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#### Introduction

Colloidal synthesis is a cost-effective method enabling the scalable fabrication of quantum dots with size-dependent quantum-confined excitons. However, even slight variations in the parameters of wet synthetic methods may introduce a large variety of particle dimensions, morphologies, compositions, and consequently different optical properties of the obtained nanocrystal. Eliminating variety and achieving uniform properties is of interest to the display industry to obtain more consistent, high-quality products.<sup>1–4</sup>

# Inverse size-dependent Stokes shift in strongly quantum confined CsPbBr<sub>3</sub> perovskite nanoplates†

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Colloidal semiconductor nanocrystals (NCs) are used as bright chromatic fluorophores for energyefficient displays. We focus here on the size-dependent Stokes shift for CsPbBr<sub>3</sub> nanocrystals. The Stokes shift, i.e., the difference between the wavelengths of absorption and emission maxima, is crucial for display application, as it controls the degree to which light is reabsorbed by the emitting material reducing the energetic efficiency. One major impediment to the industrial adoption of NCs is that slight deviations in manufacturing conditions may result in a wide dispersion of the product's properties. A data-driven analysis of over 2000 reactions comparing two data sets, one produced via standard colloidal synthesis and the other via high-throughput automated synthesis is discussed. We show that differences in the reaction conditions of colloidal CsPbBr3 nanocrystals yield nanocrystals with opposite Stokes shift sizedependent trends. These match the morphologies of two-dimensional nanoplatelets (NPLs) and nanocrystal cubes. The Stokes shift size dependence trend of NPLs and nanocubes is non-monotonic indicating different physics is at play for the two nanocrystal morphologies. For nanocrystals with cubic shape, with the increase of edge length, there is a significant decrease in Stokes shift values. However, for NPLs with the increase of thickness (1-4 ML), Stokes shift values will increase. The study emphasizes the transition from a spectroscopic point of view and relates the two Stokes shift trends to 2D and 0D exciton dimensionalities for the two morphologies. Our findings highlight the importance of CsPbBr3 nanocrystal morphology for Stokes shift prediction.

> Years of scientific development on the synthesis of model quantum dot materials have resulted in fine control over their critical physical parameters, facilitating their implementation into a commercial technology. For example, CdSe/CdS<sup>5-8</sup> and InP/ZnS<sup>9,10</sup> have been optimized for use in the display industry. Lead halide perovskite nanocrystals have earned worldwide attention since they exhibited excellent photophysical properties, including high photoluminescence quantum yields (PLQY ~ 50-90%), narrow emission linewidth (70-140 meV), broad absorption, and tunable emission in the entire visible range.<sup>11-13</sup> All-inorganic lead halide perovskites have demonstrated exceptional photovoltaic14 and optoelectronic properties, leading to their incorporation into solar cells,<sup>15</sup> lightemitting diodes, photodetectors, waveguides, and lasers.<sup>16,17</sup> Recent studies on the electronic structure of perovskite quantum dots and defect tolerance are emerging.18-20 However, there are still debates on the underlying photophysical properties and the nature of the emitting state.

> Stokes shift, the difference between absorbing and emitted energies, is a general phenomenon for fluorophores and is associated with energy dissipation *via* vibrational modes. Predicting Stokes shifts of fluorophores for the display industry is crucial, as a measure of the degree of reabsorption of



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light by the emitter which influences reabsorption losses and device energetic efficiencies.<sup>21–23</sup> For nanocrystals the dependence of Stokes shift on NCs size was first observed in colloidal CdSe quantum dots.<sup>24,25</sup> Efros *et al.* showed that the Stokes shifts may vary between ~100 to 10 meV for particle diameters between ~1 and 5 nm. For CsPbBr<sub>3</sub>, a size-dependent Stokes shift has been studied,<sup>26,27</sup> specifically in the cubic morphology revealing the existence of an inherent, size-dependent, confined hole state 260 to 70 meV above the valence band edge state.<sup>28</sup>

Colloidal synthesis of CsPbBr3 was studied intensively in past years,<sup>13</sup> the fast metastasis and the delicate equilibria<sup>29</sup> between ligands and intermediate products result in a complex dependence on the reaction concentrations and conditions. Especially challenging is the synthesis of pure phases of very small monodispersed nanocubes. These are usually accompanied by other morphologies such as nanoplates and lead halide complexes. Previous systematic exploration of the Cs-Pb-Br synthesis space was conducted via a high-throughput automated synthesis by Dahl et al.<sup>30</sup> The study portrayed the formation reactions under varying starting conditions generating vast amounts of data on the precursors, intermediates, and products. However, such an approach was limited by cleaning steps using a centrifuge. In this study, we, therefore, complemented the data with results from many standard manual reactions we conducted.

