

# Impact of Organic Spacers and Dimensionality on Templating of Halide Perovskites

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ABSTRACT: Two-dimensional (2D) halide perovskites (HPs) are promising materials for various optoelectronic applications; yet, a comprehensive understanding of their dynamics is still elusive. Here, we offer insight into the dynamics of prototypical 2D HPs based on MAPbI<sub>3</sub> as a function of linker molecule and the number of perovskite layers using atomic-scale simulations. We show that the layers closest to the linker undergo transitions that are distinct from those of the interior layers. These transitions can take place anywhere between a few tens of Kelvin degrees below and more than 100 K above the cubic–tetragonal transition of bulk MAPbI<sub>3</sub>. In combination with the thickness of the perovskite layer, this enables one to template phase transitions and tune the dynamics over a wide



temperature range. Our results thereby reveal the details of an important and generalizable design mechanism for tuning the properties of these materials.

#### INTRODUCTION

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Halide perovskites (HPs) are a promising class of materials for various applications, including, e.g., high-efficiency solar cells,<sup>1-3</sup> lasers<sup>4</sup> and light-emitting diodes.<sup>5</sup> The most-studied so far are the regular three-dimensional (3D) HPs with the formula AMX<sub>3</sub>, where A is an organic or inorganic cation, M is a metal cation, such as Pb or Sn, and X is a halogen. One of the drawbacks of these compounds is that they often exhibit relatively low stability. In recent years, so-called two-dimensional (2D) HPs (also referred to as layered, quasi-2D, or Ruddlesden-Popper phases)<sup>6</sup> have, however, gained significant attention.<sup>7–11</sup> These materials are composed of inorganic perovskite layers stacked on top of each other and separated by organic cations that act as spacers (Figure 1).<sup>12–17</sup> They have been shown to exhibit improved stability<sup>18–27</sup> and distinct quantum and dielectric confinement effects, 28-30 which modulate their excitonic properties,<sup>31-33</sup> differentiating them from their 3D counterparts. In combination with their tunability,<sup>34,35</sup> this makes 2D HPs highly attractive for various optoelectronic applications.<sup>20,35–39</sup>

The properties of 2D HPs sensitively depend on the number and type of inorganic layers and the organic cations that connect them.<sup>10,14,41-43</sup> The inorganic layers are responsible for the electronic structure<sup>44-46</sup> and mechanical properties of the material, while the organic cations affect the interlayer spacing, as well as the overall stability and structure. Therefore, understanding the interplay of inorganic layers and organic



Figure 1. PEA-based 2D HP phases with the composition  $PEA_2MA_{n-1}Pb_nI_{3n+1}$  for n = 2, 3, and 4 layers. For n > 2, H and I atoms are omitted for the sake of clarity. The structures were rendered using OVITO.<sup>40</sup>

cations is crucial for designing efficient and stable optoelectronic devices based on these materials. This is evident in the so-called "templating" approach.<sup>47–51</sup> This strategy relies on the fact that the organic linkers can significantly affect the phase of the inorganic framework beyond the surface layer, which can be used to improve the stability of the desired 3D

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© XXXX The Authors. Published by American Chemical Society perovskite phases. To be able to fully exploit the potential of this approach, however, it is necessary to understand the precise mechanisms by which organic cations influence the inorganic framework.

