

In Situ Transmission Electron Microscopy Study of Electron Beam-Induced Transformations in Colloidal Cesium Lead Halide Perovskite Nanocrystals

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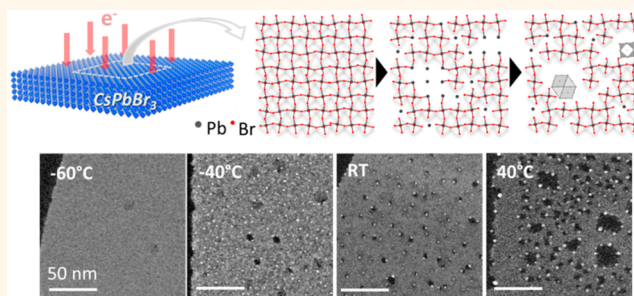
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Supporting Information

ABSTRACT: An increasing number of studies have recently reported the rapid degradation of hybrid and all-inorganic lead halide perovskite nanocrystals under electron beam irradiation in the transmission electron microscope, with the formation of nanometer size, high contrast particles. The nature of these nanoparticles and the involved transformations in the perovskite nanocrystals are still a matter of debate. Herein, we have studied the effects of high energy (80/200 keV) electron irradiation on colloidal cesium lead bromide (CsPbBr₃) nanocrystals with different shapes and sizes, especially 3 nm thick nanosheets, a morphology that facilitated the analysis of the various ongoing processes. Our results show that the CsPbBr₃ nanocrystals undergo a radiolysis process, with electron stimulated desorption of a fraction of bromine atoms and the reduction of a fraction of Pb²⁺ ions to Pb⁰. Subsequently Pb⁰ atoms diffuse and aggregate, giving rise to the high contrast particles, as previously reported by various groups. The diffusion is facilitated by both high temperature and electron beam irradiation. The early stage Pb nanoparticles are epitaxially bound to the parent CsPbBr₃ lattice, and evolve into nonepitaxially bound Pb crystals upon further irradiation, leading to local amorphization and consequent dismantling of the CsPbBr₃ lattice. The comparison among CsPbBr₃ nanocrystals with various shapes and sizes evidences that the damage is particularly pronounced at the corners and edges of the surface, due to a lower diffusion barrier for Pb⁰ on the surface than inside the crystal and the presence of a larger fraction of under-coordinated atoms.

KEYWORDS: cesium lead halide nanocrystals, TEM, radiation damage



Lead halide perovskites, both hybrid and all-inorganic, with general formula APbX₃ (with A⁺ = CH₃NH₃⁺/NH₂CH=NH₂⁺/Cs⁺, and X⁻ = Cl⁻/Br⁻/I⁻), have remarkable electronic properties¹ that make them promising for applications in photovoltaics² and optoelectronics.^{3–5} Compared to their bulk counterparts, APbX₃ nanocrystals (NCs) have one or more dimensions that are reduced to a few to tens of nanometers, and their size and morphology can be manipulated to tune their optical properties.^{6,7} However, since surfaces and interfaces play important roles in material degradation,^{8,9} perovskite NCs may be inherently more unstable under irradiation by several sources (laser light, X-rays, electrons), heating, or exposure to moisture, than the

corresponding bulk crystals.^{6–10} Such instability represents a major limitation for the widespread application of halide perovskite NCs in devices.

Recent transmission electron microscopy (TEM) studies of lead halide perovskite NCs (CH₃NH₃PbX₃,^{10,11} (C₄H₉NH₃)₂PbBr₄,¹² and CsPbX₃^{13–17}) have consistently reported the appearance of few nanometer size high contrast particles upon irradiation. Some of these reports indicated that the particles are made of metallic lead,^{11,13,16,17} a claim that is

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supported by the evidence that Pb^{2+} species from various material systems can be reduced to Pb^0 by irradiation with electrons¹⁸ or with X-rays.^{8,19} Other studies of irradiation of APbX_3 NCs have suggested that PbBr_2 ¹¹ is also formed. Such discrepancies among the various reports underline an incomplete understanding of the overall transformations in the perovskite NCs, and especially of those leading to these high contrast particles. Compared to halide perovskites, the behavior of other materials systems under electron beam irradiation is better understood. For example, previous studies on oxides and on CaF_2 have shown that their irradiation by an electron beam can induce the nucleation of metal particles and surface metallization.^{20–24} One typical case is the transformation of PbO_2 to Pb through an intermediate PbO phase.¹⁸ It is known that the nucleation of metal particles and the surface metallization on oxides or on CaF_2 occur in parallel with electron stimulated desorption processes through electronic excitation: in practice, while the cations are reduced to their metallic states, the anions (*i.e.*, oxygen ions in oxides or fluoride ions in CaF_2) are oxidized to neutral or even to positive species, which readily desorb from the surface.^{21,25–27} Stimulated desorption processes also occur under other types of irradiation, for example by photons.²⁵

Here we demonstrate that high energy (80/200 keV) electron irradiation of APbX_3 (CsPbX_3 in the present case) NCs in a TEM causes the desorption of halogen species and the nucleation of metallic Pb particles. Also, by a temperature dependent study we were able to provide several details of the mechanism by which the Pb nanoparticles are formed. Our analysis was carried out on colloidal NCs having different shapes (cubes, wires, sheets), although it was mainly focused on CsPbBr_3 nanosheets with 3 nm thickness and hundreds of nm width, a morphology that allows the observation of multiple events under identical irradiation conditions. We could identify two main stages in the transformation: (i) electron stimulated desorption of Br atoms and concomitant reduction of Pb^{2+} to Pb^0 , and (ii) diffusion of Pb^0 atoms and their aggregation into Pb nanoparticles, with local amorphization and severe dismantling of the CsPbBr_3 NCs. This process is more pronounced at lower electron energy, higher electron dose, and higher temperature, and is favored in higher surface-to-volume ratio NCs.