To analyze this vast amount of data and get a clear understanding of Stokes shift engineering and rational selection of starting conditions we utilize a data-driven approach.

We have cleaned and analyzed UV-Vis absorption and emission data from both datasets using statistical methods. The first dataset is a collection of 672 manual syntheses, and its preparation process is extensively explained in the Experimental section. Most of the syntheses were made using



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heads an independent research group, holding an ERC Starting Grant (Heteroplates). His major research interest is discovering new materials and designing their properties for the benefit of mankind. His current focus is excitonic collective interactions in perovskite nanocrystals. oleic acid ligands, but additional samples of other ligands were also present. These syntheses aimed to produce a pure single phase of the CsPbBr<sub>3</sub> perovskites complemented by a cleaning step using a centrifuge. The second dataset is based on a high-throughput automated synthesis by Dahl *et al.*<sup>30</sup> The aim of that study was to explore the chemical parameter space of the Cs–Pb–Br nanocrystal system and factorial sets of 1351 automated experiments were performed on a synthesis robot. The resulting samples contained a mixture of phases of the Cs–Pb–Br space, including non-perovskite phases. For this study, we have selected only those products which show significant fractions of perovskite phase products.

Spectroscopic studies of nanocrystals produced by the two synthetic methods show that the size-dependent Stokes shift between nanoplates and nanocubes is non-monotonic and even not continuous when reaching the nanoplate regime. This non-monotonic trend originates from the quantum and dielectric confinement effect, which plays a significant role in 2D and intermediate (2D/3D) materials. Size-dependent Stokes shift was discussed by Brennan *et al.* for cubes,<sup>26</sup> and here we compare and extend this model also to two-dimensional nanoplates.

#### **Experimental section**

#### Manual synthesis

**Materials.** Acetone (A.R., Aldrich), benzoyl bromide (97%, Aldrich), butylamine (BA, 99%, Aldrich), cesium carbonate ( $Cs_2CO_3$ , 99.9%, Aldrich), hexane (A.R., Aldrich), lead acetate trihydrate (99.99%, Aldrich), lead bromide (Puratronic, 99.998% (metalsbasis), Alfa (Aesar), octadecylamine (ODA, 90%, Aldrich), octylamine (OTA, 99%, Aldrich), oleic acid (OA, 90%, Aldrich), oleylamine (OLA, 70%, Aldrich), propylamine (PA, 98%, Aldrich), toluene (A.R., Aldrich). All chemicals were used as purchased without further purification.

1 ML synthesis. Single monolayer NPs were synthesized similarly to a published procedure by Dahl *et al.*<sup>30</sup>

Lead oleate preparation. 380 mg (1 mmole) lead acetate trihydrate powder was mixed with 1.6 ml (5 mmol) OA. The sample was heated for 4 hours while stirring at 100 °C until no bubbles were apparent and a light yellow-brown color ensures complete solubilization of the lead powder in the OA. The solution was briefly reheated before synthesis to ensure dissolution and thorough mixing of precursors.

*Preparation for synthesis with ODA.* 41 mg (1.52 mmol) of ODA powder was mixed with 2.4 m hexane for half an hour before synthesis. The rest of the synthesis was made as mentioned below without adding the amine source.

Single monolayer NPLs synthesis. In a typical synthesis, 37.5  $\mu$ l of OA, 1.52 mmol of alkylamine ligand, 25  $\mu$ l of lead precursor (0.0156 mmol) were mixed and diluted with 2.35 ml hexane in an 8 ml vial, at room temperature. 38  $\mu$ l of benzoyl bromide (0.32 mmol) was added to perform the reaction. Then, after about 10 seconds, a white translucent solution was observed, and the solution became turbid. The synthetic

mixture was centrifuged at 10k rpm for 10 min to obtain the precipitate solution. After centrifuge, the precipitate was redispersed in 3 ml hexane for characterization and future use.