Here, we offer comprehensive insight into how phase transitions and dynamics in 2D HPs can be steered through the choice of the organic linker molecule and the dimensionality of the material. This is accomplished through atomic-scale simulations,<sup>52,53</sup> based on accurate and efficient machine learning potentials (MLPs) via the neuroevolution potential (NEP) approach<sup>53-60</sup> trained against density functional theory (DFT) calculations $^{61-66}$  (Section S1). We first focus on the prototypical combination of the linker molecule phenylethylammonium  $C_6H_5(CH_2)_2NH_3$  (PEA) with MAPbI<sub>3</sub><sup>11,16,67,68</sup> and identify a transition from a hightemperature structure without global octahedral tilting to a lower temperature structure with a global out-of-phase octahedral tilting pattern. The perovskite layer in direct contact with the PEA molecules (referred to as the "surface layer" below) undergoes a transition already between 450 and 470 K, while the transition in the interior of the perovskite slab occurs at a temperature that is at least 50 K lower. The combination of these two processes yields a rather broad overall transition, which approaches the transition temperature of bulk MAPbI<sub>3</sub> only for relatively thick inorganic layers comprising at least 30 or more perovskite layers. To generalize the effect of the linker molecule on the local phase transitions, we then extend the analysis to additional molecules, including phenylmethylammonium C<sub>6</sub>H<sub>5</sub>(CH<sub>2</sub>)NH<sub>3</sub> (PMA), butylammonium  $CH_3(CH_2)_3NH_3$  (BA) and methylammonium  $CH_3NH_3$  (MA). We find that for bulkier molecules such as PEA and PMA, the surface layer transitions significantly above the bulk MAPbI<sub>3</sub> transition, while with the smallest molecule, MA, this transition occurs at a lower temperature. Our results thereby provide an atomic-scale understanding of how linker and dimensionality can be used to template phase behavior and dynamics in 2D HPs. Since octahedral tilting is intimately tied to the electronic structure,  $^{69-72}$  our results reveal the details of an important and generalizable design mechanism for tuning the optoelectronic properties of 2D HPs.

#### THERMODYNAMIC PROPERTIES

We consider a series of 2D HPs assembled from inorganic PbI<sub>6</sub> octahedral units with MA counterions and PEA linker molecules with the chemical formula PEA<sub>2</sub>MA<sub>*n*-1</sub>Pb<sub>*n*</sub>I<sub>3*n*+1</sub>, where *n* is the number of *perovskite* layers in each inorganic layer (Figure 1). In the bulk limit  $(n \rightarrow \infty)$  one obtains MAPbI<sub>3</sub>, which is one of the most widely investigated 3D HPs. We only consider systems with  $n \ge 2$ , since, in the single perovskite layer limit (n = 1), we do not observe an untilted inorganic layer, even at 600 K.

First, we analyze the potential energy, the heat capacity, and the lattice parameters during cooling simulations (Figure 2). The potential energy of MAPbI<sub>3</sub> shows a small but clear step at 370 K, corresponding to the latent heat associated with its firstorder transition from a cubic  $a^0a^0a^0$  phase to a tetragonal  $a^0a^0c^-$  phase (Figure 2a).<sup>60</sup> This gives rise to a sharp peak in the heat capacity at the transition temperature (Figure 2b). Additionally, the transition can be seen as a clear change in the two in-plane lattice parameters (tilting is around the out-ofplane axis; see Figure 2c) and even the out-of-plane lattice parameter (Figure S5). The simulations yield a transition



Figure 2. Thermodynamic observables as a function of temperature from cooling simulations. (a) Potential energy (with  $1.5k_BT$ and arbitrary reference energy subtracted) for a series of 2D HPs with composition PEA<sub>2</sub>MA<sub>n-1</sub>Pb<sub>n</sub>I<sub>3n+1</sub>, which yields MAPbI<sub>3</sub> in the bulk limit ( $n \rightarrow \infty$ ). (b) Heat capacity of the system obtained as  $C_p$ = dE/dT. (c) In-plane lattice parameters. For MAPbI<sub>3</sub>, this corresponds to the *a* and *b* lattice parameters and the tilting in the  $a^0a^0c^-$  phase occurs around the *z*-axis. The potential energy (and heat capacity) shown here are represented by fits to the raw data show in Figure S3.

temperature for MAPbI<sub>3</sub> of 370 K, which is ~40 K higher than the experimental value of ~330 K.<sup>13,73</sup>

Comparable transitions are observed in 2D HPs. For smaller numbers of inorganic layers (n), the transition is more gradual and occurs at higher temperatures, but it becomes more pronounced as n increases, converging toward the behavior observed in MAPbI<sub>3</sub> as n increases. This shows that the nature of the phase transition evolves from a continuous transition to a first-order transition.

