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# A quest for ideal electric field-driven MX@C<sub>70</sub> endohedral fullerene memristors: which MX fits the best?<sup>†</sup>

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Endohedral fullerenes with a dipolar molecule enclosed in the fullerene cage have great potential in molecular electronics, such as diodes, switches, or molecular memristors. Here, we study a series of model systems based on MX@D<sub>5h</sub>(1)-C<sub>70</sub> (M = a metal or hydrogen, X = a halogen or a chalcogen) endohedral fullerenes to identify potential molecular memristors and to derive a general formula for rapid identification of potential memristors among analogous MX@C<sub>n</sub> systems. To obtain sufficiently accurate results for switching barriers and encapsulation energies, we perform a benchmark of ten DFT functionals against *ab initio* SCS-MP2 and DLPNO-CCSD(T) methods at the complete basis set limit. The whole series is then investigated using the PBE0 functional which was found to be the most efficient vs. the *ab initio* methods. Nine of the 34 MX@C<sub>70</sub> molecules studied are predicted to have suitable switching barriers to be considered as potential candidates for molecular switches and memristors. We have identified several structure–property relationships for the switching barrier and response of the systems to the electric field, in particular the dependence of the switching barrier on the available space for M–X switching and faster response of the system to the electric field with a larger dipole moment of MX and MX@C<sub>70</sub>.

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<sup>†</sup> Electronic supplementary information (ESI) available: Relative energies of endohedral NaCl@C<sub>70</sub> and endo-exohedral Na@C<sub>70</sub>-Cl isomers (Table S1) and their geometries (Fig. S1). Natural charges of C<sub>70</sub> and KF@C<sub>70</sub> (Fig. S2). Basis set convergence at the *ab initio* level (Tables S2, S3 and Fig. S3). Switching barriers and encapsulation energies calculated using various *ab initio* and DFT methods (Tables S4–S8, S20 and S21). Structural parameters (selected bond lengths and root-mean-square differences of atomic positions) of molecular structures optimized with different methods (Tables S9 and S11–S19). SCS-MP2 single-point energies of DFT optimized structures (Table S10). A scheme of the potential energy hypersurface of MO@C<sub>70</sub> systems with additional local minima (Fig. S4). Contributions to intrinsic switching barriers (Fig. S5). Electronic structure properties of the studied systems calculated at the PBE0-D3 level (Table S22). The correlation between the intrinsic switching barrier and the difference of the C<sub>70</sub> width and MX bond length (Fig. S6). Switching barriers calculated employing energies and enthalpies at 298.15 K (Table S23). Extrapolations of the barrier-voltage dependences for systems with a barrier between 10 and 50 kcal mol<sup>-1</sup> (Fig. S7). The correlation among switching barriers, estimated switching voltages, and dipole moments of the free MX (Fig. S8). See DOI: <https://doi.org/10.1039/d3cp01149f>

## 1. Introduction

Owing to the continually increasing demand for computational power, society seeks new ways and technologies to make computing faster and more powerful. The growth of computational power is currently most successfully being pushed forward through an increasingly efficient parallelization<sup>1,2</sup> and ongoing miniaturization, with the ultimate vision of devices made of single-molecule components. A possible way of continuing the current performance scaling trend is switching from the traditional von Neumann architecture (the data are stored in the memory unit and processed in the processor) to a new type of logic circuits<sup>3–5</sup> and employment of the in-memory computing<sup>6–8</sup> using memristors, devices whose conductivity at present is defined the current that has passed through them in the past.<sup>9,10</sup> In recent years, the design of memristor-based logic circuits has attracted the attention of many research groups.<sup>4,8,11–17</sup> Memristors can be considered as a single circuit element or as a combination of a resistor and a switch/rheostat.<sup>18</sup> They are promising devices, yet only a few examples of a memristor are known in the realm of molecular electronics.<sup>19–25</sup> Classical computers suffer from energy dissipation and latency due to the data transfer between the processing and storage units, *i.e.*, the von Neumann bottleneck. Because a



memristor can serve at the same time as a memory unit and as a processing unit, the energy dissipation is decreased, and the latency implied by the data transfer between the memory and processing units is reduced to a minimum.

In our pilot studies, we predicted that endohedral fullerenes with general formula  $\text{MX}@C_n$  (where M is a metal or hydrogen, X a nonmetal, and  $C_n$  an elliptical fullerene, for example,  $D_{5h}(1)\text{-C}_{70}$ ) behave like molecular memristors.<sup>25,26</sup> According to our predictions, a sufficiently large applied external field may enable switching between the local minima (states) of MX in  $C_{70}$  ('writing regime'), which in turn leads to differential conductivity of the molecule that can be recognized ('reading regime') by a small voltage applied on the electrodes, *vide infra*. We have labelled this system as a switching diode; however, the conductance hysteresis of such a system reminds that of a memristor.<sup>25,26</sup> The predicted principle as such was recently experimentally proven on two analogous systems:  $\text{Gd}@C_{82}$ , coined as a molecular electret,<sup>20</sup> and  $\text{Sc}_2\text{C}_2@C_s(\text{hept})\text{-C}_{88}$ , coined as a logic-in-memory device.<sup>24</sup> In  $\text{Gd}@C_{82}$ , the  $\text{Gd}^{3+}$  ion inside the cage moves to utilize a voltage applied at the gate electrode ( $V_G$ ) which leads to distinct conductivity modes of the molecule with respect to the voltage applied on the source and drain electrodes ( $V_{SD}$ ). This system operates at a temperature of 1.6 K. In  $\text{Sc}_2\text{C}_2@C_s(\text{hept})\text{-C}_{88}$ , switching between conductivity states is realized *via* voltage-induced changes in the geometry of the encapsulated  $\text{Sc}_2\text{C}_2$  moiety that is also related to a change of the dipole moment in the system. Here, the switching is operated only using one pair of electrodes, in a similar way to our pilot proposal of  $\text{MX}@C_{70}$  devices.<sup>26</sup> The  $\text{Sc}_2\text{C}_2@C_s(\text{hept})\text{-C}_{88}$  device was shown to successfully perform Boolean logic operations at room temperature, suggesting that endohedral fullerenes are indeed feasible candidates for the design of new molecular devices.<sup>25,26</sup>

