} \rangle$  [23]) due to their different critical resolved shear stresses for slip. Under sufficient strain, however, the plastic

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deformation of Mg alloys cannot be simply quantified by this geometrical analysis at equilibrium because the strain will not only change the c/a ratio but also modify the stacking fault energies (SFEs), and eventually induce different dislocation core structures, dislocation mobilities, and the preferred slip systems. Because all these intrinsic parameters are critical in governing the plastic deformation, their variations by strains will eventually modify the mechanical strength and ductility of Mg alloys. For example, a higher value of SFE will hinder the formation of a wider dislocation core, and as a result decrease the mobility of dislocation during the loading. Recent experiments have confirmed that (a) the nonbasal slip systems of Mg alloys can be activated by hydrostatic pressure [24–26]; (b) under *c*-axis compression the operative modes for pure Mg are  $\langle c + a \rangle$  slip on pyramidal II and significant ductilizing and hardening occur [27]; and (c) compressive predeformation changes the deformation behavior and yield strength of a Mg-Al-Zn alloy under tensile loadings [28]. These results suggest a necessity to investigate the effect of strain on the SFEs, dislocation core structure, and associated Peierls stress, which are critical in strengthening and ductilizing Mg alloys.

In the present study, we take the volumetric strain as a representative case to present the strain effect with a wide range of strain (i.e.,  $-0.12 < \Delta V/V < 0.13$ , corresponding to the pressure value with  $-5.7 \sim 3.4$  GPa) to meet not only the normal loading conditions with low strain or stress, such as less than the tensile yield strength of pure Mg, but also those special cases under which Mg alloys can support a larger strain or stress (e.g., several GPa), such as shock loading with high strain rate, high hydrostatic pressure within confined volume, and in a nanocrystalline state with restricted dislocation mobilities. For example, under one-dimensional shock loading with a velocity of about 500 m/s, some Mg alloys can be longitudinally stressed to about 3GPa [29,30], and the effects of high pressure on the mechanical properties of Mg alloys have been studied experimentally, with a maximum pressure of 6 GPa [31,32]. In Sec. II, we first describe the method of first-principles calculation, the approach to calculate the SFEs, the semidiscrete variational PN model used for the determination of dislocation core structure and the calculation details of Peierls stress. Afterwards, the calculated results are presented in Sec. III: the effect of volumetric strain on the SFEs is given in Sec. III A, and the dislocation core structure and Peierls stress in Sec. III B. To underline the physical origin of the strain effect, an in-depth analysis of electronic structure is given in Sec. III C. Afterwards, a discussion on the strengthening and ductilizing mechanism in Mg alloys is given in Sec. IV. We conclude in Sec. V with a recap of the major conclusions drawn in this study.

# **II. COMPUTATIONAL APPROACH**

#### A. First-principles calculation

Our first-principles density functional theory (DFT) calculations were performed using the Vienna *ab initio* simulation package (VASP) code [33] by the projector augmented wave (PAW) method [34] with the Perdew-Burke-Ernzerhof (PBE) version [35] of the generalized gradient approximation (GGA) as the exchange-correlation functional. An energy cutoff of TABLE I. The calculated lattice constants *a* and *c* (in Angstroms) and cohesive energy  $E_c(eV/atom)$  of pure Mg together with other theoretical values [38–40].

		Lattice of		
	Refs.	a	С	$E_{c}$
	This work	3.195	5.172	-1.50
Duna Ma	Expt. [38]	3.21 <sup>a</sup>	5.21 <sup>a</sup>	
Pure Mg	Calc. [40]	3.221	5.178	-1.44
	Calc. [39]	3.19	5.17	

<sup>a</sup>These experimental values are acquired at 298 K.

500 eV and  $15 \times 15 \times 3 k$ -mesh  $\gamma$ -centered grids were used. The SFE was tested carefully for the convergence as a function of the *k*-mesh grid (see Fig. S1 in Supplemental Material [36]). The energy convergence criterion of the electronic self-consistency is chosen as  $10^{-6}$  eV/cell, while the force convergence criterion of ionic relaxation is used, with all forces acting on the atoms being lower than 0.01 eV/Å. The Methfessel-Paxton (MP) method [37] was used for the electronic self-consistency of both ionic relaxation and energy calculation with a smearing width of 0.01 eV.

Table I lists the optimized lattice constants of pure Mg, which are in very good agreement with previously published experimental [38] and theoretical [39] data. The calculated cohesive energy of pure Mg also agrees well with the results of previous theory [40], providing a further validation of the PAW pseudopotentials used for Mg alloys.

# B. Stacking fault energy

The SFE describes the energy variation when two parts of a crystal are rigidly shifted with different fault vectors lying in a given crystallographic plane [41]; it is defined as

$$\gamma = \frac{E_{SF} - E_0}{A},\tag{1}$$

where  $E_{SF}$  and  $E_0$  are the energies of the structure with a stacking fault and the perfect structure, respectively, and A is the area of the stacking fault plane. To calculate the SFEs, we built a periodic supercell containing 48 atoms (four atoms per layer). The lattice vectors of the supercell are parallel to the [1120], [1010], and [0001] directions, respectively. For Mg alloys, a Mg atom at one faulted plane (0001) was replaced by one solute atom X (X = Zn or Al). Therefore, the global solute concentration is about 2.08%, which corresponds to an areal concentration of 25% at the faulted plane for an  $Mg_{47}X$ alloy. In general, there are two approaches to calculate the SFEs by means of DFT, namely, alias shear [42] and slab shear [43]. The former one can be complemented by an alias shear deformation of a periodic supercell via the Cartesian coordinate representations of atomic position, while the latter one requires only the movement of atomic positions within two slabs but requires a supercell surrounded by a sufficiently thick vacuum to eliminate any surface effects. In our study, the alias shear approach was employed for the following considerations: (1) the number of supercell atoms is only onehalf of that using the slab shear technique; and (2) the stress can be directly derived from the stress-strain relationship of the