#### OCTAHEDRAL TILTING

To obtain a more-detailed understanding of the transitions, we compute  ${}^{40,74-79}$  (Section S1.5) the distribution over octahedral tilt angles  $P(\theta)$  along the cooling simulations (Figure 3). The tilt angle distribution for a given temperature is averaged over a few snapshots corresponding to a temperature window of ~1 K in order to improve the statistics.

For bulk MAPbI<sub>3</sub> one observes a sharp transition at 370 K from a single Gaussian peak centered around zero corresponding to a cubic phase  $(a^0a^0a^0)$  to a symmetric bimodal distribution indicating the transition to a structure with out-of-phase tilting  $(a^0a^0c^-;$  Figure 3, bottom panel).

For the 2D HPs, we can resolve the tilt angle distribution for each symmetrically distinct perovskite layer throughout the structure. This analysis reveals that the perovskite layer that is in direct contact with the PEA linker molecules (the "surface layers") undergoes a transition to a tilted structure that for, e.g.,



Figure 3. Distribution over the octahedral tilt angles  $P(\theta_z)$  as a function of temperature for 2D HP PEA<sub>2</sub>MA<sub>n-1</sub>Pb<sub>n</sub>I<sub>3n+1</sub> with n = 8, as well as the corresponding 3D HP (MAPbI<sub>3</sub>). For the 2D HP, the tilt angle distribution is decomposed by a perovskite layer, where layer 1 refers to the perovskite layer closest to the organic linker molecule.

n = 8, occurs at ~450 K (Figure 3; top panel). In contrast, the interior perovskite layers undergo a transition at a much lower temperature, i.e., closer to the bulk MAPbI<sub>3</sub> transition temperature, e.g., at ~400 K for n = 8. It is worth noting that the transition in the surface layers has almost no impact on the tilting in the neighboring layer (layer 2 in Figure 3; also compare Figures 4b and 5b). We attribute this behavior to the

octahedra rotating around the z-axis, leading to a weak correlation between neighboring octahedra in the z-direction.  $^{74,76}$ 

At high temperatures, for which no global tilting pattern occurs, the tilt angle distributions are unimodal and well described by Gaussians with a zero mean. The width of the distribution is, however, wider for the surface layers compared to the rest of the layers, indicating a softer free energy landscape. Furthermore, at low temperature, for which all octahedra exhibit a tilt, the surface layers show slightly larger tilt (Figure S6). Both of these observations are consistent with the surface layers exhibiting a higher transition temperature.

#### PHASE DIAGRAM

The spatial variation of the evolution of octahedral tilts means that the PEA-based 2D HPs internally undergo two transitions that can be observed separately in our simulations. The first one is associated with the tilting of the octahedra in the *surface* layer, while the second is related to the tilting of the *interior* layers. Extending the tilt-angle analysis for *n* ranging from 2 to 50 allows us to obtain the variation of the two transition temperatures with *n* (Figure 4). (For a brief discussion of the uncertainties in the transition temperatures, please see Section S3.) This shows that the transition in the surface layer depends only weakly on *n*, varying from 470 K (*n* = 2) to about 450 K (large-*n* limit). The transition in the interior, which can be identified only for  $n \ge 4$ , exhibits a more pronounced dependence on *n* starting at ~410 K for n = 4 and converging to the bulk MAPbI<sub>3</sub> value of 370 K in the large-*n* limit.