RESULTS AND DISCUSSION

Knock-on damage and radiolysis are the two major electron-specimen interactions operative in an electron microscope with an incident electron energy of tens or hundreds of kiloelectron volt (keV).²⁸ Knock-on damage involves an irreversible displacement of the nuclei in the specimen, when the transferred energy overcomes the displacement energy of the atoms in the material, and it is dominant at high energy.^{26,28,29} Ionization damage (or radiolysis) involves inelastic scattering, and is dominant at low energy.^{28,29} In the present case, for a better comprehension of the electron-specimen interaction we evaluated the evolution of halide perovskite NCs, which involved appreciable compositional change, upon electron beam irradiation at two different values of incident electron energy (E_0) (see Figure S1). In particular, we verified that 80 keV electrons cause more effective damage (in terms of loss of Br atoms) than 200 keV electrons, suggesting that radiolysis rather than knock-on is the major mechanism of damage, as expected for both covalent and ionic crystals.²⁹ Therefore, a thorough analysis of the compositional change of the perovskite

NCs upon irradiation was carried out at $E_0 = 80$ keV from areas containing thin nanosheets (3 nm thick, prepared as reported in our previous work¹⁴) at room temperature (RT), by acquiring energy-dispersive X-ray spectroscopy (EDS) spectra at regular time intervals up to a total accumulated dose of $6.5 \times 10^4 \text{ e}^-/\text{\AA}^2$. Note that the starting 3 nm thick nanosheets were Cs-deficient ($\text{Cs}_{1-x}\text{PbBr}_3$, Figure S1), while the thicker crystals (for example, > 10 nm thick nanosheets) had the expected CsPbBr_3 stoichiometry. However, for the sake of simplicity, the stoichiometric formula (CsPbBr_3) will be used to address also the 3 nm thick nanosheets throughout this work.

Figure 1(a) reports EDS spectra (in the energy range of interest) at increasing doses from scanning TEM (STEM)-EDS

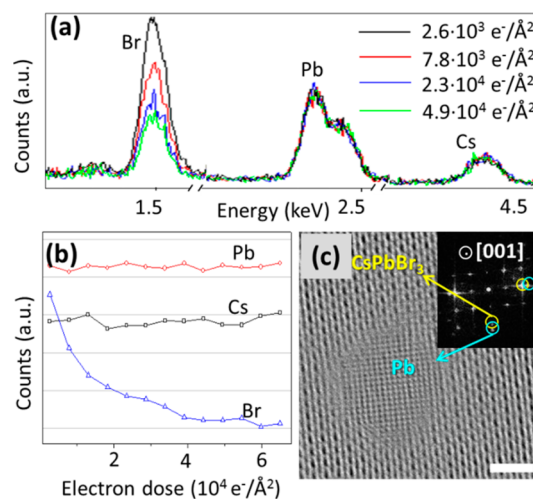


Figure 1. Br desorption and Pb nanoparticle formation during electron irradiation of 3 nm thick CsPbBr_3 nanosheets at RT. (a) EDS spectra in the energy range of interest at increasing electron doses ($E_0 = 80$ keV); (b) Plot of the net integrated peak intensity for Cs, Pb, and Br as a function of the electron dose from STEM-EDS analysis ($E_0 = 80$ keV); (c) HRTEM of a Pb nanoparticle formed on CsPbBr_3 nanosheet, with both CsPbBr_3 and Pb oriented along the [001] zone axis (Scale bar: 2 nm, $E_0 = 200$ keV, dose: $1140 \text{ e}^-/\text{\AA}^2$), and (inset) Fast Fourier Transform (FFT) with the spots for CsPbBr_3 {220} and Pb {200} circled.

analysis. Compositional changes were plotted by measuring the net peak intensity (proportional to the number of atoms) of the three elements of interest (Figure 1(b)). Upon irradiation, Cs and Pb intensities did not change appreciably, while the signal from Br decreased, especially at higher electron dose. This was also evident in the EDS elemental maps acquired at the boundary regions between areas exposed to different electron doses (see Figure S2). Note that an initial Br:Pb ratio lower than the stoichiometric one (3:1) was most likely caused by electron induced Br loss as soon as the EDS measurement was started. Such loss of Br atoms is analogous to the electron stimulated desorption of fluorine in CaF_2 , or of oxygen in several oxides, as said before.²⁶ In the case of CaF_2 , F^- is oxidized to F^0 or to F^+ , and likewise in oxides O^{2-} is oxidized to O^0 or to O^+ . The neutral species (F^0 or O^0) diffuse and are desorbed due to their low reactivity. When positively charged species are formed, the Madelung potential is repulsive, and such species would be desorbed quickly when they are close to the surface.²⁶ In our samples (and as already reported by others^{12–15}), in parallel with the Br loss, high contrast particles were formed during electron beam irradiation on CsPbBr_3