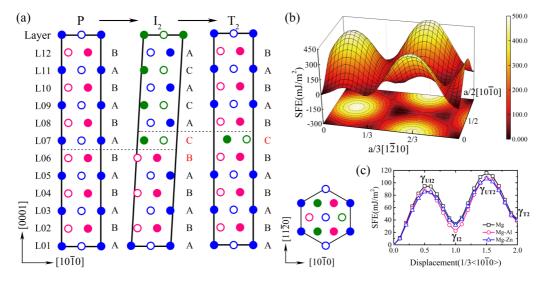


FIG. 1. (a) Schematic illustration of the perfect lattice, basal stacking fault I<sub>2</sub>, and twin stacking fault T<sub>2</sub> configurations generated via the alias shear. The letters A, B, and C represent different stacking sequences of (0001) planes, which are identified by blue, pink, and olive symbols, respectively, with the stacking fault being highlighted in red. The solid and open circles represent the atomic coordinates at 0 and  $\frac{1}{2}$  along [1120] direction, respectively, and the dotted line indicates the stacking fault position. (b) The full  $\gamma$  surface of pure Mg for the basal (0001) plane. (c) The calculated SFE profiles of pure Mg, Mg-Al, and Mg-Zn along the [1120] direction to indicate the stable SFEs ( $\gamma_{I_2}$  and  $\gamma_{T_2}$ ) and unstable SFEs ( $\gamma_{U_1}$  and  $\gamma_{UT_2}$ ).

simulated supercell. Figure 1(a) illustrates the configuration of an I<sub>2</sub> stacking fault (... ABABCACA...) that was generated from the perfect hcp structure by displacing the upper half of the supercell by 1/3[1010] while holding the bottom half fixed. The twin fault T<sub>2</sub> (... ABABCBABA...) can be obtained by displacing another layer of I<sub>2</sub> as indicated by the dotted line in Fig. 1(a). In order to get the entire  $\gamma$  surface, including unstable SFEs, only vertical movement normal to the slip plane was permitted during atomic relaxation.

In the present work, we first applied a series of volumetric strains on the supercell to study the variations of SFEs under strain. It should be noted that the volumetric strain is imposed by changing the lattice constants of *a* and *c*. During this procedure only the atomic positions were allowed to relax, with the constraint of crystallographic symmetry, and the SFEs were calculated by employing the alias shear approach based on the relaxed strained supercell.

#### C. Dislocation core structure and Peierls stress

Three approaches are generally used to determine the dislocation core structure based on first-principles calculation: a solution based on flexible boundary conditions [44–46], an analytical solution based on dislocation dipole array [41,47],

and the semidiscrete variational PN model evolved from the classic one by Bulatov and Kaxiras [48] and Lu [49]. With the last one as our basis, the model assumption is that one dislocation line is parallel to the *z* axis ([1010]) with Burgers vector  $\vec{b} = 1/3[11\bar{2}0]$  (*x* axis), with slip on the *x*-*z* plane. The trial displacements for the edge and screw components of the partial dislocations are expressed by Eq. (2) and used to determine the equilibrium configuration of the dislocation in pure Mg and Mg alloys [50]:

$$u_{x}(x) = \frac{b}{2\pi} \left( \arctan \frac{x - d_{x}/2}{w_{x}} + \arctan \frac{x + d_{x}/2}{w_{x}} \right) + \frac{b}{2}$$
$$u_{z}(x) = \frac{\sqrt{3}b}{6\pi} \left( \arctan \frac{x - d_{z}/2}{w_{z}} - \arctan \frac{x + d_{z}/2}{w_{z}} \right), \quad (2)$$

where  $d_x$  (or  $d_z$ ) is the separation between edge (or screw) components of the two partial dislocations, and  $w_x$  (or  $w_z$ ) gives the half-width of edge (or screw) components of the two partial dislocations. An illustration of the meaning of these qualities is shown in Fig. 2. Equivalently, the dislocation core structure is described by the misfit density  $\rho(x) \equiv du(x)/dx$ , and the typical profiles of  $u_x(x), u_z(x), \rho_x(x)$ , and  $\rho_z(x)$  are shown in Fig. 2. The  $\gamma$  surface was expanded in a 2D Fourier series as suggested in Ref. [51]:

$$\begin{split} \gamma(u_x, u_z) &= c_0 + c_1[\cos(2qu_z) + \cos(pu_x + qu_z) + \cos(-pu_x + qu_z)] + c_2[\cos(2pu_x) + \cos(pu_x + 3qu_z) \\ &+ \cos(-pu_x + 3qu_z)] + c_3[\cos(4qu_z) + \cos(2pu_x + 2qu_z) + \cos(pu_x - 2qu_z)] \\ &+ c_4 \begin{bmatrix} \cos(3pu_x + qu_z) + \cos(3pu_x - qu_z) + \cos(2pu_x + 4qu_z) \\ &+ \cos(2pu_x - 4qu_z) + \cos(pu_x + 5qu_z) + \cos(-pu_x + 5qu_z) \end{bmatrix} \\ &+ a_1[\sin(pu_x - qu_z) - \sin(pu_x + qu_z) + \sin(2qu_z)] + a_2[\sin(2pu_x - 2qu_z) - \sin(2pu_x + 2qu_z) + \sin(4qu_z)], \end{split}$$

(3)