**Larger NPLs and cubes synthesis.** CsPbBr<sub>3</sub> NPLs are synthesized following a published procedure by Imran *et al.*<sup>31</sup> with slight modifications.

Cesium oleate precursor preparation. 19.3 mg (0.06 mmol) of cesium carbonate powder was dissolved in 10 mL of OA at 100  $^{\circ}$ C under continuous stirring. After 1 hour, the solution was cooled down to room temperature and stored for further use.

Lead bromide precursor preparation. 36.7 mg (0.1 mmol) of lead bromide powder (PbBr<sub>2</sub>) was dissolved in 10 mL of toluene with 100  $\mu$ l of OLA and 100  $\mu$ l of OA at 100 °C under continuous stirring. After 1 hour, the solution was cooled to room temperature and stored for further use.

Synthesis of CsPbBr<sub>3</sub> NPLs. To control their thickness, a certain amount of Cs–oleate precursor (10  $\mu$ l–3 ml) was added to 1 ml of lead bromide solution under vigorous stirring. After 5 s, 1 ml of acetone was added into the solution as an antisolvent. After 1 min of stirring, the solution was centrifuged at 4000 rpm for 3 min. The precipitate was redispersed in 2 ml of hexane.

Absorption and emission spectra. Optical measurements were taken using a Synergy H1 hybrid multi-mode reader. The irradiation source is a xenon lamp (Xe900). The Bio-Tek microplate spectrometer can perform high throughput optical characterization. 200  $\mu$ l of the sample solution was injected into a 96 well microplate for the measurement. Absorption spectra were recorded from 250 to 700 nm in 1 nm increments, while emission spectra were recorded from 400 to 700 nm in 1 nm increments with an excitation wavelength of 370 nm.

Automated experimental data. The absorption, emission, and product fractions of automated synthesis experiments

were obtained from a previously published dataset that is publicly available on Dryad.<sup>17</sup>

### Results & discussion

#### Data preprocessing

To compare the Stokes shift of manual and automated datasets, we review the records of the concentrations of precursors, the emission and absorption spectra, and the fractions of the different  $CsPbBr_3$  product morphologies. Fig. 1a, b and c show representative TEM images of the different NCs morphologies, nanocubes, and nanoplates (NPLs) ensembles from the manual dataset, correspondingly. Absorption and emission spectra of selected samples from the automated dataset are presented in Fig. 1d. As expected, the emission peaks are shifted from the band edge exciton state.

The first step of data analysis was to fit the emission and absorption spectra to Gaussian functions using automatic curve algorithms, to extract the corresponding Stokes Shift (examples can be seen in Fig. S2†). For the manual dataset, labeling of emission and absorption peaks was straightforward due to the uniformity of the samples after purification *via* centrifuge. The automated datasets demanded further statistical cleaning. This is since the products were not purified by centrifuge and contain a distribution of nanoplatelet thickness (see Fig. S2†). The fraction of the multiple morphologies of Cs–Pb–Br space was determined using deconvolution of the absorption spectra (for details see our previous work).<sup>30</sup>

We only use samples with a fraction higher than 0.82 with a specific emission line corresponding to homogenous thickness distribution. Finally, after these data filtering steps, we summarized the spectroscopic absorption and emission

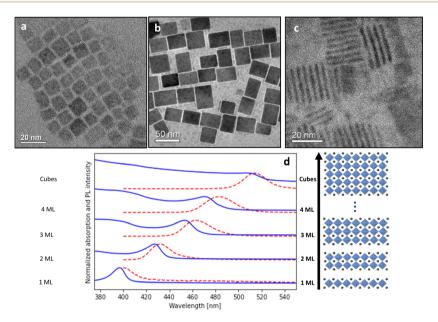


Fig. 1 TEM and spectroscopy of nanocubes and NPLs. TEM micrographs of CsPbBr<sub>3</sub> nanocubes (a) and NPLs (b and c). Absorption (solid blue lines) and emission (dashed red lines) spectra of ensembled CsPbBr<sub>3</sub> NCs, corresponding to 1, 2, 3, 4 ML and cubes (d).