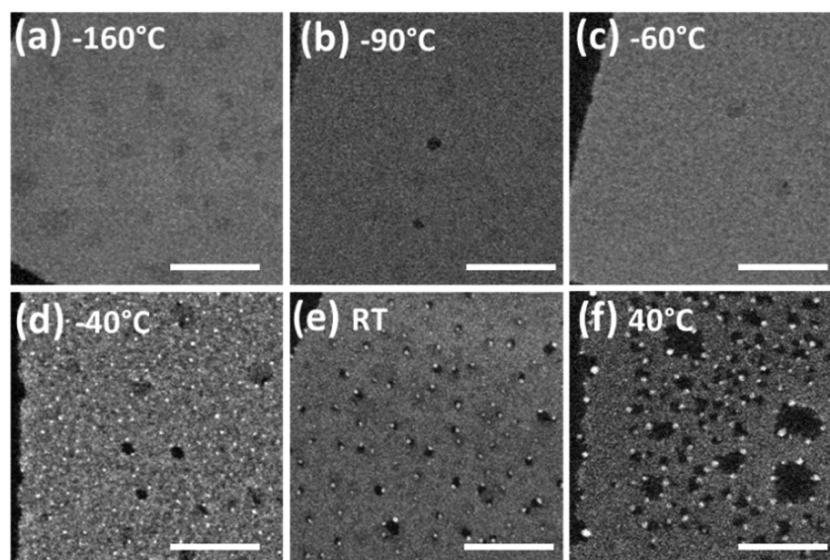


Figure 2. Effect of temperature on the nucleation and growth of Pb nanoparticles in 3 nm thick CsPbBr₃ nanosheets, as shown in HAADF-STEM images (Scale bars: 50 nm, $E_0 = 200$ keV, the total doses for acquiring all the images are approximately $\sim 1.0 \times 10^3$ e⁻/Å²): (a) -160 °C; (b) -90 °C; (c) -60 °C; (d) -40 °C; (e) RT; (f) 40 °C.

(orthorhombic phase, ICSD 97851), and these were identified as metal Pb nanoparticles with face centered cubic structure (ICSD 96501, see high-resolution TEM (HRTEM) image in Figure 1(c)).

We can therefore state that such transformations are due to electron stimulated desorption of Br and reduction of Pb²⁺ to Pb⁰. From Figure 1(a), the maximum fractional loss of Br was close to 2/3. Assuming that all the Pb²⁺ ions were reduced at the maximum loss of Br, we infer that the reduction of one Pb²⁺ ion was accompanied by the loss of two Br atoms, and this implies that a considerable fraction of Br⁻ ions was very likely oxidized to Br⁰, and also that such oxidized species could diffuse and were ultimately desorbed from the NCs. A similar process was found to affect CsPbX₃ NCs with different halogens (X = Cl, I) and even Cs₄PbBr₆ NCs (Figure S3). Details on the syntheses of these nanocrystals are found in the Supporting Information (SI). We also found that even irradiation by X-rays, by using the X-ray source of a X-ray photoelectron spectrometer (XPS), can cause a slight reduction of Pb²⁺ and a slight desorption of Br (see Figure S4). Therefore, our results and the observation of the Pb⁰ peak in recent XPS studies of organic lead halide perovskites^{8,30} imply that the Br desorption (and Pb²⁺ reduction) can be triggered by different types of radiation and can be generally classified as a stimulated desorption process. On the other hand, under irradiation by UV laser light lead halide perovskite NCs may undergo degradation via a different mechanism, as reported by Wang *et al.*⁵¹

As mentioned above, the damage of CsPbBr₃ nanosheets was slower at higher incident electron energy ($E_0 = 200$ keV), hence this condition was chosen to capture the details of the following stage of evolution. Our experiments clearly show that Pb⁰ atoms aggregated to form Pb nanoparticles at a rate that depended on the temperature (see high angle annular dark field (HAADF)-STEM images in Figure 2). At low temperatures (*i.e.*, -60 °C or lower), Br atoms were desorbed (Figure S1(b,c)) and Pb²⁺ ions were most likely reduced to Pb⁰, according to the electron-stimulated desorption mechanism described above. However, no Pb nanoparticles were visible

(see Figure 2(a–c) and their HRTEM images in Figure S5(a)). This result suggests that, at these temperatures, Pb⁰ atoms did not have enough energy to overcome the activation barrier for diffusion, which would have enabled them to cluster into Pb particles at the surface of the NCs. Still, in this temperature range one cannot exclude that clusters containing only a few atoms (Pb nanoclusters) were formed, but in that case they were simply not discernible in the images. At higher temperatures (*i.e.*, -40 °C or above), and still under irradiation, Pb⁰ atoms (and probably also clusters of Pb atoms) could instead diffuse and coalesce into observable Pb nanoparticles^{23,32} (Figure 2(d–f) and Figure S5(b)). As a general trend, higher temperatures promoted the formation of larger Pb particles (compare for example Figures 2d–f).

A question arises on whether electron beam heating has an important effect here. This is certainly true in materials with poor thermal conductivity. The two parameters that play a pivotal role in electron beam heating are dose rate (proportional to the beam current) and incident electron energy (E_0). In the high temperature conditions at which visible Pb nanoparticles are formed, a study on the dependence of Pb nanoparticle formation on the irradiation dose rate for 200 keV electrons is reported in Figure S6. It shows that, in the range between 8.5×10^5 and 2.0×10^8 e⁻/Å²/s, the increase of size of Pb nanoparticle with increasing dose rate is negligible. The dose rate used in typical HRTEM and STEM imaging is within this range. Nevertheless, a higher dose rate induces the production of larger Pb nanoparticles, as demonstrated in Figure S6. We also found that at low temperatures (-60 °C or lower, which were conditions that did not promote the formation of observable Pb nanoparticles), with the same dose rate (5.0×10^6 e⁻/Å²/s) used in Figure 2 (a–c) not even electron irradiation with ten times higher doses could induce the appearance of Pb nanoparticles. This suggests that a significant temperature rise does not occur even under irradiation with much higher doses. These observations evidence that electron beam heating of CsPbBr₃ has a negligible effect at our experimental conditions for $E_0 = 200$ keV. 80 keV electrons would have a thermal effect that is approximately 1.6