The different structure of the surface layer compared to the interior resembles surface (interface) phases, also referred to as complexions.<sup>80,81</sup> This type of surface phases can be understood from a simplified thermodynamic viewpoint using surface and interface free energy ( $\gamma$ ) values.<sup>82</sup> In this view, the observation described above suggests that the effective interface free energy between the cubic (untilted) phase and the organic linkers ( $\gamma_{cub/PEA}$ ) is larger than the sum of the interface energy between the tetragonal (tilted) phase and the organic linkers ( $\gamma_{cub/tet}$ ), and that between the tetragonal and cubic phases ( $\gamma_{tet/PEA}$ ), i.e.,  $\gamma_{cub/PEA} > \gamma_{cub/tet} + \gamma_{tet/PEA}$ .



Figure 4. Time-averaged snapshots from the cooling simulations for the 2D HP PEA<sub>2</sub>MA<sub>n-1</sub>Pb<sub>n</sub>I<sub>3n+1</sub> with n = 6 at (a) 500 K, (b) 430 K, and (c) 330 K visualized using OVITO.<sup>40</sup> Here, H atoms as well as the MA counterions inside the perovskite layers are omitted for the sake of clarity. The color coding of the octahedra indicates the rotation angle around the *z*-axis,  $\theta_{zz}$  with red and blue indicating negative and positive tilting (ranging from  $-20^{\circ}$  to  $20^{\circ}$ ), respectively, while gray implies tilt angles close to zero. For 330 K, a stacking fault (antiphase boundary) is formed as highlighted by the green ellipsoid. (d) Transition temperatures as a function of number of layers *n* with the heat capacity (Figure 2), shown as a heatmap.



Figure 5. (a) Transition temperatures as a function of the number of layers *n* for (b) PEA, (c) PMA and (d) BA-based 2D HPs, as well as (e) MAPbI<sub>3</sub> surfaces. Triangles and circles indicate the transition temperatures for the surface and interior layers, respectively. The star indicates the cubic-tetragonal phase transition temperature for bulk MAPbI<sub>3</sub>. (b–e) Average atomic configurations at 430 K (top) and 340/360 K (bottom). Red and blue octahedra indicate negative and positive tilt angles (ranging from –20 to 20°), respectively, whereas gray implies tilt angles close to zero. Arrows indicate the tilt axis, which is out-of-plane for PEA and MAPbI<sub>3</sub> surfaces with less than 14 layers, and in-plane for the other systems. Lines in (a) serve as a guide for the eye.

In our simulations, the tilting of the two surface layers on the opposite sides of the inorganic slab is not correlated with each other at the upper transition temperature and can thus occur by chance in-phase or out-of-phase. For the out-of-phase tilting pattern  $(a^0a^0c^-)$  to be commensurate with both surface layers, the latter need to tilt out-of-phase or in-phase, with respect to each other for an even and odd number of layers, *n*, respectively. As a result, antiphase boundaries can be expected to appear with 50% probability at nucleation time and are commonly observed in our simulations (Figure 4). In some cases, we observe such defects to anneal out already on the time scale of our simulations. Under experimental settings, one can therefore assume that such defects typically anneal out and are only present in small concentrations.

Lastly, we look at the ordering of the linker molecules. The two layers of PEA forming a single organic spacer layer are always rotated  $180^{\circ}$  around the z-axis, relative to each other (Figure 1). In addition, we observe that the different spacer layers can take on arbitrary 90 and  $180^{\circ}$  rotations around the z-axis (see e.g., Figure 4). This leads to the in-plane lattice parameters being equal (Figure 2). Reorientation and rotation of the spacer layers mainly take place during the equilibration part of the simulations, and appear to occur statistically. The orientation subsequently remains largely unaffected as temperature is reduced.

#### ■ IMPACT ON THE ELECTRONIC STRUCTURE

The differences in the local structures in the interior and surface layers can be expected to affect the electronic properties of 2D perovskites. This is confirmed by an analysis of the spatial distributions of valence band maximum and conduction band minimum states using DFT calculations<sup>83,84</sup> (Section S4) from (MD) snapshots sampled below the lower transition (330 K), above the higher transition (530 K), and between the two transitions (430 K; compare Figure 4a–c).