Table 1 Distribution of the sample's absorption and emission energy extracted from the automated dataset. The statistical mean and stand	lard devi-
ation (std) were measured on multiple reactions for each energy range	

Morphology	$E_{\rm ab} \left[ {\rm eV}  ight]$	Count	Absorbance [eV]		Emission [eV]		Stokes shift [meV]	
			Mean	Std	Mean	Std	Mean	Std
1 ML	(3, 3.2]	2	3.12	0	3.09	0	31.3	0
2 ML	(2.8, 3]	134	2.89	0.02	2.86	0.03	25.4	10.3
3 ML	(2.7, 2.8]	45	2.74	0.02	2.69	0.02	49.5	22.3
4 ML	(2.58, 2.7]	18	2.64	0.02	2.56	0.03	76.6	17.4
Cubes	(2.53, 2.58]	3	2.56	0.02	2.48	0.02	70.3	4.2
	(2.5, 2.53]	0						
	(2.48, 2.5]	3	2.49	0.01	2.44	0.003	55.6	4.4
	(2.46, 2.48]	2	2.47	0.01	2.43	0.01	40.4	2.9
	(2.43, 4.46]	3	2.45	0.005	2.41	0.002	35.7	3.3
	(2.41, 2.43]	2	2.42	0.01	2.40	0.004	19.5	2.8
	Total	212						

Table 2 Distribution of the sample's absorption and emission energy from the manual dataset

Morphology	$E_{\mathrm{ab}}\left[\mathrm{eV} ight]$	Count	Absorbance [eV]		Emission [eV]		Stokes shift [meV]	
			Mean	Std	Mean	Std	Mean	Std
1 ML	(3, 3.2]	132	3.12	0.03	3.06	0.03	62.5	16.7
2 ML	(2.8, 3]	35	2.89	0.03	2.81	0.04	78.2	18.3
3 ML	(2.7, 2.8]	60	2.76	0.03	2.69	0.03	68.7	12.4
4 ML	(2.58, 2.7]	5	2.67	0.02	2.60	0.01	71.8	9.7
Cubes	(2.53, 2.58]	1	2.57		2.51		64.6	
	(2.5, 2.53]	1	2.52		2.46		53.3	
	(2.48, 2.5]	0						
	(2.46, 2.48]	0						
	(2.43, 4.46]	0						
	(2.41, 2.43]	3	2.42	0.01	2.38	0.002	43.1	3.5
	(2.38, 2.41]	5	2.39	0.004	2.36	0.007	26.5	6.4
	(2.1, 2.38]	13	2.38	0.005	2.36	0.009	12.6	9.1
	Total	256						

measurements from 212 "winning" samples in the automated dataset (Table 1) and 256 samples in the manual dataset (Table 2). The dataset is separated into regions according to different morphologies of the samples: 1, 2, 3, 4 ML, and nanocubes with increasing wavelength.

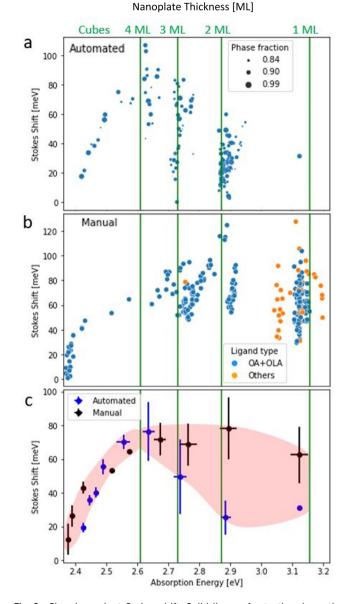
The Stokes shift of the automated dataset with a phase fraction more significant than 0.82 and manual dataset were plotted versus the typical absorption (emission) energy, as shown in Fig. 2a and b (Fig. S5a and b<sup>†</sup>), respectively. The same trend can be seen in both datasets for the cube morphology, in which the average Stokes shift values decrease from 70 to 10 meV with increasing nanocube size. However, for the NPLs regime, there is an increase from 20 to 70 meV with increasing NPLs thickness from 1 to 4 ML (automated dataset). But for the manual dataset, the NPLs Stokes shift values stay constant at approximately 70 meV. The above are averaged values while in practice there is a statistical spread the typical absorption wavelength for around all morphologies.<sup>32,33</sup> For NPLs, the thickness is atomically defined and there is little inhomogeneity. The observed statistical variance is due to the NPLs lateral size inhomogeneity and inconsistent surface passivation due to the dynamic nature of the ligand.34