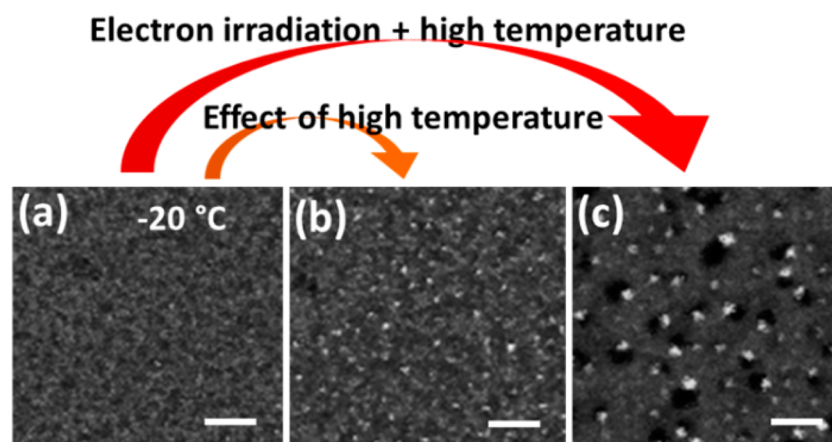


Figure 3. HAADF-STEM images of 3 nm thick nanosheets (Scale bars: 20 nm, $E_0 = 200$ keV): (a) Initially at -20 °C; (b) Following the acquisition of the image (a), the substrate temperature was raised to RT for 10 min with electron beam blanked, and again cooled to -20 °C for imaging of the same nanosheet; (c) image acquired at RT.

times the one from 200 keV electrons, which is still negligible within the dose rate employed in this work (see a more detailed discussion in the SI). In two different irradiation experiments, carried out at the higher temperature side of our tested interval (-40 °C and RT, see Figure 2(d,e)), we counted the numbers of Pb^0 atoms within the observed nanoparticles and found them comparable ($\sim 5 \times 10^5$ in total, the Methods section explains how the calculations were made). This suggests that, although the perovskite lattice collapses locally, the Pb^0 species are not lost from the NCs, a result that goes hand in hand with the quantitative EDS results reported in Figure 1. Instead, they are mainly sequestered in the formation of the metallic clusters, if the temperature is high enough.

Both temperature and electron irradiation have a role in the nucleation and growth of Pb^0 clusters. The effect of temperature has already been mentioned, and was made more evident by the control experiments reported in Figure 3. In this case, the sample was first irradiated at -20 °C, after which the temperature was raised (to RT). If, during this latter step, the electron beam was blanked (*i.e.*, it was prevented to hit the sample), the initial, barely visible Pb nanoparticles that had formed at -20 °C evolved into larger particles (diameter ≤ 1.8 nm, an average value is hard to evaluate due to their small sizes), supporting the idea of temperature promoted diffusion of Pb^0 species. If the temperature was raised while the sample was being irradiated, considerably larger Pb nanoparticles (2.3 ± 0.8 nm) were formed (see Figure 3). The electron induced heating is negligible at the used dose rate $8.5 \times 10^5 \text{ e}^-/\text{\AA}^2/\text{s}$ as discussed above and in Figure S6. It is likely that this occurred as the electron irradiation contributes to enhancing the diffusivity of Pb^0 species and of small Pb nanoparticles by transferring momentum and energy to them.^{23,33} In addition, new Pb^0 species were continuously generated by irradiation. This implies that, although the initial Br desorption and Pb^{2+} reduction is mainly due to a radiolysis process, we should also consider a contribution of knock-on displacement in the Pb nanoparticle nucleation process.

In the high temperature range, the Pb^0 atoms can form the Pb nanoparticles by diffusing both along the surface and through the inner regions of the perovskite NCs, although diffusion from the bulk should be less marked in thicker samples. We compared the behavior of thin nanosheets (3 nm thick) with that of the thicker sheets (tens of nm thick) that

were also present in the sample (note that the thicker sheets represented only a minor fraction of the sample). The comparison was quantified through compositional change under the same irradiation conditions. As shown in Figure S7, the Br concentration (at.%) dropped from 57% to 50% for 3 nm thick nanosheets, while it remained nearly constant at 59% for thicker nanosheets. The comparison evidenced that the thick nanosheets had undergone much less change and consequently less damage compared to the thin nanosheets (see Figure S7). This implies that both desorption of Br and aggregation of Pb^0 species occur preferentially at the surface, which is expected since the surface is generally characterized by a lower barrier to atomic diffusion. Also, both Br and Pb atoms have lower coordination at the surface and their electronic configuration may be more easily altered by electron irradiation and additionally Br species are more easily desorbed when they are bound to surface sites than to inner regions of the sheets. As a consequence, the surface is energetically less stable than the bulk and plays an important role in the electron beam-induced degradation of perovskite NCs. Similar conclusions were drawn by Philippe *et al.*⁸ and Yuan *et al.*⁹ by exposing APbX_3 thin films to different irradiations.

In addition to nanosheets, we also tested colloidal CsPbBr_3 NCs with nanocuboid and nanowire shapes and different sizes, for which the syntheses are found in the Methods section. Overall, we found that the samples with higher surface-to-volume ratio (3 nm thick nanosheets, nanowires with diameters smaller than 10 nm, and nanocuboids with 8 nm edge) were more susceptible to electron irradiation than the samples with lower surface-to-volume ratio (see Figure 4, S7 and S8). The latter included: nanosheets that were tens of nm thick, nanowires wider than 10 nm, and cuboids with 20–40 nm edge (see Figures 4 and S7). In these larger NCs, the internal structure appeared to be preserved under irradiation, and only a few Pb nanoparticles were formed at their surface. On the other hand, lowering the incident electron energy to 80 keV could cause significant damage even to these NCs, due to the increased probability of inelastic interaction. An increase in temperature could also promote the process by speeding up the diffusion along the surface, as well as by promoting the diffusion from the inner regions of the NCs (above 60 °C), and this led to their fast degradation (see Figure S9). The dynamic evolution at high temperature for large nanocuboids is