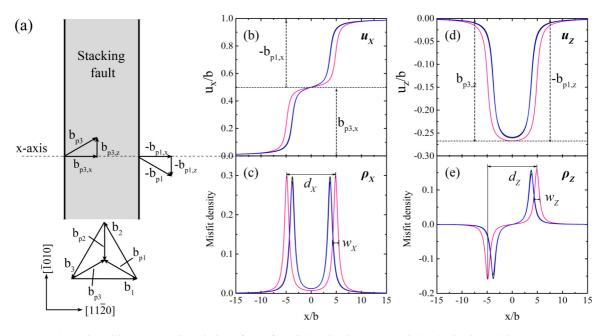


FIG. 2. (a) A schematic to illustrate the dissociation of a perfect dislocation into two partials. The  $b_1$ ,  $b_2$ , and  $b_3$  are the Burgers vectors of perfect dislocation, and the  $b_{p1}$ ,  $b_{p2}$ , and  $b_{p3}$  are the Burgers vectors of partial dislocation. The  $b_{p3,x}$ ,  $b_{p3,z}$ ,  $b_{-p1,x}$ , and  $b_{-p1,z}$  are the components of  $b_{p3}$  and  $b_{-p1}$  along x and z axes, respectively. (b–e) The dislocation core structure of pure Mg (black curve) and Mg alloys (pink curve for the Mg-Al alloy and blue curve for the Mg-Zn alloy) at equilibrium. The separation  $d_x$  (or  $d_z$ ) between the edge (or screw) components of the two partials is defined as the distance between the two peaks, and the width  $w_x$  (or  $w_z$ ) of the edge (or screw) components of a partial dislocation is the FWHM, approximately, as shown in this figure.

where  $p = 2\pi/b$ ,  $q = 2\pi/(\sqrt{3}b)$ , and  $c_0 = -3(c_1 + c_2 + c_3 + 2c_4)$ , which could be determined by applying the condition  $\gamma(0,0) = 0$ . The unknown coefficients  $c_1, c_2, c_3, c_4, a_1$ , and  $a_2$  were determined by fitting the  $\gamma$  surface [as illustrated in Fig. 1(b)] with Eq. (3) and nonlinear least-squares method based on the trust-region algorithm.

The total energy of a dislocation  $E_{tot}$  is expressed as the sum of the misfit energy  $E_{mis}$  and the elastic energy  $E_{el}$  [48]:

$$E_{\text{tot}} = \sum_{i} \gamma [u_x(x_i), u_z(x_i)] \Delta x + K_e \sum_{ij} \chi_{ij} \rho_{x,i} \rho_{x,j} + K_s \sum_{ij} \chi_{ij} \rho_{z,i} \rho_{z,j}, \qquad (4)$$

$$p_{x,i} = (u_{x,i} - u_{x,i-1})/(x_i - x_{i-1}),$$
(4a)

$$p_{z,i} = (u_{z,i} - u_{z,i-1})/(x_i - x_{i-1}),$$

$$\begin{aligned} &\psi_{i,j} = (5/2)\psi_{i,i-1}\psi_{j,j-1} + \psi_{i-1,j-1} \\ &+ \psi_{i,j} - \psi_{i-1,j} - \psi_{i,j-1}, \end{aligned}$$
(4b)

$$\psi_{i,j} = (1/2)\varphi_{i,j}^2 \ln |\varphi_{i,j}|, \quad \varphi_{i,j} = x_i - x_j,$$
(4c)

$$K_e = G/[4\pi(1-\nu)], \quad K_s = G/(4\pi),$$
 (4d)

where  $x_i$  are the reference positions,  $\Delta x$  is the average spacing of the atomic rows in the lattice, *G* is the shear modulus, and  $\nu$  is the Poisson ratio. In our calculations, a same set of elastic constants (i.e.,  $K_e = 2.238$  and  $K_s = 1.647$  (see Table II together with the experimental data [52] and other predictions from the literature [40]) was used to determine the dislocation core structure and Peierls stress of Mg and Mg alloys. Then, the equilibrium core structure of dislocation, defined by the parameters  $d_x$ ,  $d_z$ ,  $w_x$ , and  $w_z$  in Eq. (2), was obtained by minimizing the total energy  $E_{tot}$  [53], and accordingly, the particle swarm optimization (PSO) algorithm [54,55] was employed for the energy minimization in the present study.

The Peierls stress is defined as the critical resolved shear stress required to move a dislocation across a crystal lattice [56,57]. To determine the Peierls stress, the method proposed in Ref. [56] was employed in the present study and the misfit energy in Eq. (4) is rewritten as

$$E_{\rm mis}(\mu) = \sum_{m} \gamma [u_x(m\Delta x - \mu), u_z(m\Delta x - \mu)]\Delta x.$$
 (5)

Accordingly, the Peierls stress  $\tau_P$  is determined by

$$\tau_P = \max\{\tau\} = \max\left\{\frac{1}{b}\frac{dE_{\min}(\mu)}{\mu}\right\}.$$
 (6)

#### **III. RESULTS**

We first determined the SFEs of the unstrained Mg and its alloys, both to serve as a baseline for validation of present studies and to understand the origin of the large scatter of the SFEs reported in previous publications. Table III shows our calculated values of stable SFEs ( $\gamma_{I_2}$ ,  $\gamma_{T_2}$ ) and unstable SFEs ( $\gamma_{UI_2}$ ,  $\gamma_{UT_2}$ ) of pure Mg and its alloys compared with previous calculated literature values [6–12,17,40,58–61]. For the stable SFE  $\gamma_{I_2}$  of pure Mg, the experimental values vary from 50 mJ/m<sup>2</sup> to 280 mJ/m<sup>2</sup> [8], mostly owing to the uncertainty in experiments, such as the conditions, methods, sample purity, and assumptions in the analysis. Although most

TABLE II. The calculated elastic constants  $c_{ij}$ , the derived Hill average bulk moduli  $B_H$ , shear moduli  $G_H$ , and Young's moduli  $E_H$  (all in GPa), and the Poisson ratio  $v_H$  of pure Mg, which are the input parameters for the semidiscrete variational PN model, together with the experimental data and other theoretical values [40,52].