In this work, encouraged by the experimental confirmation of the predicted principles, we perform a computational pre-screening for new memristor-like molecules based on 34  $\text{MX}@D_{5h}(1)\text{-C}_{70}$  endohedral fullerene systems, where M is a metal or hydrogen, and X is a halogen or a chalcogen. Notably, analogous  $\text{MX}@C_n$  systems – though with larger fullerene cages – have been spotted in mass-spectroscopic studies; namely one or both of the  $\text{LuCl}@C_2(99\ 917)\text{-C}_{90}$  and  $\text{LuCl}@C_2(99\ 914)\text{-C}_{90}$  isomers<sup>27</sup> and also the series of sodium halide fullerenes  $\text{NaCl}@C_{2n}$  ( $2n = 120\text{--}244$ ),  $\text{NaBr}@C_{2n}$  ( $2n = 110\text{--}240$ ), and  $\text{NaI}@C_{2n}$  ( $2n = 116\text{--}198$ ).<sup>28</sup> One of the referees of this work suggested that the existence of endohedral  $\text{NaCl}@C_{2n}$  species is unlikely because of the lack of charge transfer between the metal atom and the cage which should contribute to the stabilization of such endohedral species. In the ESI,<sup>†</sup> we present an *in silico* proof that the endohedral ( $\text{NaCl}@C_{70}$ ) system is by *ca.* 40–60 kcal mol<sup>-1</sup> more stable than the endo-exohedral ( $\text{Na}@C_{70}\text{-Cl}$ ) species in various binding modes, see Table S1 and Fig. S1 (ESI<sup>†</sup>). Furthermore, various endohedral fullerenes with the general formula of  $\text{M}_2\text{X}@C_n$  have also been prepared to date.<sup>29–32</sup>

Although the large-scale synthesis of the  $\text{MX}@C_{70}$  systems studied here seems to be inaccessible at the moment,

molecular surgery methods come across as a step in the right direction.<sup>33–36</sup> Very recently, Gao *et al.*<sup>37</sup> successfully performed insertion of LiF and  $[\text{BeF}]^+$  into an open-cage  $C_{60}$  fullerene. This was enabled thanks to the interaction of the 'bait' hydroxy groups at the rim of the orifice with the metal atom.<sup>37</sup> Because the subsequent closing of the open-cage fullerene is sometimes possible,<sup>33,38</sup> the suggested  $\text{MX}@C_{70}$  species may be very probably eventually synthesized and employed in molecular circuits.

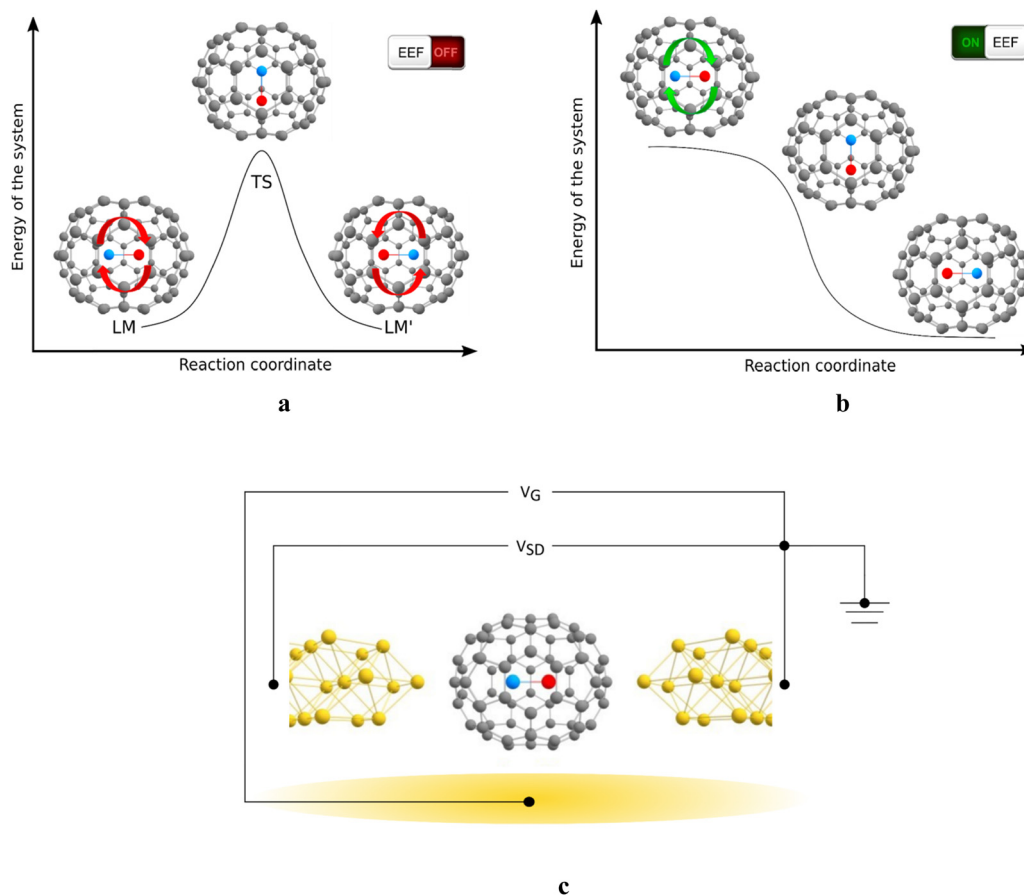
The studied  $\text{MX}@C_{70}$  systems and their function are illustrated in Fig. 1. In an  $\text{MX}@C_{70}$  fullerene memristor, the dipolar MX molecule polarizes the electrons of the fullerene shell (an example is shown in Fig. S2, ESI<sup>†</sup>) and makes the whole system behave like a p–n junction, *i.e.*, a diode, when a low  $V_{SD}$  (to prevent switching) is applied between the source and the drain electrodes.<sup>25,26</sup> Geometrically, the MX lies on or close to the longest axis of symmetry of the elliptical  $C_{70}$  cage, see Fig. 1. This creates a bistable system with two local minima, LM and LM', connected *via* a (presumably one) transition state, TS, see Fig. 1a. Note that this principle can be applied also to other elliptical cages, such as  $C_{78}$  or  $C_{90}$ .<sup>39</sup> In the  $D_{5h}(1)\text{-C}_{70}$  cage studied here, the LM and LM' are equivalent in a free molecule but once the  $\text{MX}@C_{70}$  is inserted in an electric circuit, LM and LM' become two different states with respect to the polarity of the voltage applied to the device.

Under certain conditions, the MX can be flipped between the LM and LM', for example, when the applied  $V_{SD}$  surpasses a threshold that changes the nature of one of the minima to a transition state, Fig. 1b. Both the size of the switching barrier, *i.e.*, the barrier against the MX flip and the response to the applied electric field (EF) depend on the type of the cage and the enclosed MX. The switching can be facilitated by an additional voltage applied through the gate electrode ( $V_G$  in Fig. 1c) the role of which is to stabilize the TS *via* EF–dipole interaction.<sup>20,25</sup> We have previously predicted that  $V_G$  of 0.8 V Å<sup>-1</sup> acting upon an arbitrary  $V_{SD}$  leads to a further minimization of the switching barrier by *ca.* 1.5–4.0 kcal mol<sup>-1</sup> (depending on the particular system). Because this effect is rather marginal, we use a two-electrode setup that mimics the  $\text{Sc}_2\text{C}_2@C_s(\text{hept})\text{-C}_{88}$  experiment discussed above.<sup>24</sup> Switching the MX between LM and LM' changes the polarity of the  $\text{MX}@C_{70}$  molecule, and consequently its transmission properties.<sup>25</sup>