The results show that at the lowest temperature (330 K), when both surface and interior layers are tilted, the valence band maximum (VBM) is localized in the middle layers, while at higher temperatures, the VBM does not preferentially localize in either type of layer. The conduction band minimum

(CBM) on the other hand exhibits a strong preference to localize in the outermost layers at both the lower and intermediate temperatures, when these layers are tilted. Above the higher transition when all layers exhibit cubic symmetry, on average, the probability of finding the CBM in the middle of the perovskite slab increases. These results suggest a close relationship between the atomic scale dynamics of 2D perovskites and the electronic properties, in particular with respect to charge transport and separation, and call for further analysis in future studies.

#### EXTENSION TO OTHER SYSTEMS

Now that we have seen how PEA templates the phase transition in the perovskite layers, it is instructive to extend the analysis to other linker molecules. To this end, we consider 2D HPs based on PMA and BA, as well as MA-terminated surfaces, specifically,  $\{001\}$  slabs of MAPbI<sub>3</sub> with MAI<sub>2</sub> termination (Figure 5).

For PMA, the behavior is qualitatively similar to that of PEA (Figure S7), i.e., a transition of the octahedral tilting pattern occurs in the surface layer at a temperature  $\sim 100$  K higher than in the interior, albeit with a stronger dependence on the number of layers for the interior transition. Unlike the case of PEA for which we found tilting with respect to the out-of-plane axis (z), with PMA we obtain tilting around one of the in-plane axes (x or y).

For both PEA and PMA, we observe that the transition temperature for the interior increases notably with decreasing number of layers, approaching the transition temperature for the surface for the thinnest slabs considered here. This reflects the increasing relative weight of the surface layer compared to the rest of the system as n decreases. Similarly in the limit of large n, the interior transition temperature approaches that of bulk MAPI<sub>3</sub>.

We also note that, in the case of PMA we observe almost no antiphase boundaries. We suggest this to be due to the stronger octahedral correlation *perpendicular* compared to *along* the rotational axis, as previously reported in bulk HPs.<sup>74,76</sup> This likely leads to a stronger driving force for the (re)orientation of

perovskite layers which is needed to avoid or anneal out antiphase boundaries.

By contrast, in the case of **BA**, we observe no separation in temperature between the onset of tilting at the surface and the interior. Rather, there is just one transition that for the smallest n is barely 10 to 20 K higher than the phase transition temperature for bulk MAPbI<sub>3</sub> with a very weak dependence on the number of layers. Similarly to the case of PMA, for BA the tilting occurs around one of the in-plane axes. We note that one can observe a secondary transition associated with the motion and ordering of the BA linker molecules themselves (Figure S10). At higher temperatures the BA molecules move much more freely than PEA and PMA,<sup>44</sup> and are on average oriented perfectly perpendicular to the perovskite layers. Below 300 K this motion is, however, frozen out and the BA molecules become significantly stiffer, in qualitative agreement with the results for n = 1 reported in ref 44.

For the MAPbI<sub>3</sub> surface, we observe two different types of behavior. For thicker slabs (n > 14), the topmost (surface) layer undergoes a transition at a lower temperature than the interior region, thus exhibiting the opposite behavior, compared to PEA and PMA. On the other hand, for thinner slabs (n < 14), the surface transition can no longer be separated from the transition in the interior of the slab. This can be at least partly explained by the transition temperature for the interior layers decreasing with the number of layers which causes the surface-to-interior ratio to increase. We also also observes a qualitative difference in the tilt pattern between thicker and thinner slabs as the former exhibit tilting with respect to the out-of-plane axis while for the latter tilting occurs with respect to one of the in-plane axes. This behavior suggests that the balance between surface and bulk energetics plays a key role here. While resolving the mechanism is beyond the scope of the present work it is deserving of a more in-depth analysis in future studies.