Material	$c_{11}$	<i>c</i> <sub>12</sub>	<i>c</i> <sub>13</sub>	C <sub>33</sub>	C44	$B_H$	$G_H$	$E_H$	$v_H$	$K_e$	$K_s$
hcp Mg <sup>a</sup>	69.12	21.84	20.01	70.84	16.37	36.98	20.70	52.34	0.264	2.238	1.647
hcp Mg <sup>b</sup>	59.5	26.12	21.8	61.55	16.35	35.55	17.21	44.45	0.292	1.934	1.370
hcp Mg <sup>c</sup>	63.1	22.2	22.7	66.3	22.6	36.4	21.5	53.8	0.254	2.293	1.711

<sup>a</sup>This work.

<sup>b</sup>Expt. [52], and these experimental values are acquired at 298 K.

<sup>c</sup>Calc. [40].

theoretical SFEs lie between 20.1 and  $48.2 \text{ mJ/m}^2$  for pure Mg (see Table III), a large scatter still exists relative to the precision of DFT total energies, which are generally within  $\pm 1 \text{ meV/atom}$ . Therefore, we have checked the convergence in the calculation of SFEs with respect to the variations of the density of the *k*-point mesh grids and different choices of cutoff energy, both of which are critical for high-precision energy calculations. By a careful comparison, we found that the difference of the calculated SFEs in past studies was mostly due to their different *k*-mesh grid points, as a lower *k*-mesh grid will generate a larger scatter in the calculated SFEs (see Fig. S1 in Supplemental Material [36]). Given these considerations, we used a relatively high density of *k*-mesh grids ( $15 \times 15 \times 3$ ) and a high cutoff energy of 500 eV in our following calculations; our calculated stable SFE  $\gamma_{I_2}$  of pure

Mg is about 33.85 mJ/m<sup>2</sup>, which is very close to the reported value by high-precision calculation methods.

#### A. Effect of strain on the SFEs and twinnability

We now study the effect of volumetric strain on the stable SFEs ( $\gamma_{I_2}, \gamma_{T_2}$ ) and unstable SFEs ( $\gamma_{UI_2}, \gamma_{UT_2}$ ). Figure 3 presents the variations of the stable and unstable SFEs of pure Mg and Mg – Zn under volumetric strain, ranging from  $\Delta V/V = -0.12-0.13$ . It is shown that for all four types of SFEs, the variations of SFEs with respect to the volumetric strain show strong similarity, i.e., the SFEs monotonically decrease with increasing  $\Delta V/V$ , but they remain positive. By multivariate regression analysis, the dependence of the stable and unstable SFEs on the volumetric stain

TABLE III. The calculated stable SFEs ( $\gamma_{I_2}$ ,  $\gamma_{T_2}$ ) and unstable SFEs ( $\gamma_{UI_2}$ ,  $\gamma_{UT_2}$ ) of pure Mg and Mg alloys together with previous theoretical values (in mJ/m<sup>2</sup>).  $x_g$  (%) and  $x_{SF}$  (%) are the global solute concentration and the areal concentration within the stacking fault plane, respectively.

Mg-X	x <sub>g</sub>	$x_{SF}$	$\gamma_{I_2}$	$\gamma_{UI_2}$	$\gamma_{T_2}$	$\gamma_{UT_2}$	NOTE
Mg			33.85	93.57	41.36	114.46	This work, alias shear, GGA-PBE
			20.1	95.8	38.2	120.3	CASTEP, slab shear, GGA-PW91 [40]
			26.1	94.9	37.1	111.2	VASP, alias shear, GGA-PBE [8]
			36	92	39	111	VASP, slab shear, GGA-PBE [7]
			30.0		40.0		VASP, alias shear, GGA-PBE [10]
			29.1				ANNNI framework [12]
			33		42		VASP, CINEB [6]
			33.8	87.6			VASP, slab shear, GGA-PW91 [11]
			21.4				VASP, slab shear, GGA-PBE [59]
			21	88			VASP, slab shear, GGA-PW91 [60]
			33.8	87.6	40.2	154.3	VASP, slab shear, GGA-PW91 [58]
			48.2				VASP, slab shear [9]
			35.4				VASP, slab shear [61]
Al	2.08	25	22.50	87.62	38.01	108.26	This work, alias shear, GGA-PBE
	1.04	8.33	24.8		36.0		VASP, alias shear, GGA-PBE [8]
	2.08	25	21		32		VASP, slab shear, GGA-PBE [7]
	0.69	8.33	29.7		37.1		VASP, alias shear, GGA-PBE [10]
	1.67	50	23		42		VASP, CINEB [6]
	0.78	6.25	33.6				VASP, slab shear [9]
Zn	2.08	25	31.64	85.43	39.77	106.43	This work, alias shear, GGA-PBE
	1.04	8.33	25.5		37.2		VASP, alias shear, GGA-PBE [8]
	2.08	25	37		43		VASP, slab shear, GGA-PBE [7]
	0.69	8.33	26.2		37.6		VASP, alias shear, GGA-PBE [10]
	0.93	11.11	35.1	94.2			VASP, slab shear, GGA-PW91[11]
	0.78	6.25	30.8				VASP, slab shear [9]
	2.08	25	35				VASP, alias shear [17]

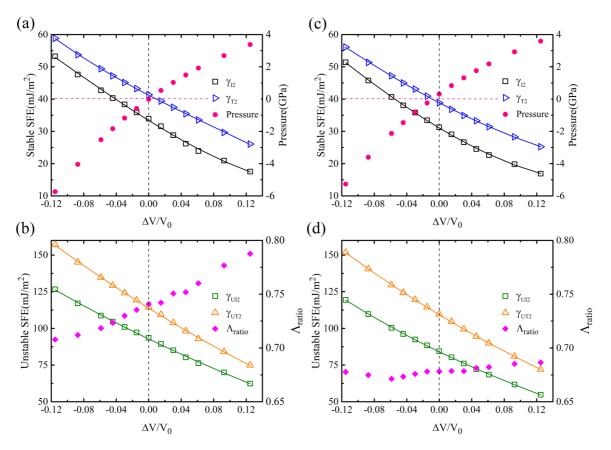


FIG. 3. The calculated stable and unstable SFEs, the pressure, and the twinnability for (a, b) pure Mg and (c, d) Mg-Zn as a function of volumetric strain. It is found that the dependence of the stable and unstable SFEs on the volumetric stain can be well described by a polynomial fit.