Because the synthesis of endohedral fullerenes is typically a tedious procedure<sup>40–43</sup> involving a stochastic cage formation and subsequent time-consuming purification, or a multistep fullerene surgery synthesis,<sup>33–36</sup> one can use the advantages of computational chemistry and pre-select proper systems by a computational screening. A functional fullerene memristor should feature two key properties:

(i) The system should have a suitable intrinsic switching barrier (ISB) that is high enough to keep the state of the memristor intact in the absence of the external voltage or when low 'measuring' voltage is applied. The switching barrier should drop fast enough with an applied voltage to make the flipping of MX ('writing of the state') possible. If the barrier is too high, the system may undergo ionization instead of





**Fig. 1** The principle of an MX@C<sub>70</sub> molecular memristor (EEF stands for the external electric field). (a) MX@C<sub>70</sub> with two local minima (LM and LM') separated by a transition state (TS) with an energy barrier. (b) Upon application of external voltage, one of the local minima becomes unstable. This leads to the rotation of MX between LM and LM' (or LM' to LM), and thus to the switching of the system's polarity and conductivity. (c) The four-electrode setup in which the source–drain voltage ( $V_{SD}$ ) is applied horizontally and the gate voltage ( $V_G$ ) is perpendicular to the  $V_{SD}$ .

switching at high fields; if it is too low, the endohedral molecule tumbles inside the cage due to thermal effects, thus causing the loss of the recorded information. Switching is a critical step that can be achieved only for specific systems.

(ii) The system should have a sufficient rectification ratio (RR) to make the 'reading of the state' of the system possible. RR can be simply defined as the ratio of current passing through the device at a certain bias voltage and current passing at the same but reverse bias voltage. For the proper function of reading, the desired RR should be greater than 1, that is, the LM and LM' states must differ in conductivity when the system is connected to the electrodes.

To achieve our goal, we studied 34 systems with MX encapsulated in the  $D_{5h}(1)$ -C<sub>70</sub> fullerene cage to identify potential candidates for MX@ $D_{5h}(1)$ -C<sub>70</sub> memristors. The studied systems were selected because of their well-defined electronic and spin states. Method calibration on five preselected systems was performed first to find a reliable DFT level for production calculations. With a reasonable computational level chosen, we evaluated intrinsic switching barriers and their response to the oriented external EF. The studied systems feature a wide range of intrinsic switching barriers ranging from a few up to

$\sim 95$  kcal mol<sup>-1</sup>. We further examine which molecular properties (e.g., M–X bond length and M–X dipole moment) control the switching barrier and its response to the EF. Based on our analyses, we propose a general method to identify the right MX molecules for an ellipsoid fullerene with an arbitrary cavity size.

In the following, we discuss the computational methods in Section 2, and the computational benchmark in Section 3.1. In Section 3.2 we study the calculated intrinsic (zero-field) switching barriers as well as their response to the applied EF in the two-electrode setup, and the key factor(s) defining the systems' properties and behaviour. Conclusions are drawn and candidates for molecular MX@C<sub>70</sub> memristors are proposed in Section 4.

## 2. Methods

For the method calibration, the local minima and transition states (LM, LM', and TS in Fig. 1) of a pre-selected test set of five MX@C<sub>70</sub> molecules (MX = KF, CsF, LiCl, CuCl, and ZnS) were taken. The test set was selected to include both the main group and transition metals and also to sample the energy spectrum



of B97D3<sup>44,45</sup>/def2-SVP<sup>46,47</sup> pre-calculated intrinsic switching barriers (1–80 kcal mol<sup>-1</sup>). Throughout the calibration, the geometries were optimized at various DFT and *ab initio* levels. The following density functional theory (DFT) functionals were used: BLYP<sup>48–50</sup> and PBE<sup>51,52</sup> generalized gradient approximation (GGA) functionals; the TPSS<sup>53</sup> meta-GGA functional; the TPSSH<sup>53,54</sup> and M06<sup>55</sup> meta-hybrid functionals; the B97D3,<sup>44,45</sup> B3LYP,<sup>49,56–58</sup> PBE0,<sup>51,52,59</sup> and BHLYP<sup>48,49,60</sup> hybrid functionals; and the  $\omega$ B97X<sup>61</sup> range-separated functional. The D3 empirical dispersion correction<sup>62</sup> was employed throughout the DFT optimizations. The def2-SVP,<sup>46,47</sup> def2-TZVP,<sup>46</sup> and def2-QZVP<sup>63</sup> basis sets were employed for carbon and the lighter metal/anion atoms. The relativistic MWB effective core potentials were used for the following atoms: Rb,<sup>64</sup> Cs,<sup>64</sup> Sr,<sup>65</sup> Ba,<sup>65</sup> Ag,<sup>66</sup> Au,<sup>66</sup> Cd,<sup>66</sup> and Hg.<sup>66</sup>

The LM and TS of the test set systems were further optimized at the *ab initio* SCS-MP2 (spin-component-scaled) level<sup>67,68</sup> using the largest affordable def2-TZVP<sup>46</sup> basis set. The SCS-MP2 has been previously shown to perform well for the energetics of noble-gas endohedral fullerene systems.<sup>69–71</sup> The stationary points on the potential energy surface of the optimized molecules were verified as minima and transition states by analysis of the harmonic vibrational frequencies. Imaginary frequencies smaller than 10 cm<sup>-1</sup> were considered as originating from numerical inaccuracies.

The DFT optimizations were performed using the Gaussian 16, revision C software,<sup>72</sup> the SCS-MP2 optimizations were done using the Turbomole 7.5.1 software.<sup>73,74</sup> The ORCA, version 4.2.0 program package<sup>75</sup> was used for the SCS-MP2/def2-SVP, SCS-MP2/def2-TZVP, DLPNO-CCSD<sup>76</sup>/def2-TZVP, and DLPNO-CCSD(T)<sup>77</sup>/def2-TZVP single-point calculations. For calculations of the switching characteristics under the influence of the electric field (EF), a uniform oriented EF was applied along the main  $D_5$  axis of symmetry using the Field keyword in Gaussian 16.<sup>72</sup>

Single-point computations were performed to assess the basis set superposition error (BSSE) using converged geometries of the MX@C<sub>70</sub> systems. The BSSE-corrected encapsulation energies (EE<sub>BSSE</sub>) were calculated using the Boys and Bernardi<sup>78</sup> counterpoise correction method according to the following equation:

$$EE_{BSSE} = E_{MX@C_{70}}^{MX@C_{70}} - \left( E_{MX}^{MX@C_{70}} + E_{C_{70}}^{MX@C_{70}} \right), \quad (1)$$

where  $E$  is the electronic energy of the system in subscript and the superscript denotes the basis set and geometry used for the calculation.

The SCS-MP2 encapsulation energies at the complete basis set (CBS) limit were computed employing Helgaker's extrapolation formula,<sup>79</sup>

$$E^{MP2/CBS} = E^{HF/def2-QZVP} + \frac{4^3 E^{MP2\ corr./def2-QZVP} - 3^3 E^{MP2\ corr./def2-TZVP}}{4^3 - 3^3}, \quad (2)$$

where the  $E^{MP2/CBS}$  is the final SCS-MP2/CBS extrapolated energy of the MX@C<sub>70</sub> system or MX or C<sub>70</sub> subsystems,

$E^{HF/def2-QZVP}$  is the Hartree-Fock energy using the def2-QZVP basis set, and  $E^{MP2\ corr./def2-XZVP}$  is the SCS-MP2 correlation energy computed using the denoted basis set.