In terms of the thermodynamic viewpoint discussed above, these trends indicate that the PEA and PMA organic spacers have a favorable interaction with a tilted compared to an untilted perovskite layer, whereas for the MAPbI<sub>3</sub> surface, the opposite is true. We also note that a tilted/untilted interface along the z-direction when the tilting occurs around the x or y-axis likely has a larger interface energy compared to if the tilting occurs along the z-direction. This simple observation agrees with the fact that most cases without a surface phase transition have octahedral tilting around the x or y-direction (Figure 5).

To summarize, our analysis indicates that tilting behavior of the surface layer in 2D MAPbI3-based perovskites, i.e., the softness of the rotational energy landscape of the octahedra, can be altered and controlled through the choice of the organic linker molecule. For the bulkier molecules, PEA and PMA, we find that the surface layer transitions at a considerably higher temperature than bulk MAPbI<sub>3</sub>, whereas for the smallest molecule considered here, MA, we rather observe the surface transition to occur at a *lower* temperature than in the bulk. This leads to a transition temperature for the interior that decreases and increases with the number of layers for PEA/PMA and MA, respectively. For BA an intermediate behavior is observed, i.e., no separate transition for the surface layer. These results thus provide guiding principles for how both dimensionality (through the number of layers n) and chemistry (through the organic linkers) can be used to systematically tune the structural transitions and consequently the inorganic dynamics of the

system. Both of these are directly tied to enhanced electronphonon coupling, which is at the heart of the outstanding optoelectronic properties of these materials. The present insight is thereby of immediate interest for designing 2D HP materials and devices for specific applications and temperature ranges.

#### ASSOCIATED CONTENT

#### **Data Availability Statement**

The DFT data and NEP model generated in this study are publicly available via Zenodo at 10.5281/zenodo.11120638.

#### **Supporting Information**

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acsenergylett.4c01283.

Description of the computational methods, additional analysis of cooling simulations, transitions in additional systems, and the impact of atomic scale dynamics on the electronic structure including supporting figures (PDF)

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#### Notes

The authors declare no competing financial interest.

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# **Supplemental Material:**

# Impact of Organic Spacers and Dimensionality on Templating of Halide Perovskites

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# S1 Computational Methods

### S1.1 Structures considered

The PEA-based 2D halide perovskites (HPs) have a composition of  $PEA_2MA_{n-1}Pb_nI_{3n+1}$  where n corresponds to the number of perovskite layers. Starting from known prototypes for  $n = 1^{1-4}$ , we construct structures with n > 1 by inserting the required number of perovskite layers (Fig. 1). These structures are then equilibrated by molecular dynamics (MD) simulations at 600 K to remove structural bias before the cooling simulations. This approach is also employed for phenylmethylammonium  $C_6H_5(CH_2)NH_3$  (PMA) and butylammonium  $CH_3(CH_2)_3NH_3$  (BA) using the prototype structures from Refs. 1,2,5.

### S1.2 Density functional theory calculations

Energies, forces and virials were obtained for the training structures via density functional theory (DFT) calculations as implemented in the Vienna ab-initio simulation package<sup>6–8</sup> using the projector augmented wave method<sup>9,10</sup> with a plane wave energy cutoff of 520 eV and the SCAN+VV10 exchange-correlation functional<sup>11</sup>. The Brillouin zone was sampled with automatically generated  $\mathbf{k}$ -point grids with a maximum spacing of 0.25 Å<sup>-1</sup>.