can be well described by a polynomial fit  $\gamma(mJ/m^2) =$  $a + b(\Delta V/V) + c(\Delta V/V)^2 + d(\Delta V/V)^3$  with the second derivative  $d^2 \gamma / d(\Delta V / V)^2 > 0$ . (The fitting coefficients are provided in Table S1 in Supplemental Material [36].) These observations indicate that volumetric compression has a greater influence on the SFE values than volumetric tension. It should be noted that a similar effect (i.e., cubic polynomial fit between the SFEs and volumetric strain) has also been reported for fcc copper [43], suggesting that this could be a general volumetric strain effect, independent of crystal structure. In order to quantitatively account for the correlation between the applied strain and the resultant pressure, the hydrostatic pressure is calculated and shown in Figs. 3(a) and 3(c). A continuous increase from -5.7 GPa to 3.4 GPa is observed for pure Mg, and from -5.3 GPa to 3.6 GPa for the Mg-Zn alloy, as  $\Delta V/V$  increases from -0.12 to 0.13.

Using the calculated stable SFEs ( $\gamma_{I_2}$ ,  $\gamma_{T_2}$ ) and unstable SFEs ( $\gamma_{UI_2}$ ,  $\gamma_{UT_2}$ ), the twinnability of pure Mg and its alloys is characterized by the following ratio [6,8]:

$$\Lambda_{\text{ratio}} = \frac{\gamma_{UI_2} - \gamma_{I_2}}{\gamma_{UT_2} - \gamma_{I_2}}.$$
(7)

A larger value of  $\Lambda_{ratio}$  indicates a greater tendency towards the formation of twins. Figures 3(b) and 3(d) present the change of  $\Lambda_{ratio}$  under volumetric strain. At equilibrium  $(\Delta V/V = 0.00)$ , it is seen that the  $\Lambda_{ratio}$  value of pure Mg (0.741) is larger than that of Mg-Zn alloy (0.678), but they are both much smaller than that of the Mg-Al alloy (0.800), indicating that the solute atom Al can promote twin formation, while the Zn atom decreases the potency to form a twin in Mg-based alloy. As shown in the microstructures of the as-rolled Mg-1.5Zn and Mg-3Al at room temperature, Mg-3Al exhibits more extensive twinning as compared with Mg-1.5Zn [62], which indicates a greater tendency towards the formation of twins in Mg-Al alloys as compared with Mg-Zn alloy. This agrees well with our calculated result.

Under volumetric strain, the  $\Lambda_{ratio}$  increases rapidly from 0.708 to 0.788 for pure Mg, while for Mg-Zn, the  $\Lambda_{ratio}$  increases gradually from 0.678 to 0.686, as the strain  $\Delta V/V$  changes from -0.12 to 0.13. These results indicate that a volumetric expansion promotes twin formation in pure Mg and Mg alloys. A similar trend of the effect of volumetric strain on SFEs and twinnability has also been observed in Mg-Al alloy; we refer to Fig. S2b in Supplemental Material [36] for details.

#### B. Dislocation core structure and Peierls stress under strain

The dislocation core structure governs the dislocation mobility and ultimately the mechanical strength and ductility of materials. For instance, the planar core of dislocations in hcp and fcc metals determines their plastic flow propagation following the Schmid law, while the compact nonplanar core of bcc metals is known to be responsible for their violation of the Schmid law, exhibiting a tendency to three-way nonplanar

TABLE IV. The geometrical parameters of dislocation core structure and the calculated Peierls stress ( $\tau_P$ ) in MPa of pure Mg and Mg alloys together with other predictions from the literatures at equilibrium (with  $\Delta V/V = 0.00$ ).

Solute	$d_x/b$	$w_x/b$	$d_z/b$	$w_z/b$	$ au_{ m P}$	NOTE
Mg	7.50	0.54	7.56	0.58	8.40	This work, DFT
C	7.00	0.68	7.18	0.60	1.15	Ref. [17], DFT
					6.73 <sup>a</sup>	Expt., [68]
	3.06	0.45	2.90	0.38	22.9	Ref. [17], EAM
Al	9.74	0.54	9.79	0.58	3.94	This work, DFT
Zn	7.60	0.56	7.65	0.62	2.61	This work, DFT
	6.94	0.64	7.11	0.52	2.53	Ref. [17], DFT

<sup>a</sup>This experimental value is based on yield stress data at 0 K.

dissociation or polarization, implying a large Peierls stress that makes the screw dislocations difficult to move [63,64]. In addition, the core structure of misfit dislocations at heterostructure interfaces has also been found by MD simulations to play a critical role in determining dislocation nucleation and dissociation, transmission of lattice dislocations across the bimetal interface, and the interfacial sliding [65–67]. In terms of tuning the dislocation core structure, both experiments and theoretical investigations [63] have shown that not only the impurities or alloying elements but also an application of external stresses can significantly alter the dislocation core structure and consequently, its properties. However, although there have been some DFT studies of the Peierls barrier for various metals, they have been limited to zero-stress situations and do not provide information about the stress dependence of the Peierls potential. Therefore, in this section, we shall take Mg and Mg alloys as illustrations to show the significant strain effect on dislocation core structures and Peierls stresses.