### 3. Results and discussion

#### 3.1. DFT vs. *ab initio* benchmark. Structures and energetics

The considered systems are too large for doing productive work using accurate *ab initio* methods, in particular the geometry optimizations under electric field. Density functional theory (DFT) is a reasonably accurate and affordable option here but should be properly calibrated for the purpose. Because experimental data are hardly available, we employed single-point SCS-MP2 and DLPNO-CCSD(T) *ab initio* calculations to calibrate the DFT approaches, in particular for the LM and TS geometries (only SCS-MP2), switching barriers, and encapsulation energies (eqn (3) below) of MX in C<sub>70</sub>. Both SCS-MP2 and DLPNO-CCSD(T) should be reasonably accurate for calculations of energetics in fullerenes and weakly-bonded systems.<sup>70,71,80–82</sup> DLPNO-CCSD(T) can be considered as a benchmark for the closed-shell systems like those studied here. To maximize the efficiency, we first sought for an accurate yet affordable *ab initio* level with respect to the basis set and level of correlation, which was in turn used as a reference point for the evaluation of DFT methods. The benchmark was done on a set of five preselected systems (MX@C<sub>70</sub>; MX = KF, CsF, LiCl, CuCl, and ZnS) using ten different DFT functionals and the D3 dispersion correction. The basis set convergence was investigated for both the DFT and the *ab initio* approaches.

**3.1.1. *Ab initio* benchmark.** We compared the performance of SCS-MP2, DLPNO-CCSD, and DLPNO-CCSD(T) methods on the size of the intrinsic switching barrier (ISB, *i.e.*, the difference between the energies of TS and LM) that is the most critical issue to design a fullerene-based memristor, and on encapsulation energy (EE) as a parameter which is expected to be rather sensitive to the chosen level of theory. Encapsulation energy is defined as

$$EE = E(MX@C_{70}) - (E(MX) + E(C_{70})), \quad (3)$$

where  $E$  is the electronic energy of the denoted system. EE serves as an indicator of thermodynamic stability of the system: negative values indicate that the MX@C<sub>70</sub> system is favourable compared to free MX/C<sub>70</sub>; positive values point to the synthetic unfeasibility of the endohedral species.

The structures of the minima and transition states used for the *ab initio* single-point calculations were initially obtained at the B97D3/def2-SVP level.<sup>71</sup> The basis set convergence of the SCS-MP2 method for ISBs and EEs was tested using the def2-SVP, def2-TZVP, and def2-QZVP basis sets. Detailed discussion on the basis set convergence in the *ab initio* mode is given in the ESI.† Based on results in Tables S2 and S3 (ESI†), we consider the def2-TZVP basis set as sufficiently converged for calculations of ISBs. For EEs, we note that the BSSE correction is compulsory in the *ab initio* mode. For highly accurate EEs, we recommend using the CBS extrapolation



**Table 1** The intrinsic switching barrier (in kcal mol<sup>-1</sup>) of the test set MX@C<sub>70</sub> systems calculated at various *ab initio* levels using the def2-TZVP basis set

MX →	KF	CsF	LiCl	CuCl	ZnS
SCS-MP2	10.9	42.2	-1.2	1.5	2.8
DLPNO-CCSD	11.6	45.7	-2.1	6.1	4.2
DLPNO-CCSD(T)	12.1	43.6	-1.8	3.9	4.0

formula, as even the def2-QZVP results are not fully converged (Table S3).

To investigate the convergence of the ISB and EE with the level of correlation, the single-point SCS-MP2, DLPNO-CCSD, and DLPNO-CCSD(T) energies using the largest affordable def2-TZVP basis set were calculated (Table 1). We can see a smooth convergence along the series, SCS-MP2 already covers most of the electron correlation, the SCS-MP2 data underestimate the DLPNO-CCSD(T) results by ~2 kcal mol<sup>-1</sup> (Table 1), except for LiCl@C<sub>70</sub> where the SCS-MP2 result slightly overestimates the DLPNO-CCSD(T) value.

The BSSE-corrected *ab initio* encapsulation energies are reported in Table 2. The SCS-MP2 results under-/over-estimate the DLPNO-CCSD(T) data, up to ~5 kcal mol<sup>-1</sup>. Evidently, the differences are not systematic here, however, the accuracy of SCS-MP2 is acceptable.

In summary, the *ab initio* calculated ISBs converge fast regarding the basis set requirements, while one should use extrapolation methods and counterpoise correction to get accurate numbers for EEs. Regarding the electronic correlation effects, the ISBs are already well converged using SCS-MP2 *versus* the DLPNO-CCSD(T) reference, while for accurate EEs, one may need to go for DLPNO-CCSD(T) where possible. For the computational screening work below, we can infer from Table S3 (ESI<sup>†</sup>) that BSSE-corrected EEs obtained using the def2-TZVP basis set are converged within up to 7 kcal mol<sup>-1</sup> from the CBS extrapolated results, which is sufficient for our purposes. For further calibration of DFT functionals, we chose the SCS-MP2/def2-TZVP level as the reference method as it is the best affordable level that allows for efficient geometry optimizations while providing reasonably accurate results.

Note that the geometries used for the *ab initio* benchmark above were obtained with the B97D3 functional. Below we show that B97D3 does not provide the best geometries. To prove that this does not affect the results of the *ab initio* benchmark above, we re-evaluated the *ab initio* ISBs with geometries optimized with the best performing PBE0 functional. The results obtained with PBE0 structures in Table S4 (ESI<sup>†</sup>) show

**Table 2** The encapsulation energies (in kcal mol<sup>-1</sup>) of the testing set MX@C<sub>70</sub> systems calculated using different *ab initio* methods with the def2-TZVP basis set including the basis set superposition error (BSSE) correction for the monomer energies

MX →	KF	CsF	LiCl	CuCl	ZnS
SCS-MP2	-23.5	-26.8	-28.0	-30.3	-39.3
DLPNO-CCSD	-26.1	-26.2	-25.8	-26.6	-29.1
DLPNO-CCSD(T)	-27.6	-29.4	-28.8	-29.3	-34.5

trends consistent with results obtained with B97D3 structures in Table 1.