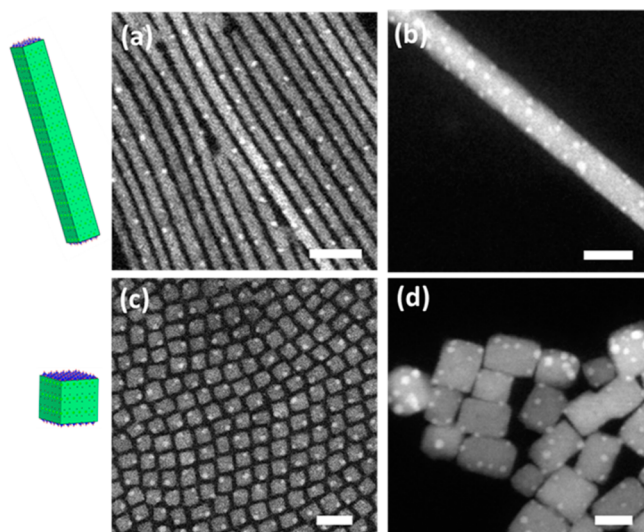


Figure 4. HAADF-STEM images showing preferential formation of Pb nanoparticles at the edges and corners of CsPbBr₃ NCs: (a) 5 nm wide nanowires; (b) 20 nm wide nanowire; (c) nanocuboids with 8 nm edge; (d) nanocuboids with 20–40 nm edge (Scale bars: 20 nm, $E_0 = 200$ keV, RT).

demonstrated in the Supporting Video S1. High surface-to-volume ratio NCs readily decomposed, which is clearly demonstrated in Figure 4. The 5 nm wide nanowires broke due to the formation of Pb nanoparticles. It is also remarkable that these Pb nanoparticles were rather regularly spaced along the wires. The nanocuboids with edge length of 8 nm decomposed by forming Pb nanoparticles at the corners (see Figure S8). A close investigation of Figure 4 revealed that edges and corners of the NCs are preferential sites for Pb particle formation.

The starting sites of Pb reduction and Br desorption may be linked to defects. At a defect site, Pb ions may undergo reduction more easily. Starting preferentially from the defects, on 3 nm thick nanosheet voids with Pb nanoparticles on the edge are created. The formation of these Pb nanoparticles consumes part of the Pb from the surrounding perovskite lattice and leads to the formation of few small Pb nanoparticles at the surrounding locations. Overall, these processes result in the inhomogeneous damage in a single nanosheet (as can be seen in Figure 2 and Figure 3), even though the whole nanosheet is under homogeneous electron irradiation.

To monitor the formation of Pb nanoparticles at different sites under identical irradiation conditions, we took advantage of the large field of view of the direct electron detection camera combined with the large lateral size of the nanosheet to record them in a single HRTEM image (Figure 5(a)). Magnified views from the same image are displayed in Figure 5(b–f); *i.e.*, all the events in these regions occurred simultaneously under the same irradiation conditions, which show as an eye-catching feature that the evolution of Pb nanoparticles at different sites is not synchronous. Some of the Pb nanoparticles exhibited a single-crystal structure, anisotropic shape (*i.e.*, square/hexagonal projection) and well-defined orientation relationship (epitaxy) with the parent CsPbBr₃ nanosheet (orthorhombic phase with ICSD: 97851, [001]-oriented on the support film). The relationships were: CsPbBr₃ [001] || Pb [001], CsPbBr₃ (110) || Pb (100), as shown for the particles in Figure 5(b,c) and for some of the particles of Figure 5(d,e). This suggests

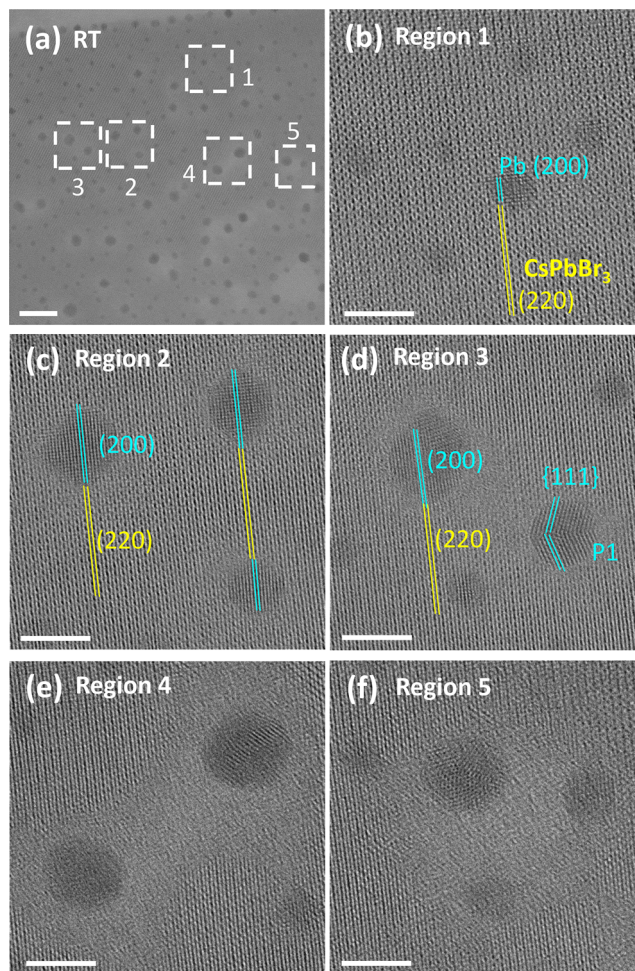


Figure 5. HRTEM analysis of Pb nanoparticle formation on a 3 nm thick CsPbBr₃ nanosheet at RT: (a) Overview (Scale bar: 20 nm, $E_0 = 200$ keV, total dose: 1140 e⁻/Å²); (b–f) Magnified view of five regions of interest in (a) (Scale bars: 5 nm).