We begin with the calculations of the dislocation core structure at equilibrium  $(\Delta V/V = 0.00)$  by means of the semidiscrete variational PN model as described in Sec. II. Figure 2 presents the calculated dislocation core structures at equilibrium of pure Mg and Mg alloys with both edge and screw components; the calculated dislocation core structure parameters  $(d_x, d_z, w_x, \text{ and } w_z)$  at equilibrium are provided in Table IV, showing good agreement with previously reported experimental and theoretical values [17,68]. It is seen that the derived values of  $d_x/b$  are almost equal for pure Mg (7.50) and the Mg-Zn alloy (7.60), but they are much smaller than that of the Mg-Al alloy (9.74). Such a difference can be attributed to the lower value of the stable SFE  $\gamma_{I_2}$  for the Mg-Al alloy (22.50 mJ/m<sup>2</sup>) as compared to those for pure Mg (33.85 mJ/m<sup>2</sup>) and Mg-Zn alloy (31.64 mJ/m<sup>2</sup>) (see Table III).

We next study the effect of strain on the dislocation core structure, and the calculated results for pure Mg are presented in Fig. 4. The relevant key points are summarized below:

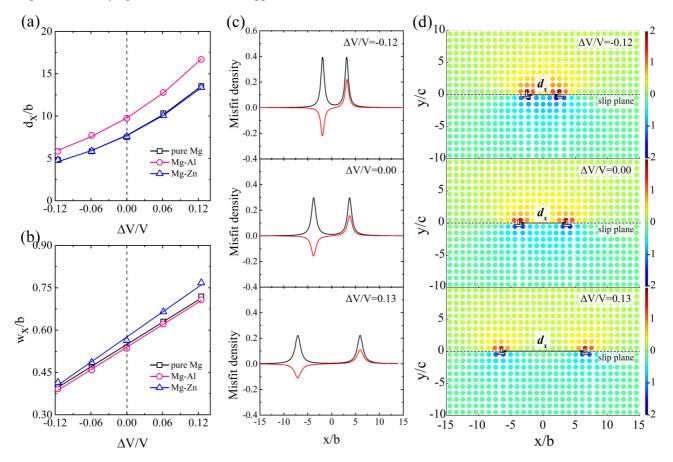


FIG. 4. The (a) distance  $(d_x/b)$  and (b) width  $(w_x/b)$  of the edge components of a dislocation under different volumetric strains. (c) The misfit density and (d) the pressure field (in GPa) produced by the dislocation under different volumetric strains. It is seen that under volumetric strain in dilatation or compression, the variation of  $d_x/b$  with respect to the strain follows the exponential function, while the calculated value of  $w_x/b$  is linearly dependent on the applied volumetric strain.

(a) Under volumetric strain in dilatation or compression, the variation of  $d_x/b$  with respect to the strain follows an exponential function as  $d_x/b = A \exp(\alpha \Delta V/V)$ , where A = 7.729 and  $\alpha = 4.49$  [see Fig. 4(a)].

(b) There are linear relationships between the calculated value of  $w_x/b$  and the applied volumetric strain with a proportional slope of  $d(w_x/b)/d(\Delta V/V) = 1.32$  [see Fig. 4(b)].

In an illustrative atomic-scale representation, Figs. 4(c) and 4(d) present the misfit densities and the pressure fields around dislocation cores [69] under various volumetric strains, respectively. As defined in Ref. [69], the pressure field around dislocation cores is expressed that

$$p(x,y) = -\frac{G(1+\nu)}{3\pi(1-\nu)} \sum_{i=1}^{2} \frac{b}{2} \frac{y + \operatorname{sgn}(y)w_e}{(x-d_{ei})^2 + [y + \operatorname{sgn}(y)w_e]^2},$$
(8)

where  $d_{e1} = d_x/2$ ,  $d_{e2} = -d_x/2$ ,  $w_e = w_x$ , G is the shear modulus, and  $\nu$  is the Poisson ratio. The atoms shown in Fig. 4(d) are color coded to distinguish the localized stress around the dislocation core. It is clearly seen that two partial dislocations (denoted by "L") are separated by a planar stacking fault in between. A large strain dependence is found for the dislocation core parameters, ranging from 4.82 to 16.67 for the stacking fault width  $d_x/b$  and from 0.41 to 0.77 for the partial core width  $w_x/b$ ; these ranges are almost equal to those reported for 20 different Mg alloys at equilibrium (3.03-19.18 for  $d_x/b$ , and 0.55–0.72 for  $w_x/b$  [17]), indicating that strain has an even equally profound effect on the dislocation core structure with the chemical effect of solutes. Such results suggest potential foundations for the modification of strength and ductility of Mg and Mg-based alloys by strain engineering, i.e., preparing Mg alloys at different strain states. For instance, Yamashita et al. [70] verified experimentally that severe plastic deformation can improve the mechanical properties (e.g., strength and ductility) of Mg alloys. Therefore, it is expected that severe plastic deformation with specific constraint may provide an effective solution of strain engineering to improve the mechanical properties of Mg alloys.

As described in Sec. II C and illustrated in Fig. 5(a), the Peierls stress is defined as the critical resolved shear stress for a dislocation moving through the lattice from one symmetrical configuration to another equivalent symmetrical configuration [56,57,71]. Figure 5(b) presents our calculated dependence of the Peierls stresses of pure Mg and Mg alloys under volumetric strain. The logarithm of the Peierls stress  $\ln(\tau_P)$  of pure Mg and Mg alloys shows a linearly decreasing trend with increasing strain, following a slope of  $d[\ln(\tau_P)]/d(\Delta V/V) =$ -18.74 for pure Mg. Therefore, the Peierls stress  $\tau_P$  can be approximated as an exponential relationship with the volumetric strain, and a general conclusion can be drawn for the strain effect on Peierls stress such that a compressive strain leads to a strain strengthening effect, while a tensile strain causes strain softening.