**3.1.2. Basis set convergence at the DFT level.** The basis set convergence at the DFT level was tested using the hybrid B97D3 functional and the pure TPSS functional with the D3 dispersion correction. The molecular structures of the test set MX@C<sub>70</sub> systems were optimized using def2-SVP, def2-TZVP, and def2-QZVP basis sets, and ISBs as well as EEs were evaluated at the same levels. Fig. 2a and b reveal a smooth convergence of calculated ISBs towards the basis set limit. Generally, the choice of basis set has only a minor effect on the ISB in comparison with the choice of the DFT functional as seen already from the comparison of B97D3 and TPSS in Fig. 2a and b (numerical values in Table S5, ESI<sup>†</sup>). For other functionals, see below. Regarding ISBs, already the def2-SVP basis set is converged within 1–2 kcal mol<sup>-1</sup> from the def2-QZVP results and the def2-TZVP basis set is even less so. The DFT-calculated EEs in Fig. 2c and d reveal much faster convergence than the *ab initio* SCS-MP2 data (Fig. S3b, ESI<sup>†</sup>). The EE is clearly converged with the def2-QZVP basis set; hence CBS extrapolation is not necessary. The def2-TZVP and def2-SVP basis sets give relatively systematic shifts of 2–4 and 10–25 kcal mol<sup>-1</sup> towards the more negative values (Fig. 2c and d, numerical values in Table S6, ESI<sup>†</sup>). Given this fact, the def2-TZVP basis set is a reasonable choice for predictions of EEs. We note that the counterpoise correction to EEs plays a less important role at the DFT level (Fig. 2c and d, numerical results in Table S7, ESI<sup>†</sup>) and can be neglected, if at least the def2-TZVP basis set is employed for calculations of EEs.

Because structure optimizations are easier to perform using DFT, in Table S8 (ESI<sup>†</sup>) we eventually compared EEs calculated at the DFT-D3/def2-TZVP (using TPSS and B97D3) levels using the geometries optimized employing both the def2-SVP and def2-TZVP basis sets. The results do not differ significantly. The root-mean-square deviations of atomic coordinates (RMSDs) between structures optimized using the def2-SVP and def2-TZVP basis sets are on average 0.024 Å (Table S9, ESI<sup>†</sup>). Thus, even the small def2-SVP basis set should be sufficient for the DFT geometry optimizations. One may safely employ the usual scheme of obtaining geometries with a smaller basis set and computing the energetics with a larger basis set.

**3.1.3. Optimized geometries, switching barriers, and encapsulation energies: the role of the DFT functional.** The results in Fig. 2a and b indicate that the size of the switching barrier is dramatically affected by the DFT functional employed. To find the best DFT functional, we calculated single-point energies of the DFT-D3-minimized LM and TS structures at the reference SCS-MP2/def2-TZVP level. These energies relative to the SCS-MP2/def2-TZVP minimum energy are shown in Fig. 3 (numerical values in Table S10, ESI<sup>†</sup>). The results show that the PBE0 and M06 functionals consistently provide the energetically lowest structures on the SCS-MP2 potential energy hypersurface (PES). This is also true for structural parameters, such as the M–X bond length, the longest C–C distance, and the overall root-mean-square deviation of atomic coordinates (RMSD, detailed in Tables S11–S19, ESI<sup>†</sup>).



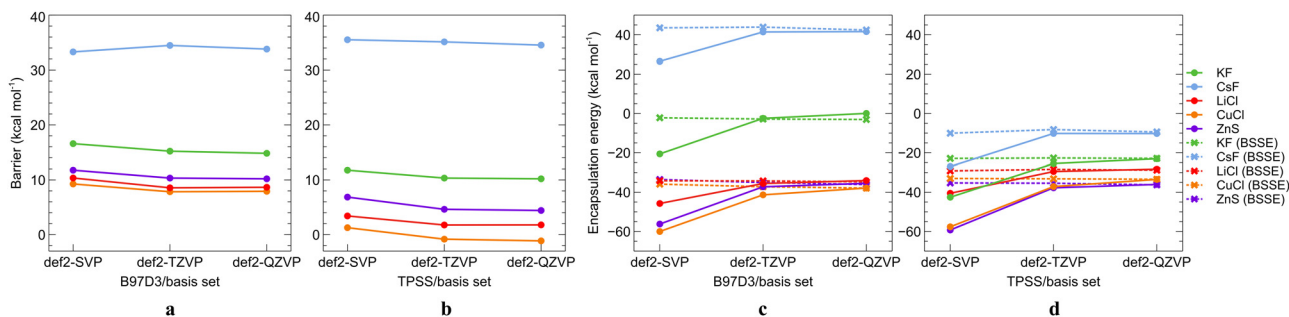


Fig. 2 Basis set convergence for the intrinsic switching barrier and the encapsulation energy with and without the counterpoise correction calculated using the (a and c) B97D3 and (b and d) TPSS functional.

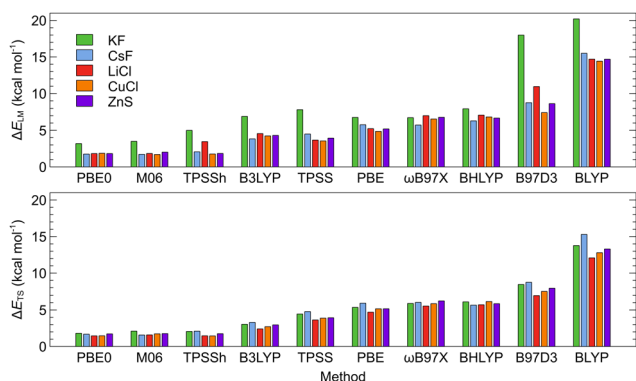


Fig. 3 SCS-MP2/def2-TZVP single-point energies of DFT-D3/def2-SVP-optimized geometries relative to the energies of the SCS-MP2/def2-TZVP-optimized geometries; top part – LM structures, bottom part – TS structures.

The ISBs and EEs calculated using the DFT-D3 energies and single-point SCS-MP2 energies for the DFT-D3-optimized structures are compared in Tables S20 and S21 (ESI<sup>†</sup>). The root-mean-square errors between the DFT-D3 and SCS-MP2 values (RMSE; calculated as described in the ESI<sup>†</sup>) are illustrated on Fig. 4. Here, also, M06 and PBE0 functionals provide values that are the closest to the SCS-MP2/def2-TZVP results. The PBE0 functional provided generally the best price/performance ratio, while the M06 functional appears slightly more expensive (~20% longer CPU time).

Overall results of the calibration indicate that the choice of the DFT functional is the most important factor that affects the calculated ISBs as well as EEs while both properties converge smoothly with the basis set size when DFT is used. By comparing various parameters of the studied systems calculated at the DFT level and the reference *ab initio* SCS-MP2/def2-TZVP level, we were able to identify the DFT level(s) that provide the most precise results with respect to the reference. PBE0-D3 and M06-D3 consistently turn out as the most reliable DFT functionals. The basis set convergence is smooth for the ISBs, and the def2-SVP basis set thus provides sufficient accuracy at a low computational cost, needed for computational screening. For EEs, at least the def2-TZVP basis set should be used. Counterpoise correction is marginal for DFT-calculated intrinsic switching

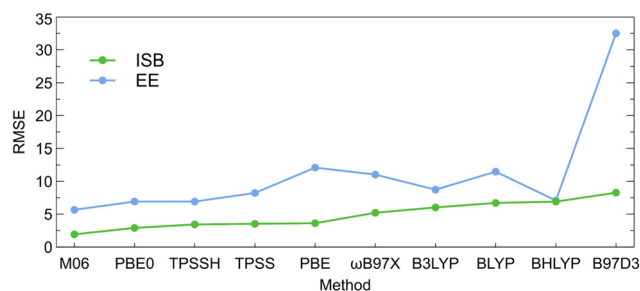


Fig. 4 Root-mean-square errors between the intrinsic switching barriers (ISBs) and encapsulation energies (EEs) calculated using different DFT-D3 functionals and single-point SCS-MP2 energies of the DFT-D3-optimized structures.

barriers but important for encapsulation energies, and more so at *ab initio* levels, where CBS methods should be applied.