that the Pb atoms at the edge of these Pb nanoparticles may be bound to the parent CsPbBr₃ lattice, and these are presumably early stage particles. Nonepitaxially bound, roughly spherical shapes were also found, such as the particles in Figure 5(e,f), including twinned NCs (particle P1). These nanoparticles may have resulted from a rearrangement of early stage Pb nanoparticles upon further irradiation. Our results support the idea that the epitaxial Pb particles bound to the surrounding parent lattice can survive until a critical size (*i.e.*, number of Pb atoms). Above that size, the Pb atoms in the particle lose the epitaxial relationship with the surround lattice and rearrange, forming more isotropic particles which are thermodynamically more stable. This can be rationalized as due to two major reasons: (i) edge atoms are weakly bound to the surrounding lattice and the unstable bonds between the edge atoms and the surrounding lattice are broken due to the ongoing irradiation; and (ii) rearrangement results in the emergence of facets of lower energy. Among these more isotropic particles, some Pb nanocrystals exhibit twinning, a type of defect that is often seen in the case of metal nano- and microparticles, due to its low formation energy in metals.³⁴ By feeding the Pb atoms to the surrounding Pb nanoparticles, some areas on the CsPbBr₃ nanosheet turned into voids decorated by Pb nanoparticles at their edges (see Figure 5(e,f) and Figure 2(e,f)), while the Cs

atoms as well as the remaining Pb and Br species were randomly distributed in the voids.

Once formed, the Pb nanoparticles were not stable under further electron irradiation. The evolution of the number and size distribution of the Pb nanoparticles is reported in Figure 6.

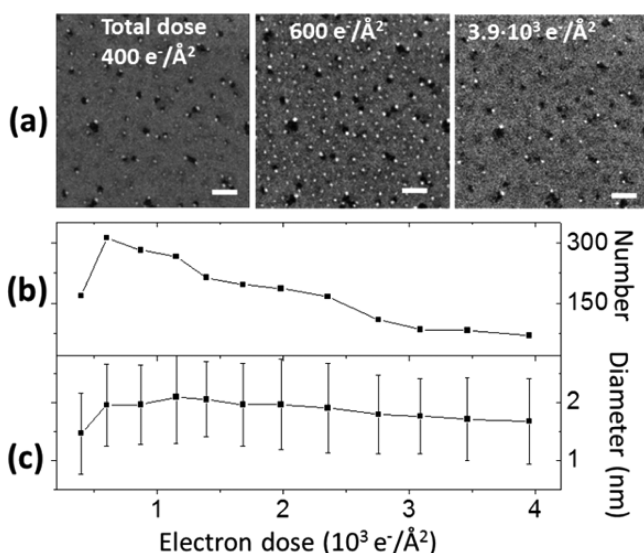


Figure 6. Evolution of number and size of Pb nanoparticles on 3 nm thick CsPbBr₃ nanosheets at RT as a function of electron irradiation ($E_0 = 200$ keV, RT). (a) HAADF-STEM images at four doses (Scale bars: 20 nm); (b) Number of Pb nanoparticles versus electron dose; (c) Average size of Pb nanoparticles versus electron dose (the diameter is calculated from the area by assuming a circular shape, error bar is the standard deviation).

At an electron dose of 400 e⁻/Å², around 170 Pb nanoparticles had nucleated in the area shown in the HAADF-STEM image in Figure 6(a). This number rapidly increased to 310 at a dose of 600 e⁻/Å² (Figure 6(a,b)). These nanoparticles were not stable and were dismantled under further electron irradiation: the number decreased to 70 at a dose of 3.9 × 10³ e⁻/Å² (Figure 6(a,b)), and the particles basically disappeared at even higher doses. The same holds for Pb nanoparticles produced at

different temperatures (see Figure S10). The size distribution of the Pb nanoparticles also changed during electron irradiation. For the Pb nanoparticles formed in Figure 6(a), the average size was 1.5 nm at a dose of 400 e⁻/Å² and increased to 2.1 nm at a dose of 1.1 × 10³ e⁻/Å². At a given temperature (*i.e.*, surface diffusion rate), an equilibrium size was reached and did not increase any longer, and instead started to gradually decrease to 1.7 nm at a dose of 3.9 × 10³ e⁻/Å².

The dominant reason for Pb particle size variation with increasing total dose is not heating. Note that, the slow variation of the average diameter of the Pb nanoparticles over time was due to the asynchronous evolution they underwent at different sites. According to our analysis based on the elemental maps of Figure S11, a Pb nanoparticle forms and then its size decreases under further electron irradiation, until the particle finally disappears. As the Pb composition recorded in the analyzed areas is constant (see the discussion for Figure 1) the dissolution of the Pb nanoparticle is unlikely to be the result of a sublimation or vaporization process. We also tend to exclude the participation of metallic Pb atoms in redox reactions under electron irradiation conditions, even though the surroundings of the Pb particles are chemically active. This is because, to do so, the metallic Pb atoms would have to stably lose electrons (*i.e.*, be oxidized), which is unlikely when electrons are continuously supplied by irradiation.