Under volumetric compression, the Peierls stress of the dislocation lying in the basal plane increases, which may eventually promote the activation of nonbasal slip systems and consequently ductilize Mg and Mg alloys. These conclusions agree well with the experimental observations that the

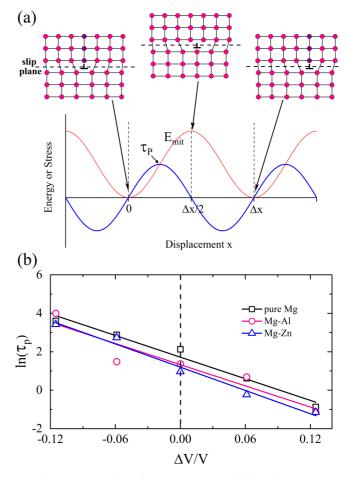


FIG. 5. (a) A schematic to represent the dislocation movement from one symmetrical configuration to another equivalent symmetrical configuration. (b) The logarithm of Peierls stress under different volumetric strains for pure Mg and Mg alloys, which shows a linearly decreasing trend with increasing strain.

nonbasal slip systems can be activated by hydrostatic pressure [24–26]. Although the strain effect on the Peierls stress is found to be far more profound than the chemical effect of solutes by the analysis of data published in Ref. [17], we would like to emphasize that both the strain strengthening and solute strengthening play important and potentially complementary roles in strengthening and ductilizing Mg alloys, since the solute atoms may provide an additional "pinning" effect due to the solute/dislocation interactions [18].

## C. Electronic origin of the strain effects

Based on previous studies [8–12], it is believed that the charge density distributions could provide a physical explanation for the SFEs of pure Mg and Mg alloys. To clarify the strain effect on the polarization and charge transfer, we have calculated the valence charge density difference (VCDD), which is defined as

$$\Delta \rho(Mg_{47}X) = \rho_{sc}(Mg_{47}X) - \rho_{nsc}(Mg_{47}X), \qquad (9)$$

where  $\rho_{sc}(Mg_{47}X)$  is the charge density after reaching electronic self-consistency, and  $\rho_{nsc}(Mg_{47}X)$  is the charge density prior to electronic self-consistent calculation, i.e., representing a summation of atomic charge densities (or the noninteracting

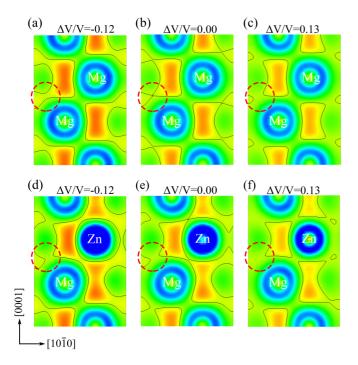


FIG. 6. Contour plots of the valence charge density difference (VCDD) of pure Mg and Mg-Zn alloy under the volumetric strains: (a, d)  $\Delta V/V = -0.12$ , (b, e)  $\Delta V/V = 0.00$ , and (c, f)  $\Delta V/V = 0.13$ , respectively. The unit of VCDD is electrons/Bohr<sup>3</sup>, and the thin black line corresponds to the isosurface of 0.001 8 electrons/Bohr<sup>3</sup>. It is illustrated that the charge density decreases with the increasing volumetric strain at hollow sites (indicated by the red dashed circles).

charge density). Figures 6(a)-6(c) illustrate the VCDDs of pure Mg under different volumetric strains. It is seen that the charge density decreases with the increasing volumetric strain at hollow sites (indicated by the red dashed circle in Fig. 6), which may provide a basis for the effect of strain on SFEs, as the denser VCDD produces a stronger bonding of Mg-Mg [8].

To underline the strain effect of Mg alloys, Fig. 6 also presents the calculated VCDDs of Mg-Zn (Fig. S3 for Mg-Al in Supplemental Material [36]) under different volumetric strains. It can be seen that under the volumetric strain, the VCDD decreases with increasing strain for both Mg-Zn and Mg-Al alloys at hollow sites, producing a same effect on the Mg alloys as on pure Mg. By comparing the VCDDs of pure Mg and Mg alloys at the unstrained state ( $\Delta V/V = 0.00$ ), it is found that Zn and Al solute atoms decrease the VCDD at the circled region in red, being responsible for the lower value of SFEs for the Mg-Zn and Mg-Al alloys as compared to those of pure Mg (see Table III). By comparing the chemical effect of solute and the strain effect on the VCDD, it can be concluded that the chemical effect may effectively change the shapes of the VCDD isosurface, while the strain effect will enhance the magnitude of the isosurface, indicating a general rule that a higher SFE corresponds to more profound electronic polarization induced by compressive strain.

# **IV. DISCUSSION**

In general, the solute strengthening provides an effective strengthening pathway for the development of novel Mg alloys which can potentially resolve the trade-off dilemma between strength and ductility and the poor workability and formability. In Mg alloys, solute atoms can disturb the charge density ("chemical factor") and produce a local strain field ("strain factor") due to the different atomic radii between Mg and solute atoms, which are two supposed reasons for the solute effect on the SFEs. The local strain caused by solute atoms is equivalent to the external strain by changing the lattice geometry. For example, Liu and Li [12] found that the activation of slip systems is closely related to the change of the local ratio of c/a by different solute elements, being responsible for the solute strengthening and/or ductilizing. Shang et al. [8] has recently found an approximate linear relationship between the SFEs and the equilibrium volumes of Mg alloys by different alloying elements, which raises an interesting question as to whether the change of SFEs can be partially attributed to the strain effect. Our results, that a local compressive strain will promote larger SFEs whereas lattice dilatation will generate smaller SFEs, provide a view on the contribution to SFEs by solute introduction.

Although the study of the strain effect on the SFEs could offer insights into the "strain factor" of the solute effect on the SFEs and the mechanism of solute strengthening as the size misfit in the model of solute strengthening [18,69,72], thus far, however, the effect of an external strain has been absolutely ignored. As seen in the preceding sections, an external strain plays an important role with regard to the SFEs and dislocation core structures. The strain effect cannot be ignored in experimentally achievable strains such as under high pressure, in high strain rate deformation, shock loading [73], and severe plastic deformation processing. For example, the effect of superhigh pressure on the mechanical properties of Mg alloys has been studied experimentally, with a maximum pressure of 6 GPa [31,32]. At such high strain, the SFEs can change by  $\sim 40\%$  relative to those at zero strain, which consequently produces an ~340% increase of Peierls stress from 8.4 MPa to 36.7 MPa, and an  $\sim$ 30% variation of the dislocation core structure.