Another ligand-based effect can be seen in the manual dataset, a minority of the 1 ML samples were prepared using shorter ligands than oleic acids, such as butylamine or unsaturated chain octadecylamine. These variations result in a blue/red shift of both emission and absorption peaks (Fig. 2b). However, this shift does not affect the value of Stokes shift since it affects the absorption and emission in a similar way.

We note in passing that the clusters in Fig. 2a and b have a slight slope, which creates a form of parallel stripes in the NPLs region. Moreover, the slopes at the absorption figure are opposite to the slopes at the emission (Fig. S4 and S5a and b†). The reason for this slope is not intrinsic. Instead, it comes from the definition of Stokes shift and its mathematical dependence of the emission and the absorption wavelengths, *i.e.*:

$$\Delta E_{\rm s} = E_{\rm abs} - E_{\rm em}. \tag{1}$$

In eqn (S4) and (S5)<sup>†</sup> we show that the slopes follow this dependence for each cluster locally. In addition, the slopes at the emission and the absorption figures are opposite, simply due to the sign of the corresponding term in the Stokes shift equation (eqn (1)). In Fig. S6 and S7<sup>†</sup> a standard deviation of 9 to 16 meV in the Stokes shift stems from the fact that emission



**Fig. 2** Size dependent Stokes shift. Solid lines refer to the absorption energy, which corresponds to reported values of 1, 2, 3, and 4 ML.<sup>32,33</sup> Stokes shift *versus* the absorbance energy in the automated dataset. The size of the data point corresponds to the maximal fraction of the phase in the sample (a). Stokes shift *versus* the absorbance energy in the manual dataset. The color of the datapoint refers to ligand type (b). Averaged results of Stokes shift *versus* the absorption energy for automated (blue) and manual (black) datasets as well (c).

data was extracted from experimental results, and encompasses an instrument measurement error. Such deviation of the absorption and emission wavelength directly affects the extent of the variance portrayed in the slopes (Fig. 2a and b).

To understand the behavior of each cluster, we summarized the Stokes shift values for both datasets. Fig. 2c compares the Stokes shift in NPLs and nanocubes. With the increase of absorption wavelength (*i.e.*, the size of the NCs), the trend of Stokes shift is negative for cubes in both datasets. However, for NPLs, we can see a positive increase in Stokes shift for the automated method. Whereas in the manual method values are distributed around 70 meV. In both datasets there are significant error bars (<35 meV), which originate from concentration and reabsorption effects<sup>24,28</sup> (see Fig. S8c†). However, these do not obscure the different observed trends for cubes and nanoplates.

Two control measurements and analysis further reassure our observations. First, two different solvents were tested (ODE, hexane) with no significant effect beyond that of the concentration mentioned earlier (Fig. S8a and b<sup>†</sup>).

It is important to note that usage of only high purity fraction data does not statistically shift our results as shown in the analysis in ESI (Fig. S9<sup>†</sup>). Stokes shift values for full fraction samples are within the average value of the Stokes shift of the mixed fraction samples.

To better understand the origin of the two different Stokes shift trends nanocubes vs. nanoplates we examine current theoretical modeling. The general expression for the band edge excitonic energy is defined as:<sup>35,36</sup>

$$E_{\rm x} = E_{\rm g} + (E_{\rm e} + E_{\rm h}) - E_{\rm c} - B_{\rm x}$$
 (2)