### 3.2. Screening of the full set of MX@C<sub>70</sub> systems

**3.2.1. Structure-property relationships concerning the intrinsic switching barrier (ISB).** We screened a series of 34 MX@C<sub>70</sub> (M = metal, hydrogen; X = halogen, chalcogen) systems to determine which of them provide the best switching properties (see Introduction). Based on the results obtained in the calibration above, we chose the PBE0/def2-SVP level with the D3 dispersion correction for calculations of the local minimum (LM) and transition state (TS) structures, intrinsic switching barriers (ISBs), and the response of ISBs to the applied electric field (EF). The PBE0-D3/def2-TZVP level was chosen for calculations of encapsulation energies (EE).

The results for ISBs of the studied series are given in Table 3. It provides a shortlist of systems and illustrates how the barrier increases with M/X down the periodic table, *i.e.*, with the increasing size of the corresponding M/X. Apparently, the size of the barrier reflects the size of the M(X), *vide infra*.

For some systems, no ISB could be found. For these, we performed detailed scans of the MX rotation that revealed a very shallow potential energy hypersurface (PES) for the movement of the encapsulated molecule inside C<sub>70</sub> and no intrinsic barrier against the rotation of MX. This is true for small MX molecules, such as HF, HCl, or LiF. Because a reasonable ISB is



**Table 3** Intrinsic switching barriers (in kcal mol<sup>-1</sup>) of MX@C<sub>70</sub> systems calculated at the PBE0-D3/def2-SVP level

M	X		M	X	
	F	Cl		O	S
H	— <sup>a</sup>	— <sup>a</sup>			
Li	— <sup>a</sup>	3.4	Be	— <sup>a</sup>	— <sup>a</sup>
Na	6.3	23.7	Mg	— <sup>a</sup>	9.6
K	18.2	56.2	Ca	5.7	33.0
Rb	27.2	74.0	Sr	13.2	49.7
Cs	38.8	94.1	Ba	— <sup>b</sup>	61.4
Cu	— <sup>a</sup>	5.1	Zn	— <sup>b</sup>	6.8
Ag	8.6	26.9	Cd	5.8	25.1
Au	5.8	24.7	Hg	10.7	32.7

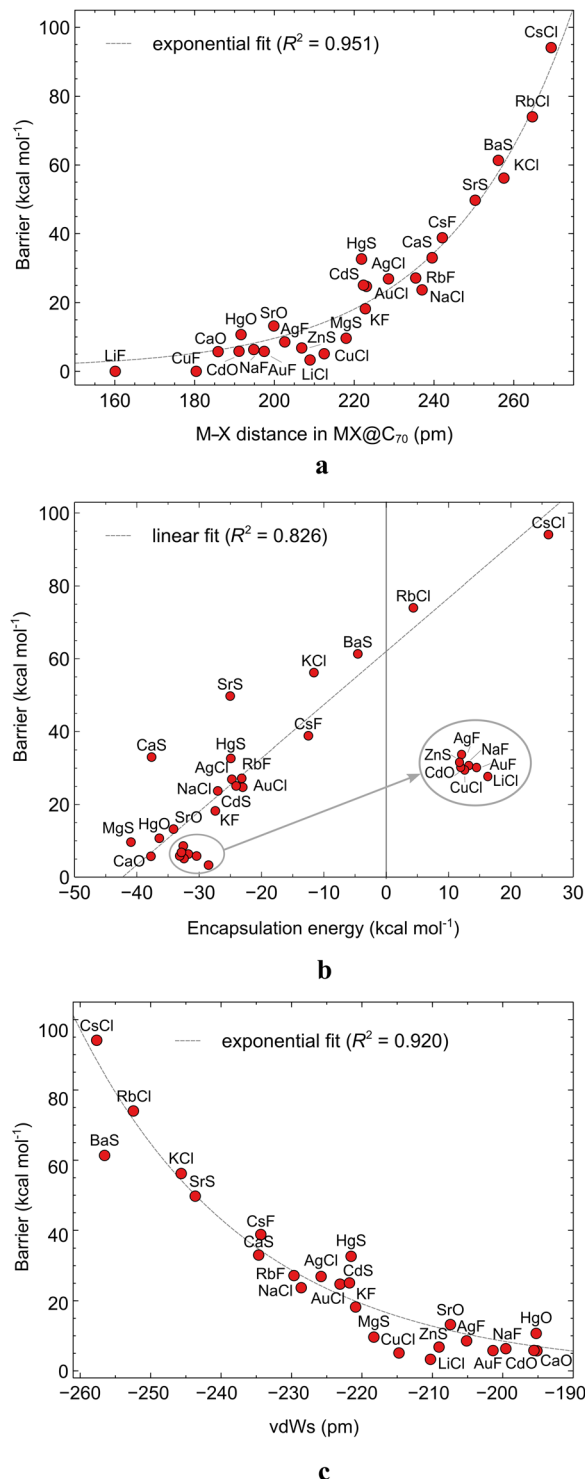
<sup>a</sup> ISB not found. <sup>b</sup> Different local minima found, see below.

one of the conditions for a working memristor, we refrained from further characterization of these systems. For the rest, we predict ISB starting from ~3 kcal mol<sup>-1</sup> for LiCl up to ~95 kcal mol<sup>-1</sup> for CsCl at the PBE0-D3/def2-SVP level.

Interestingly, the MO@C<sub>70</sub> (M = Ca, Sr, Ba, Zn, Hg) oxide systems exhibit a more complex PES with a third local minimum (LM'') that corresponds to the geometry shown in Fig. S4 (ESI†). For CaO, SrO, and HgO, the LM'' state lies 6.4, 1.6, and 9.4 kcal mol<sup>-1</sup> above the LM, respectively. However, for BaO and ZnO, the LM'' is located 0.5 and 3.1 kcal mol<sup>-1</sup> below the LM, respectively. The BaO and ZnO systems were disqualified from further studies as the additional minimum complicates the EF calculations. Population analysis of LM'' in these systems reveals a strong charge shift between the cage and MX. This phenomenon will be investigated elsewhere.

Three main factors make up the switching barrier: the steric repulsion between MX and C<sub>70</sub> in the TS geometry, and the distortion of the MX and C<sub>70</sub> counterparts upon transition from LM to TS. As shown in Fig. S5 (ESI†), the major contribution to ISB is in almost all systems the repulsion interaction. The strain of the C<sub>70</sub> and MX grows in importance for large systems (e.g., CsF, KCl, RbCl, CsCl, SrS, and BaS); however, it is almost negligible for smaller MXs. Furthermore, the MX strain seems to be more prominent in chlorides, whereas the strain of C<sub>70</sub> protrudes more in sulphides.