As shown in Fig. 7(a), a strong inverse relationship between  $d_x/b$  and the stable SFE  $\gamma_{I_2}$  is found for Mg and Mg alloys. However, it is not a simple linear relationship, as proposed for fcc metals in Refs. [74] and [75] using a DFT-informed phase field dislocation dynamics model. The correlation fits well with the exponential function as

$$d_x/b = A \cdot \exp\left(-\alpha \gamma_{I_2}\right) + B \cdot \exp\left(-\beta \gamma_{I_2}\right), \quad (10)$$

where  $A = 23.92, B = 0.09051, \alpha = -0.03841$ , and  $\beta = 0.05522$ . Meanwhile an inverse linear relationship between the logarithm of the Peierls stress  $\ln(\tau_P)$  and the dislocation width  $(w_x/b)$  [Fig. 7(b)] is obtained by fitting the formula

$$\ln(\tau_P) = Aw_x/b + B,\tag{11}$$

where A = -13.73 and B = 9.031. This provides a variant of the well-known formula  $\tau_P = A \exp(-\alpha \xi/b)$  [56], where A and  $\alpha$  are constants and  $\xi$  is the dislocation half-width and approximately equal to the  $w_x$  in Eq. (11). Furthermore, the value of  $w_x/b$  is found to have a strong correlation with the unstable SFE  $\gamma_{UI_2}$  [Fig. 7(c)], and the fitting function for Mg

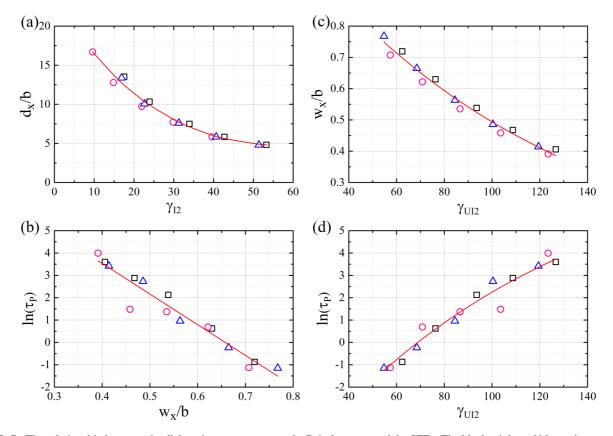


FIG. 7. The relationship between the dislocation core structure, the Peierls stress, and the SFEs. The black, pink, and blue points correspond to pure Mg, Mg-Al alloy, and Mg-Zn alloy, respectively, and the red solid lines are calculated by the relationships Eqs. (10)–(13), indicating that there are general exponential relationships between the dislocation core structure, the Peierls stress, and the stable or unstable SFEs.

and Mg alloys is generally expressed as

$$w_x/b = A \cdot \exp\left(-\alpha \gamma_{UI_2}\right),$$
 (12)

where A = 1.24 and  $\alpha = -0.00921$ . This logarithm of the Peierls stress  $\ln(\tau_P)$  can also show an exponential correlation with the unstable SFE  $\gamma_{UI_2}$  [Fig. 7(d)], and the formula is obtained as

$$\ln(\tau_P) = A \cdot \exp\left(-\alpha \gamma_{UI_2}\right) + B, \tag{13}$$

where A = -17.03, B = 9.031, and  $\alpha = -0.00921$ . With these relationships, one may simply predict the Peierls stress of Mg alloys even under strain. It is generally accepted that Mg alloys with high basal and low nonbasal unstable SFEs will have higher both strength and ductility than those of pure Mg, because the high and low Peierls stresses on the basal plane and on nonbasal planes, respectively, will benefit the activation of the nonbasal slip system, aiding both strengthening and ductilizing of Mg alloys.

In summary, the effect of strain on the SFEs, dislocation core structure, and Peierls stress can be particularly important for understanding the mechanical behavior of metals in highpressure experiments, severe plastic deformation, and shockloading conditions [73]. Therefore, our results may provide an additional contribution and pathway to solve the tradeoff between strength and ductility based on the dependence of SFEs on external parameters such as strain.

# **V. CONCLUSIONS**

We have performed comprehensive investigations of the effect of volumetric strain on the SFEs, dislocation core structure, and Peierls stress of Mg and Mg alloys based on DFT calculations and the semidiscrete variational PN model. The results are summarized as follows:

(1) Strain can affect the values of SFEs, making them either larger or smaller, and thus changing the twinnabilities of pure Mg and Mg alloys. The SFEs and twinnability of Mg-Zn and Mg-Al alloys will be changed by volumetric strain in a similar manner to pure Mg.

(2) In general, a narrow (wide) dislocation core will decrease (increase) the mobility of dislocation. The dislocation core structure and Peierls stress may be significantly modified by strains as the SFEs vary, which could promote the activation or operation of a nonbasal slip system, in agreement with experimental results.

(3) Besides external strain, the strain may also be imposed by the introduction of solute atoms in experiments; therefore the strain effect on the SFEs found in the present study may provide a view of the "strain factor" of the solute effect by the introduction of local strain fields that was assumed based on experimental observations.

(4) General exponential relationships are proposed between the dislocation core structure, the Peierls stress, and the stable or unstable SFEs, which provides a foundation for further experiments. For instance, the separation distance between two partials shows a universal exponential relationship with the stable SFE  $\gamma_{I_2}$ , while the Peierls stress is exponentially dependent on the unstable SFE  $\gamma_{UI_2}$ .

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