### S1.3 NEP model

We constructed a neuroevolution potential (NEP) model using the iterative strategy outlined in Ref. 12 using the GPUMD<sup>13-15</sup> and CALORINE packages<sup>16</sup>. Training structures included MD structures at various temperatures up to 600 K for bulk MAPbI<sub>3</sub>, 2D HP structures with varying number of perovskite layers and three different organic linkers, phenylethylammonium  $C_6H_5(CH_2)_2NH_3$  (PEA), PMA and BA. Additionally, prototype (primitive) structures with varying volume were included as well as a few dimer configurations. Structure generation and manipulation were carried out using the ASE<sup>17</sup> and HIPHIVE packages<sup>18</sup>. The MD structures were generated via an active learning strategy using earlier NEP model generations and selected according to their uncertainty, which was estimated from the predictions of an ensemble of models as already described in Ref. 19. We included 2D structures with *n* ranging from 1 to 6 in the training data, as well as bulk MAPbI<sub>3</sub> structures. In total the training set consists of 616 structures, corresponding to a total of 120 000 atoms. The final NEP model used for the production MD simulations was trained using all available training data. For this model, the root mean squared errors obtained by cross validation using 10 folds are 10 meV atom<sup>-1</sup> for the energies, 150 meV Å<sup>-1</sup> for the forces and 90 meV atom<sup>-1</sup> for the virials (Fig. S1). The corresponding parity plots are shown in Fig. S1.

### S1.4 Molecular dynamics simulations

All MD simulations were carried out with GPUMD<sup>15,20</sup> with a timestep of 0.5 fs. The cooling simulations were run in the NPT ensemble by first heating the system up from zero to 600 K over 1 ns, followed by equilibration at 600 K for 1 ns, before finally cooling down to 200 K over 25 ns. Simulations were carried using cells comprising  $6 \times 6 \times 4$  repetitions of the 2D prototype structures which for, e.g., n = 12 corresponds to about 50 000 atoms and a cell size of about 50 Å × 50 Å × 350 Å; see Fig. S4 for convergence testing.

### S1.5 Tilt angle analysis

The transitions between different perovskite phases were analyzed using the octahedral tilt angles of the  $PbI_6$  octahedra<sup>21-24</sup>. The tilt angles were extracted using the following procedure, which we implemented in OVITO<sup>25</sup> and which was used previously in, e.g., Ref. 21. The process begins by generating bonds between Pb and I atoms, resulting in six bonds per Pb atom. Each PbI<sub>6</sub> octahedron is then matched to a simple cubic environment, representing an undistorted, fully symmetric octahedron as it would appear in the ideal cubic perovskite structure. This matching is done using the algorithm described by Larsen *et al.*<sup>26</sup>, which provides the necessary scaling and rotation for optimal mapping.



Figure S1: Parity plots for total energies, forces and virials for training and validation sets.



Figure S2: Illustration of octahedral tilt angles. (a) Schematic crystal structure showing a planar view of four connected  $PbI_6$  octahedra. (b) Euler angles describing the orientation of a single octahedron.

The rotation, represented in quaternion form in OVITO, is converted to Euler angles using the SCIPY package<sup>27</sup>. Among the three possible settings for the internal rotations, the setting yielding angles in increasing magnitude is selected, following the principle established by Glazer. This analysis was conducted for each snapshot of the MD runs, allowing us to access the tilt angle distribution as a practically continuous function of temperature.

# S2 Additional analysis of cooling simulations



Figure S3: Potential energy data from cooling simulations averaged using a gliding window with a size corresponding to 0.4 K and fits to two polynomials splined together with an error function.



Figure S4: Convergence of potential energy, heat capacity and in-plane lattice-parameters with respect to simulation time (left) and system size (right) for PEA-MAPbI<sub>3</sub> n = 12. Unless specified the system size and simulation length are the same as used in the remainder of this paper, i.e.,  $6 \times 6 \times 4$  and 25 ns.



Figure S5: Thermodynamic properties from heating and cooling runs for PEA-MAPbI<sub>3</sub> with n = 12.



Figure S6: Probability distribution over the octahedral tilt angles,  $P(\theta_z)$ , for each symmetrically distinct layer in PEA-MAPbI<sub>3</sub> with n = 8 at (a) 500 K, (b) 430 K and (c) 330 K. Here, layer 1 refers to the perovskite layer closes to the organic linker molecule.