It is interesting to know, for a possible future rational design of molecular memristors with similar systems, whether and how the size of ISB correlates with the molecular properties of the enclosed MX or MX@C<sub>70</sub> itself. The various calculated properties of MX and MX@C<sub>70</sub> are reported in Table S22 (ESI†). We found two clear correlations: the exponential dependence of the ISB on the M–X bond length (Fig. 5a) and the linear dependence of the ISB on the EE (Fig. 5b). There is a clear trend in these plots: the longer the M–X bond or the higher the EE, the higher the ISB. This could be expected based on a simple geometrical reasoning: the larger the encapsulated MX molecule, the more difficult it is to rotate it through the flattened central part of the elliptical C<sub>70</sub>. Some exceptions can be found for this structure–property relationship; the most distinct ones are KF@C<sub>70</sub> and HgS@C<sub>70</sub> systems which feature almost identical M–X bond length but the ISB of the former



**Fig. 5** The correlation between the intrinsic switching barrier and (a) the M–X bond length in MX@C<sub>70</sub> systems, (b) the encapsulation energy, (c) the van der Waals strain (vdWs); the vdWs is calculated as the difference between the van der Waals width of the C<sub>70</sub> cage ( $r_{C-C} - 2r_{vdW,C}$ ) and the van der Waals length of the MX dipole ( $r_{M-X} + r_{vdW,M} + r_{vdW,X}$ ).

compound is by 14.5 kcal mol<sup>-1</sup> lower than that of the latter. Apparently, other properties of MX may fine-tune the observed trend, but we did not find any further meaningful correlations



in this particular case. The relationship between the bond lengths and the ISBs can be rationalized by the fact that it is not expected that MX systems, in particular, if X is a halogen, interact with the interior of the fullerene cages.

One can also rationalize the ISBs in terms of the noncovalent interaction of MX with the equatorial region of  $C_{70}$ : the larger the clash between the MX and the interior of the cage, the higher the ISB. To examine this hypothesis, we plotted the difference between the van der Waals cavity size of the fullerene and the van der Waals radii of MX species. In all cases where the MX is in the TS geometry, there is a clash between the two species. Interestingly, this simple parameter, which we coin the van der Waals strain, vdWs in Fig. 5c, correlates perfectly with the ISB values ( $R^2 = 0.92$ ). This finding is critical because it helps to estimate the switching barrier of MX systems encapsulated within any ellipsoid fullerene of an arbitrary size. The same trend can be observed also for the difference of the cage width and the M–X bond length (Fig. S6, ESI†).

Notably, for two molecules,  $RbCl@C_{70}$  and  $CsCl@C_{70}$ , we have obtained positive encapsulation energies, 4.4 and 26.0 kcal mol<sup>-1</sup> respectively. In the case of these two systems, the length of the M–X bond is significantly shortened upon encapsulation (see Table S22, ESI†), specifically by 17.2 and 24.7 pm respectively. As mentioned above, EE is an indicator of the stability of an endohedral fullerene. The forced distortion of the MX geometry contributes to the destabilization of the whole system. Furthermore, the correlations in Fig. 5 indicate that the M–X bond length is connected to the size of the EE. This can be rationalized again by the geometrical nature of the  $MX@C_{70}$ : the larger the encapsulated molecule the larger the EE.

**3.2.2. The response of the switching barrier to the EF: the switching function.** The utilization of the  $MX@C_{70}$  systems depends on the lifetime of their internal states, *i.e.*, on the energy barrier against the MX flip. Because the switching barrier does not reduce linearly with the applied EF,<sup>25</sup> a too high barrier makes the molecules unswitchable. A low-energy barrier, in turn, does not prevent the molecule from spontaneously switching *via* thermal motion. For realistic data storage on the time scale of years, the switch should have an energy barrier equal to or higher than  $50kT$ , that is *ca.* 35 kcal mol<sup>-1</sup> at the working temperature of the present-day computers.<sup>83</sup> One-half of this value still leads to days-long stability. For in-memory processing or short-time data storage, lower barriers are also acceptable as the volatile memory systems can be used in the periodic refresh mode.<sup>83</sup>

For studying the response of ISB to oriented EF, we selected systems with negative encapsulation energies and with ISBs from *ca.* 3 to 50 kcal mol<sup>-1</sup>. The EF was applied along the  $C_5$  axis of the  $C_{70}$  cage to simulate the effect of  $V_{SD}$  (Fig. 1). Fields between 0.21 and 1.03 V Å<sup>-1</sup> were employed to study the behaviour of the systems; these non-round values originate from calculations that used atomic units (0.21 V Å<sup>-1</sup>  $\sim$  0.004 a.u.).

The results are collected in Fig. 6. The switching voltage, *i.e.*, the voltage at which the rotation of the dipole from LM to LM' is barrierless, is different for each of the systems. Nine of

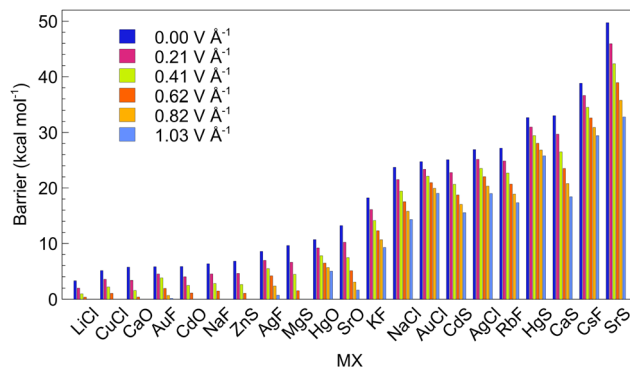


Fig. 6 The dependence of the switching barrier on the electric field applied in the direction of  $V_{SD}$  for the  $MX@C_{70}$  molecules; calculated at the PBE0-D3/def2-SVP level.

the studied  $MX@C_{70}$  systems (MX = LiCl, CuCl, CaO, AuF, CdO, NaF, ZnS, AgF, and MgS) approach the switching voltage  $< 1.03$  V Å<sup>-1</sup>, which should be experimentally achievable in a two-electrode setup. The ISBs of these molecular switches are, however, lower than 10 kcal mol<sup>-1</sup> (Table 3). These systems are thus suitable for in-memory processing or short-time memory data storage, *vide infra*. Especially, systems with barriers of  $\sim 5$  kcal mol<sup>-1</sup> or smaller are suitable only for operating at low temperatures. It is worth noting that even the systems with a small non-zero switching barrier are practically applicable for in-memory processing. However, the advantage of having a system with zero switching barrier (at a certain voltage) is that the frequency of the process will reach the realm of  $10^{12}$  to  $10^{15}$  per second which is the rate of a single molecular vibration, *i.e.*, terahertz and more.<sup>83</sup> Furthermore, at room temperature, the switching barrier seems to go down by *ca.* 1 kcal mol<sup>-1</sup> for all considered EFs *via* thermal effects (Table S23, ESI†).