In eqn (2),  $E_g$  is the bulk bandgap,  $E_e$  and  $E_h$  represent the kinetic energy of the electron and hole, respectively, while  $E_{\rm c}$  is the energy of their Coulomb attraction. The last term,  $B_x$ , is the exciton binding energy associated with the relative motion of the electron and hole. For the different CsPbBr<sub>3</sub> morphologies, NPLs and cubes, these terms result from different physical effects.<sup>37</sup> We split our analysis into two parts: the cube-shaped NCs and NPLs. Parameters and equations used for the following analysis are shown in Table S1.<sup>†</sup> Since the physical models depend on L, the edge length of the NCs, a transformation of the absorption wavelength to the edge length was carried out. For NPLs, each number of layers *n* has its distinct absorption and emission peaks, and the thickness is simply  $L = n \cdot 0.6 [nm]$ , where n is number of layers and 0.6 nm is the unit cell thickness. For cubes, we used approximated values according to previous results of Brennan et al.27 (Fig. S10<sup>†</sup>). For reference, we compare our analysis to experimental data in studies of Bernnan et al.<sup>27</sup> and Protesescu et al.<sup>11</sup> for the cube shaped NCs, and to Bekenstein *et al.*<sup>32</sup> and Bohn *et al.*<sup>33</sup> for the NPL morphology. As can be seen in Fig. 3a, the trend of the excitonic energy for the cubes and NPLs is not continuous, there is an energy decrease of ~0.25 eV at an edge length of 4 nm. In order to understand the discontinuous trend of the exciton energy, we compared our experimental excitonic energy to theoretical models by Efros et al. 38,39

$$E_{\rm x} = \begin{cases} E_{\rm g} + \frac{\hbar^2 3\pi^2}{2\,\mu {\rm L}^2} - 3.05 \frac{e^2}{\varepsilon_{\rm QD}L} & L \ll a_{\rm x} & \text{Strong confinement} \quad (3) \\ E_{\rm g} + \frac{\hbar^2 3\pi^2}{2{\rm M}{\rm L}^2} - B_{\rm x} & L \gg a_{\rm x} & \text{Weak confinement} \quad (4) \end{cases}$$

Were,  $\mu = \left(\frac{1}{m_e} + \frac{1}{m_h}\right)^{-1}$ ,  $M = m_e + m_h$ . Here,  $m_e$  and  $m_h$  are the effective mass of the electron and hole, respectively and  $\varepsilon_{\rm QD}$  is the dielectric constant of the quantum well. The exciton energy in confined systems is separated into three confine-

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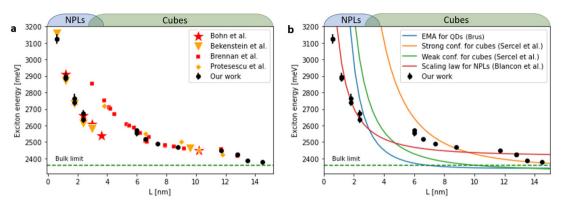


Fig. 3 Exciton energy of cubes and NPLs as compared to previous research. Experimental automated and manual exciton energies compared to those extracted from existing literature (a) and to theoretical models (b) for cubes and NPLs.

ment regimes: weak, strong, and intermediate. In the strong confinement regime, valid when the NC edge length is much smaller than the exciton radius of the material ( $L \ll a_x$ ), correlation of the electron-hole motion can be neglected, and the exciton energy scales as the inverse square of the NC size ( $1/L^2$ ). For cube-shaped NCs in this regime, the exciton energy is determined by eqn (3).

The opposite limit of the strong confinement regime is the weak confinement when L is much larger than the exciton radius  $(L \gg a_x)$ . In this weak confinement regime, the electron-hole motion is strongly correlated, and the whole exciton exhibits quantum confinement.  $E_x$  is determined in the weak confinement regime in cube-shaped NCs by eqn (4). We note in passing that between these two confinement regimes described above, an "intermediate" confinement regime exists. In order to explain the distinct behavior of the exciton energy between NPLs and nanocubes (eqn (5)) the accepted Brus model<sup>40</sup> for QDs confinement was taken into account.

$$E_{\rm x} = E_{\rm g} + \frac{\hbar^2 \pi^2}{2\,\mu {\rm L}^2} - 1.8 \frac{e^2}{\varepsilon_{\rm QD} L} + \beta \frac{e^2}{\varepsilon_{\rm QD} L} \tag{5}$$

We approximate  $\beta \sim 0$  for the polarization (solvation) term.