The mechanism of dissolution of the Pb nanoparticles is revealed by the HRTEM study in Figure S12–S14. Following the amorphization of the Pb nanoparticles (Figure S12 and Figure S13), with further irradiation, Pb atoms spread out on the supporting film. In the case of 3 nm thick nanosheet, on which Pb nanoparticles decorate the edge of voids, the dissolution of Pb nanoparticles under further electron irradiation causes the decrease of the size of the voids, as observed in Figure 6. The dissolution of Pb nanoparticles from one isolated nanocuboid leads to continuous decomposition of the nanocuboid (Figure S13), while for an array of closely spaced nanocuboids the spread atoms accumulate at the regions between cuboids and appear as hollow frames that follow the initial contours of the cuboids (Figure S14). The atoms that have diffused from adjacent Pb nanoparticles could gather and form clusters (see Figure S15). This process is similar to the

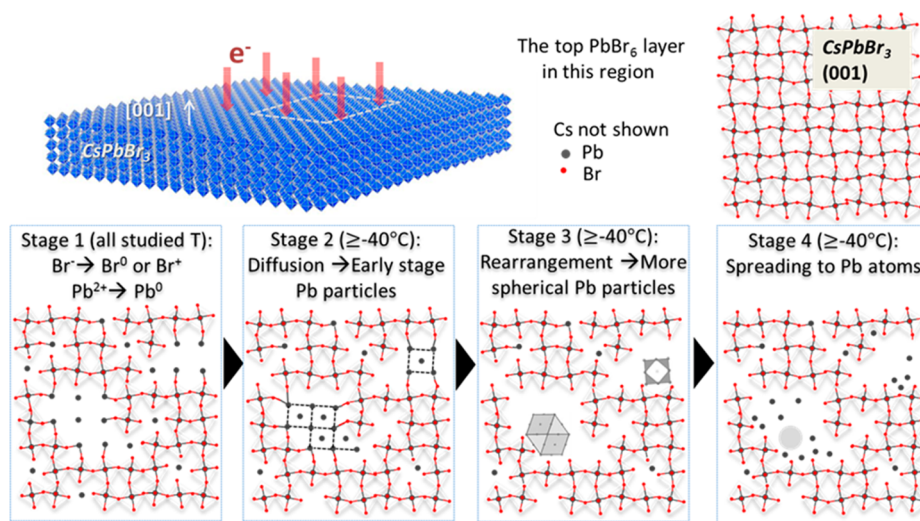


Figure 7. Schematics depicting the stages in the evolution of an irradiated area in a CsPbBr₃ nanosheet ([001] orientation). Only the atomic model for the topmost layer of PbBr₆ octahedra is shown for clarity.

reported dissipation of Pd and Mo nanoparticles through diffusion under electron beam irradiation.³⁵ Therefore, if we rule out the possibility of vaporization and redox reactions, the most probable mechanism for the “disappearance” of Pb nanoparticles under prolonged electron irradiation is through diffusion and spreading out of Pb atoms on the remaining perovskite lattice and on the carbon film of the TEM grid.

To summarize the above-presented results, the overall process of electron beam-induced transformations in CsPbBr₃ NCs is schematically summarized in Figure 7. For demonstration purposes, we show the evolution of Pb nanoparticles in an irradiated area, and we draw only the topmost PbBr₆ octahedron layer. Considering that, in the CsPbBr₃ structure, mainly covalent bonds form between Pb and Br, and mainly ionic bonds form between Cs and Br, while Pb and Cs atoms are not bound to each other,³⁶ the following stages can be identified on the basis of the above results:

Stage 1. The whole process starts with the oxidation of Br⁻ and reduction of Pb²⁺ at all studied temperatures (Figures 1 and Figure S1), which is likely to occur preferentially at the corners and edges of the surface of the NC. Oxidized halide species desorb from the surface.

Stage 2. At high temperatures (above -40 °C), in tandem with electron induced motion (*i.e.*, by momentum transfer), the reduced Pb⁰ atoms diffuse preferentially along the surface and aggregate into single-crystal Pb nanoparticles, which possess anisotropic shapes and epitaxial relationships with the parent nanosheet lattice, probably due to partial binding to the surrounding lattice. Note that a higher temperature (above 60 °C) can enable the diffusion of Pb⁰ also from the inner perovskite lattice.

Stage 3. The bonds between the early Pb nanoparticles and the parent CsPbBr₃ NCs are broken upon further irradiation, hence the Pb nanoparticles evolve toward more isotropic shapes, giving rise to voids. The Pb particles are located at the boundary between the voids and the remaining perovskite lattice (as shown in Figures 2 and 6).

Stage 4. Upon further electron irradiation, the Pb nanoparticles amorphize, then they become smaller and finally fade as the Pb atoms spread on the remains of the CsPbBr₃ surface or on the support film.

CONCLUSIONS

The experiments presented here demonstrate that the electron beam induced nucleation of Pb nanoparticles on CsPbX₃ NCs is mainly due to a radiolysis damage process. Electron irradiation (80 keV/200 keV) induces the desorption of halogen atoms from the surface of the NCs and the reduction of Pb²⁺ to metallic Pb⁰, in analogy with the electron stimulated desorption mechanism reported in the literature. This process also occurs under other types of irradiation, such as X-rays. Subsequently, adjacent Pb⁰ atoms diffuse and aggregate into Pb nanoparticles at a temperature dependent rate, which is simultaneously aided by electron irradiation, most probably due to electron beam-induced motion *via* knock-on displacement of the Pb⁰ atoms on the surface. At temperatures high enough for diffusion to occur, on CsPbBr₃ NCs, anisotropic Pb nanoparticles epitaxially oriented and bound to the parent structure are produced. These rearrange into more spherical particles under further irradiation, after the bonds between their edge atoms and the surrounding parent CsPbBr₃ NCs are broken. The nucleated Pb nanoparticles are unstable and are dismantled under further electron irradiation. The formation of

Pb nanoparticles preferentially occurs at the corners and edges of the surface of the NCs. In this context, CsPbBr₃ NCs with higher surface-to-volume ratio are prone to decompose by electron beam-induced Pb nanoparticles formation, while lower surface-to-volume ratio CsPbBr₃ NCs are more robust. We could also safely exclude any significant electron beam heating under our experimental conditions.