# S3 Transitions in additional systems

Here, we consider the cooling runs of PMA-MAPbI<sub>3</sub>, BA-MAPbI<sub>3</sub> and the MAPI<sub>3</sub> surface  $\{001\}$  surface. We note that there is some uncertainty of about  $\pm 10$  K when determining the transition temperatures from the tilt angle analysis as done here due to the stochastic nature of the MD simulations. For example, perovskite regions separated by the linker can undergo the transitions at slightly different points of time in the MD simulations, and the presence of anti-phase boundaries leads to small changes in the transition temperature.

One should also note that the NEP model overestimates the MAP $bI_3$  bulk transition temperature by about 40 K compared to experiment. We therefore emphasize that these results should be interpreted in a qualitative or semi-qualitative manner.



Figure S7: Probability distribution over the octahedral tilt angles,  $P(\theta)$ , as a function of temperature for PMA-MAPbI<sub>3</sub> with n = 8.



Figure S8: Probability distribution over the octahedra tilt angles,  $P(\theta)$ , as a function of temperature for BA-MAPbI<sub>3</sub> with n = 8.



Figure S9: Probability distribution over the octahedral tilt angles,  $P(\theta)$ , as a function of temperature for a pure MAPbI<sub>3</sub> {001} surface with MAI<sub>2</sub> termination with a total of 16 perovskite unit cells in the z-direction. Here, the tilt angles are shown for the first four layers starting with the top-most surface layer.



Figure S10: (a) Energy and out-of-plane lattice parameter for BA-MAPbI<sub>3</sub> with n = 12. At about 380 K one observes the transition between the untilted and the tilted structure, and around 300 K there is a transition related to freezing in the BA molecules in a "bent" configuration leading to a significant drop in the out-of-plane lattice parameter. (b–d) Average atomic configurations at (b) 430 K, (c) 340 K and (d) 300 K. Red and blue octahedra indicate negative and positive tilt angles (ranging from -20 to  $20^{\circ}$ ), respectively, whereas gray implies tilt angles close to zero.

# S4 Impact of atomic scale dynamics on electronic structure

To verify the impact of the local phase and dynamics in the 2D perovskites on the electronic structure, we carry out a MD simulation using a 644-atom supercell of  $PEA_2MA_{n-1}Pb_nI_{3n+1}$  containing four layers (n = 4). Runs are performed at temperatures of 330, 430, and 530 K. These temperatures correspond to different combinations of average structures of surface and middle layers of the perovskite slab (compare Fig. 4 of the main paper). At 330 K, all layers are tilted (equivalent to Fig. 4c). At 430 K, the middle layers exhibit cubic symmetry on average while the outer layers are tilted (equivalent to Fig. 4b). At 530 K, all layers exhibit cubic symmetry on average (equivalent to Fig. 4a).

From each run, we extract 20 snapshots and then perform DFT calculations using the CP2K package<sup>28,29</sup>. We employ the PBE functional, an energy cutoff of 400 Ry and double-zeta basis sets. For each structure, we project the densities of the valence band maximum (VBM) and conduction band minimum (CBM) states along the z-direction. The maximum of the density indicates in which plane the state is mainly localized. Figure S11 shows the distributions for all snapshots as well as their averages. When computing the averaging, we consider the symmetry of the structure and sum up contributions of the equivalent middle layers.

The analysis suggests that at 330 K the VBM is localized in the middle layers, which are tilted at this temperature. At higher temperatures, the VBM does not preferentially localize in any type of layer. The CBM on the other hand exhibits a strong preference to localize in the outer layers at 330 and 430 K, i.e., when these layers are tilted. At 530 K, when all layers are cubic, the probability of finding the CBM in the middle of the perovskite slab increases. These results suggest a close relationship between the dynamics of the 2D perovskite and the spatial distribution of the VBM and CBM states, which impacts the charge separation in these materials and should be investigated further in future studies.



Figure S11: Distribution of the density of the VBM and CBM states in  $PEA_2MA_{n-1}Pb_nI_{3n+1}$  system with n = 4 layers at 330, 430, and 530 K. The average distributions (Avg, on the right-hand side of each subpanel) are obtained by averaging over the individual snapshots (on the left-hand side of each subpanel).

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