A third model that is presented is an empirical model of Blancon *et al.*<sup>41</sup> for the exciton binding energies of low dimensional systems.<sup>42</sup> This model considers both quantum and dielectric confinement effects in a single law-scale formula, with exciton energy described as follow:

$$E_{\rm x} = E_{\rm g} + \frac{E_0}{\left(1 + \frac{\alpha - 3}{2}\right)^2} \quad \alpha = 3 - \gamma e^{-\frac{L_{\rm w}}{2a_{\rm x}}} \tag{6}$$

Here, the second term is the exciton ground state binding energy, where  $E_0$  (16 meV) and  $a_x$  (4.6 nm) are the 3D Rydberg energy and Bohr radius of 3D perovskites,<sup>43</sup> respectively, and  $L_w$  is the quantum well thickness. In this model, the exciton is considered isotropic in  $\alpha$ -dimensional space ( $\alpha$  strictly greater than 1 and smaller than 3) where  $\gamma$  is an empirical correction factor that accounts for the deviations from the pure quantum confinement regime, including electron and holes densities and dielectric confinement effects. In our case:  $\gamma_{\text{Empirical}} = 1.76$   $1 \leq \gamma \leq 3$ . Other less successful models for NPLs were tested (see Fig. S11†).

The best-fitting model with both automated and manual datasets for exciton energies is the scaling law model (Blancon *et al.*<sup>41</sup>) (see Fig. 3b). The decrease in the dimensionality highlights additional compression of the exciton wavefunction in the quantum well due to dielectric confinement, which results in enhanced values of exciton binding energy compared to merely including the quantum confinement effect as for the nanocubes. Blancon *et al.* in their empirical model explain that the overlap of the electron and hole wavefunctions, whose convolution forms the exciton ground state, becomes more pronounced towards the center of the perovskite layer with increasing thickness.<sup>41</sup> This is consistent with the fact that with increasing perovskite layer thickness, the strength of dielectric confinement.

We thus conclude that the trend of increasing exciton energy with decreasing size for the scaling law model of the NC is less sensitive to dielectric confinement compared to other models and therefore may better explain the discontinuity of exciton energy when transitioning to the NPLs and twodimensional excitonic regime.

Further support to this conclusion comes from comparison to the study of size-dependent Stokes shift in CsPbBr<sub>3</sub> nanocrystals conducted by Brennan *et al.*<sup>27</sup> In their report, they showed that spatial distribution of the hole in CsPbBr<sub>3</sub> NCs is delocalized over the entire nanocrystal, and therefore referred to it as confined hole state (CHS). They calculate the electronic structure and hypothesize the existence of a size-dependent CHS from 260 to 70 meV for particles with sizes between ~2 and 5 nm (measured above the valence band) (Fig. 4a). Similarly, to their representation, we plot the calculated conduction and valence band-edge states (CBES, VBES) from the measured absorption and emission transitions with respect to the CHS, which is set to zero. These calculated energy levels could be used as a reference point in future theoretical work

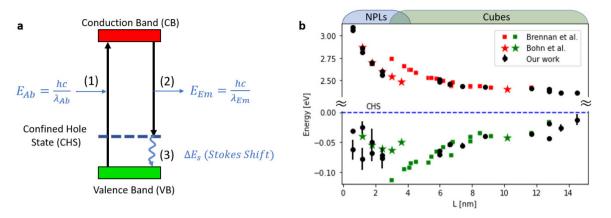


Fig. 4 (a) Schematically energetic ordering of relevant absorption and emission transitions within CsPbBr<sub>3</sub> NCs (a). Size-dependent NC emission and absorption with theoretical calculation of CBES and VBES energies, plotted relative to CHS energies, which are set to zero (b).

on the exciton dynamics of 1D confined NPLs. For reference, the VBES and CBES values of Brennan *et al.*<sup>27</sup> are also plotted (Fig. 4b).

We find agreement between our data for cubic shaped NCs and Brennan's previous work. However, the extension of experiments to NPLs and two-dimensional exciton confinement regime is not trivial. In our measured data the trend becomes non-monotonic and even not continuous. This is clearly shown as a marked decrease in Stokes shift values from 70 to 20 meV for NCs with emission central wavelength of 456 nm (3 ML thickness nanoplates), highlighting the transition from 3D confined excitons to that which is dominated by two-dimensional excitonic dynamics.