The mechanism presented in this study may also govern the formation of high contrast particles observed in TEM images of hybrid lead halide perovskite NCs,³⁷ tin halide perovskite NCs,³⁸ and other perovskite related materials such as CsPb₂Br₅,³⁹ and it helps defining some precautions to follow. When dealing with halide perovskites characterization using electron microscopy, increasing the incident electron energy of the microscope can largely improve the stability of the sample. By lowering the substrate temperature, the characterization of high aspect ratio perovskite NCs becomes feasible as a consequence of the retarded decomposition process. Besides, radiation induced damage may be exploited for patterning purposes, *i.e.*, by creating Br-rich and Br-deficient areas, or for selectively inducing anion exchange in different regions, to enable patterned luminescent surfaces, where each pixel in the display device should correspond to the whole irradiated area, in order to avoid the inhomogeneity caused by the electron beam. Besides, in principle the Pb formation process can be used to make porous perovskite NCs. These can be advantageous compared to nonporous perovskite NCs in sensing applications, because the analytes can penetrate into the pores and interact more strongly with the perovskite. Another potential application is to enable a cation exchange process with the aid of the Pb²⁺ reduction under electron irradiation to produce a shell of perovskite with another element on the surface, as a route toward fabricating core-shell perovskite NCs.

METHODS

Electron Beam Irradiation in the TEM. The electron beam irradiation experiments were carried out in a 200 kV microscope (JEOL JEM-2200FS) equipped with a spherical aberration corrector (CEOS) for the objective lens and an in-column image filter (Ω -type). The acceleration voltage can be lowered to 80 kV by means of an electric short switch. The base pressure in the TEM column was 2×10^{-7} mbar.

High Resolution TEM (HRTEM). The electron dose is reported for each HRTEM image. The images were acquired with two types of detectors: a CCD camera with 2048 \times 2048 pixels (UltraScan 1000, Gatan Inc.), and a direct electron detection camera (K2 Summit, Gatan Inc.), with 7420 \times 7676 pixels in super-resolution mode. The K2 camera is able to capture images on a large field of view with atomic resolution, while minimizing electron exposure. The HRTEM images were acquired with the K2 camera unless specified.

Probe Current Measurements. We first calibrated the electron counts on the CCD camera using the direct electron detection camera for which electron number is directly counted. Then the probe current was measured by acquiring the Scanning TEM (STEM) probe on UltraScan 1000. With a spot size of 1.5 nm and convergence semiangle of 16 mrad, the resulting probe current was 68 pA (corresponding to a current density of 3.8×10^3 A/cm²) and was varied by selecting the spot size.

High Angle Annular Dark Field (HAADF-STEM) and Energy Dispersive X-ray Spectrometry (EDS) Analysis. A Bruker Quantax 400 EDS system with an XFlash 5060 detector was used for elemental analysis. The NCs composition was estimated from the EDS spectra in the thin film approximation (Cliff-Lorimer) by fitting the Cs $L\alpha$, Pb $L\alpha$ and Br $K\alpha$ lines, with a relative error of 10% for Cs, 10% for Pb, 4% for Br, evaluated as the standard deviation in the fit.

Temperature Dependent Study. A JEOL EM-21130 specimen heating holder with an electric furnace and EM-SHU2 heater control was used for observing the effect of higher temperatures on electron beam-induced transformations in CsPbBr₃ nanocrystals. A Gatan cryotransfer holder with liquid nitrogen cooling equipped with a Model 900 Smartset cold stage controller was used for observing the electron beam-induced transformation at low temperatures.

X-ray Photoelectron Spectroscopy (XPS). A Kratos Axis Ultra DLD spectrometer equipped with a monochromatic Al K α source (photon energy = 1486.6 eV) was used for irradiation and characterization. Nanosheets were exposed to continuous X-ray exposure at a photon flux of 2.4×10^{11} photons/mm² s. High-resolution spectra were acquired with an analyzer pass energy of 10 eV and steps of 0.1 eV. The pressure in the chamber was kept below 10^{-8} mbar and the takeoff angle set at $\Phi = 0^\circ$. Energy calibration was performed fixing the C–C component of C 1s spectrum at 284.8 eV. Relative atomic percentages of different species were computed from high-resolution spectra, fitted with Voigt functions using CasaXPS software.

Synthesis of CsPbBr₃ Nanocrystals. Thin, rectangular shaped nanosheets around 3 nm thick, with lateral size of several 100 nm up to few μm were synthesized by a colloidal procedure reported elsewhere.¹⁴ CsPbBr₃ nanowires with rectangular cross section were synthesized by a colloidal procedure previously reported by us.¹⁵ CsPbBr₃ nanocuboids with 8 nm edge were synthesized by a colloidal procedure similar to the one reported previously.⁶ The CsPbBr₃ nanocuboids with edge length of 20–40 nm were synthesized following the same colloidal procedure as for CsPbBr₃ nanoplatelets, except that ethanol was used in the place of acetone.¹³ The TEM samples were prepared by drop-casting 10 μL of the colloidal suspensions onto ultrathin carbon/holey carbon coated Cu grids.

Calculation of Pb⁰ Atoms in the Pb Nanoparticles. The total number of Pb⁰ atoms contained in Pb nanoparticles was estimated as follows: the total area of the Pb nanoparticles in the HAADF-STEM images was measured in ImageJ,⁴⁰ and then the total volume of Pb nanoparticles was calculated and multiplied by the atomic density of crystalline Pb to give the total number of Pb⁰ atoms.

ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acsnano.6b08324.

EDS analysis of CsPbBr₃ nanosheets, Pb nanoparticles formation on CsPbCl₃ and CsPbI₃, Pb²⁺ reduction under X-ray exposure, effect of temperature, electron beam heating, formation of Pb nanoparticles on CsPbBr₃ NCs with different surface-to-volume ratios, instability of Pb nanoparticles with electron irradiation, syntheses of CsPbX₃ (X=Cl, I) and Cs₄PbBr₆ NCs (PDF)

Video S1: The dynamic evolution at high temperature for large CsPbBr₃ nanocuboids (AVI)

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Notes

The authors declare no competing financial interest.

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