For the systems, which did not reach a sufficiently low switching barrier (*i.e.*, at least  $\sim 1$  kcal mol<sup>-1</sup>) upon the application of the largest field, we extrapolated the exponential barrier-field dependence (Fig. S7, ESI†) to estimate the switching voltage. Table 4 reveals that for most of these systems, the estimated switching voltage (ESV) is much higher than what is experimentally achievable. Previously, the switching function was studied also in a four-electrode setup.<sup>20,25</sup> In this arrangement, the secondary field (gate voltage,  $V_G$ ) applied perpendicularly to  $V_{SD}$  (Fig. 1c) helps to stabilize the TS relatively to LM *via* EF-dipole interaction,<sup>20,25</sup> but the barrier is only marginally lowered by  $V_G$  ( $\sim 1$ –4 kcal mol<sup>-1</sup>). For this reason, we refrained from demanding calculations using a four-electrode setup. We just note in passing, that some of the systems in Table 4 may reach a realistic ESV if a sufficient secondary field is applied.

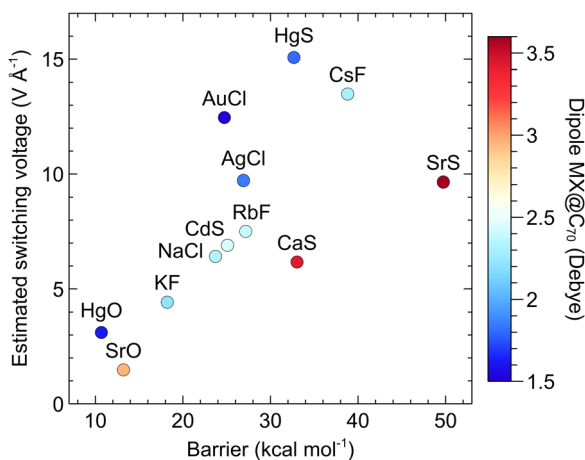
Are there any correlations between the ESV and properties of MX or  $MX@C_{70}$ ? One may expect that an M–X with a larger dipole moment responds better to the applied EF. We analyzed possible relationships among the ISB, ESV, and molecular properties of the studied systems. We found out that the main factor affecting the switching function is, indeed, the





Table 4 Intrinsic switching barriers (ISBs) at zero voltage and estimated switching voltages (ESVs)

MX →	HgO	SrO	KF	NaCl	AuCl	CdS	AgCl	RbF	HgS	CaS	CsF	SrS
ISB (kcal mol <sup>-1</sup> )	10.7	13.2	18.2	23.7	24.7	25.1	26.9	27.2	32.7	33.0	38.8	49.7
ESV (V Å <sup>-1</sup> )	3.11	1.48	4.43	6.42	12.46	6.90	9.72	7.51	15.07	6.17	13.49	9.65

Fig. 7 The correlation between the switching barrier, the estimated switching voltage, and the dipole moment of the MX@C<sub>70</sub> systems.

magnitude of the dipole moment of the whole molecule MX@C<sub>70</sub>. Fig. 7 shows that for similar barriers (*e.g.*, in the case of CaS and HgS) the systems with higher ESV (thus a weaker response of the MX@C<sub>70</sub> to the EF) have also smaller dipole moments (*e.g.*, the dipole moment of HgS@C<sub>70</sub> is smaller than that of CaS@C<sub>70</sub> by  $\sim 1.7$  Debye). The same, but somehow weaker trend can be seen in Fig. S8 (ESI<sup>†</sup>), where colour map denotes the dipole moment of the free MX molecule. This fact can be used as another rule of thumb: the higher the dipole moment of an MX or MX@C<sub>n</sub>, the steeper the decrease of the switching barrier with applied EF.

## 4. Conclusions

In this work, we performed an *in silico* search for potential molecular memristors based on endohedral fullerenes of the general formula MX@D<sub>5h</sub>(1)-C<sub>70</sub>, where M is a metal or hydrogen, and X is a halogen or a chalcogen, *via* the characterization of MX encapsulation energies (EE), intrinsic switching barriers (ISB) for the flip of MX in the C<sub>70</sub> cage, and the response of the switching barriers to an oriented external electric field (EF).

To find an appropriate DFT protocol for production calculations with reasonable accuracy *vs.* cost ratio, we first performed extensive DFT against *ab initio* benchmark using SCS-MP2 and DLPNO-CCSD(T) as the reference methods, including convergence to the complete basis set limit. The benchmark revealed a critical dependence of both ISBs and EEs on the DFT functional, and also a significant dependence of EEs on the basis set in the *ab initio* mode, while the basis set requirements were found to be less demanding in the DFT mode. The PBE0-D3/def2-SVP level provides a good compromise between accuracy

and cost for structure optimizations and calculations of the switching barriers. For encapsulation energies at the DFT level, at least the def2-TZVP basis set should be used on top of the PBE0-D3/def2-SVP geometries.

Employing the calibrated PBE0-D3/def2-SVP level, in total nine MX@C<sub>70</sub> out of the 34 studied systems have been identified as potential candidates for molecular memristors or switches, the MX being LiCl, CuCl, CaO, AuF, CdO, NaF, ZnS, AgF, and MgS. We have further shown that ISBs of the MX@C<sub>70</sub> systems correlate with the M–X bond length because the switching is controlled by the difference between the size of the enclosed species and the width of the fullerene (here called the van der Waals strain, vdWs).

Based on these observations, a general guideline can be formulated for the screening of analogous candidates for molecular memristors. Tuning of the ISB can be realized by tuning the bond length of the enclosed diatomic molecule: the shorter the bond length the lower the barrier. This could be further generalized to other than diatomic molecules as there is a clear connection between the barrier and how sterically demanding the enclosed species are. This is also connected to the working temperature of the systems as the kinetic of the switching depends both on the height of the barrier and on the temperature. One could thus utilize less sterically demanding endohedral species while working in lower temperatures and *vice versa*. The van der Waals strain between the MX and the interior of the cage defined in this work can be used as a parameter for identifying the ideal MX for a particular cage. The vdWs value ranged between  $-220$  and  $-195$  pm is the ideal strain to ensure a large enough and yet operable switching barrier.

The response to the external EF, *i.e.*, the rate at which the switching barrier drops with an increasing EF, strongly correlates with the dipole moment of both the MX@C<sub>70</sub> and the diatomic molecule alone: the larger the dipole moment the stronger the response to the EF. This enables tuning in a broader sense; if one strives to achieve a greater separation between the electric currents that allow switching and those that move through the system without switching, systems with lower dipole moments are suitable. Systems with larger dipole moments can be expected to exhibit larger sensitivity to the applied EF.

The studied systems may ultimately serve as molecular memristors and, once manufactured, find applications in short-term memory data storage, memristor-aided or memristor-based logic circuits, and for in-memory computing purposes.

## Conflicts of interest

There are no conflicts to declare.



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