When L < 2 nm there is a clear dominance of the NPLs and two-dimensional excitons. Further support to the two-dimensional excitonic behavior for the NPLs regime, is apparent from the agreement to the study of Bohn *et al.*<sup>33</sup> which ultimately focuses on two-dimensional NPLs.

The physical basis to the opposing trends in Stokes shift with size appears to be a more general phenomenon than just 3D and 2D perovskites. In 3D confined quantum dots, smaller sizes lead to larger Stokes Shifts, not only in the CsPbBr<sub>3</sub> system discussed here, but also in CsPbI<sub>3</sub> and CsPbCl<sub>3</sub>.<sup>28</sup> CdSe,<sup>44,45</sup> PbS,<sup>46</sup> ZnSe, and InP.<sup>47</sup> Conversely, for 1D confined NPLs, the Stokes shifts are generally much smaller than expected<sup>48</sup> and may follow no particularly discernible trend with changes in thickness, as in the CdSe nanoplates,<sup>49,50</sup> or perhaps even increase with increasing thickness, as shown in this work for CsPbBr<sub>3</sub> NPLs and observed elsewhere for (CH<sub>3</sub>(CH<sub>2</sub>)<sub>3</sub>NH<sub>3</sub>)<sub>2</sub>(CH<sub>3</sub>NH<sub>3</sub>)<sub>n-1</sub>Pb<sub>n</sub>I<sub>3n+1</sub> thin films<sup>51</sup> or GaAs quantum dots with variable thickness and the same diameter.<sup>52</sup>

The cause of this difference between 3D and 2D Stokes shift is not obvious. Conventional approaches suggest that increasing linewidths lead to larger Stokes shifts,<sup>53</sup> and for 3D confined systems, the same size dispersion at a smaller size will result in a larger linewidth.<sup>54</sup> This leads to increasing Stokes shift with decreasing size. However, single-particle

measurements,<sup>28</sup> as well as theoretical work, suggest that part or all the increase in Stokes shift may originate from other physical effects. For example, due to changes to the energy level of a dark confined hole state with respect to the valence band edge,<sup>27</sup> changes to the exciton fine structure,<sup>44</sup> or changes to the electron-hole exchange splitting.45 Considering layered perovskite NPLs, in most syntheses decreasing thickness leads to increasing lateral size,<sup>32</sup> a phenomenon that may be explained by equilibria among lead halide precursor nanostructures.<sup>30</sup> Conversely, 2D CdSe NPLs do not appear to have this strong inverse correlation between layer thickness and lateral NPL size, which may explain why Stokes shift does not appear to follow any trend for those materials. Given the variability of trends in Stokes shift for 3D/2D confined materials, more experimental studies that follow a data-driven approach of mapping the synthetic landscape are crucial for portraying a more general understanding beyond the examples of 2D perovskites discussed here. For CsPbBr3 nanocrystals, possibilities for future rational synthetic engineering of Stokes shift based on reaction conditions are presented in Fig. S12.† The spread of values marks that no specific single factor which was selected for analysis is responsible for the size-dependent Stokes Shift. Mutual correlation of these factors is needed and will be considered an extension of this work in the future.

The effects studied here are primarily affected by the excitons' strong/weak confinement regimes in nanoplates/nanocubes, respectively. Thus, we restrict this study to the thicknesses and dimensionality at room temperature. Further temperature dependence spectroscopical studies are in order to understand phonon–exciton interactions. Previous studies on CdSe nanoplates<sup>55,56</sup> show that differences in the area of the nanoplates will affect the charge carrier–phonon coupling. This effect is a general physical phenomenon and could also exist in perovskite nanoplates measured under the right conditions. We are confident that such studies and understanding will be complemented in future years.

To conclude, we analyze data from  $\sim$ 2000 reactions conducted with both automated and manual synthesis spanning a

broad synthetic condition landscape. This variety reveals that for CsPbBr<sub>3</sub> NPLs with 2D confined excitons, Stokes shift appears to decrease or remain constant. This observation adds to previously reported Stokes shift in nanocubes in which excitons are confined in three dimensions. It is therefore apparent that at these wavelengths, two-dimensional nanoplates with thicknesses nearing a few unit cells, two-dimensional excitons dominate the resulting excitonic dynamics.

## Conflicts of interest

The authors declare no competing interests.

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