Force-Activated Spin-Crossover in Fe²⁺ and Co²⁺ Transition Metal Mechanophores

Xiao Huang^{1,2,3}, Ilia Kevlishvili^{2,3}, Stephen L. Craig^{3,4}, and Heather J. Kulik^{1,2,3*}

¹Department of Chemistry, Massachusetts Institute of Technology, Cambridge, MA 02139, USA

²Department of Chemical Engineering, Massachusetts Institute of Technology, Cambridge, MA

02139, USA

³NSF Center for the Chemistry of Molecularly Optimized Networks, Duke University, Durham, NC, USA.

⁴Department of Chemistry, Duke University, Durham, NC 27708, USA

*Corresponding author email: hjkulik@mit.edu

ABSTRACT: Transition metal mechanophores exhibiting force-activated spin-crossover are attractive design targets, yet large-scale discovery of them have not been pursued due in large part to the time-consuming nature of trial-and-error experiments. Instead, we leverage density functional theory (DFT) and external force explicitly included (EFEI) modeling to study a set of 394 feasible Fe²⁺ and Co²⁺ mechanophore candidates with tridentate ligands that we curate from the Cambridge Structural Database. Among nitrogen-coordinating low-spin complexes, we observe the prevalence of moderate-force spin-crossover, and we identify 155 Fe²⁺ and Co²⁺ spincrossover mechanophores and derive their threshold force for low-spin to high-spin transition $(F_{\rm SCO})$. The calculations reveal strong correlations of $F_{\rm SCO}$ with spin-splitting energies and coordination bond lengths, facilitating rapid prediction of F_{SCO} using force-free DFT calculations. Then, among all Fe^{2+} and Co^{2+} spin-crossover mechanophores, we further identity 11 mechanophores that combine labile spin-crossover and good mechanical robustness that are thus predicted to be the most versatile for force-probing applications. We discover two classes of mersymmetric complexes comprising specific heteroaromatic rings within extended π -conjugation that give rise to Fe^{2+} mechanophores with these characteristics. We expect the set of spin-crossover mechanophores, the design principles, and the computational approach to be useful in guiding the high-throughput discovery of transition metal mechanophores with diverse functionalities and broad applications, including mechanically activated catalysis.

1. Introduction

Mechanophores are force-responsive molecular units that possess mechanically labile bonds¹⁻⁴ or otherwise change their properties (e.g., optical, magnetic) under force. Upon applied force, bonds most commonly undergo controlled dissociation, rearrangement or elongation, and mechanophores consequently exhibit a wide range of responses including color change, i.e., mechanochromism,⁵⁻⁷ luminescence,⁸⁻¹⁰ small-molecule release,¹¹⁻¹⁴ and turn-on catalysis.^{15,16} Consequently, mechanophores have been extensively studied in recent years as building blocks of responsive materials with broad applications in fundamental reactivity studies,¹⁷⁻¹⁹ force probing,^{5-¹⁰ polymer strengthening,²⁰⁻²³ drug and prodrug delivery,^{11,12,24,25} and upcycling of waste polymers.^{13,14,26,27} Although more than 100 mechanophores have been synthesized and studied, the majority of them are organic molecules.^{4,28} Organic mechanophore force-probes rely on mechanochromism or turn-on emission responses, thus they are incompatible with most engineering polymers, which are translucent or opaque.^{29,30} Additionally, few organic mechanophores with NIR emission thus compatible with *in vivo* biomedical sensing have been developed.^{31,32}}

Transition metal mechanophores have received growing attention as their mechanochemical activity can be readily altered by changing metal cations³³⁻³⁶ or modifying ligand chemistry,^{33,35,37} and they have been used as mechanochromic force probes,^{33,37,38} mechanically activated catalysts,^{15,16} metal-release agents,³⁹ and to strengthen polymer networks.^{34,35,40} On the other hand, their potential application as spin-switchable force probes has remained less explored. Some low-spin (LS) Fe²⁺ complexes⁴¹⁻⁴⁴ and Co²⁺ complexes⁴⁵ have been identified to switch to high-spin (HS) under applied force as their coordination bonds are elongated and weakened. Most of the complexes are homoleptic, (bis)tridentate with terpyridine^{41,45} or

terpyridine derivative^{42,43} ligands. These complexes exhibit mechanically activated turn-on magnetism, and they can thus be used as versatile force probes compatible with engineering polymers or biomedical implants.^{46,47} The conductance changes accompanying LS-to-HS spincrossover also make these complexes promising building blocks for molecular electronic devices.⁴¹⁻⁴⁵ Although a few complexes⁴¹⁻⁴⁵ and polymer-metal complex composites⁴⁸⁻⁵⁰ exhibiting mechanically promoted spin-crossover have been reported, due to the complexity of experiments, no comprehensive mechanistic studies or large-scale screens have been conducted. Given the time-consuming nature of experimental trial-and-error discovery of mechanophores, a computational approach is one alternative strategy for the larger-scale discovery of spin-crossover transition metal mechanophores.

Computational screening with density functional theory (DFT) has been leveraged to identify open-shell transition metal complexes exhibiting thermal spin-crossover⁵¹⁻⁵³ and catalytic activity.⁵⁴⁻⁵⁷ To model the mechanical responses of bonds and molecules, such screening efforts must incorporate the effect of force in the simulation. One of the most straightforward techniques, the constrained geometries simulate external force (CoGEF) method, approximates a critical force by a series of successive constrained geometry optimizations.⁵⁸ Although it has been used for investigating various mechanophores and for computational screening of transition metal mechanophores,^{7,59-61} the magnitude of external force is not explicitly defined, limiting its applicability to estimating the effect of force on spin state energetics. Alternatively, models defining force explicitly by incorporating an external potential term into DFT have been developed.⁶² Among them, ab initio steered molecular dynamics (AISMD) methods⁶³ are versatile but require extensive statistics.^{18,19,64-66} When an approximate minimum energy pathway is known, path-based search methods in the presence of applied force are a high-accuracy alternative. The

force-modified transition state may be obtained with either the force-modified potential energy surface (FMPES) approach of Martínez and coworkers⁶³ or, equivalently, the external force explicitly included (EFEI) method of Marx and coworkers⁶⁷. Both model the influence of external force on the potential energy surface, enabling the identification of force effects on spin state energetics and other molecular properties.⁶⁸⁻⁷¹ Nevertheless, a concern is the accuracy of the underlying electronic structure model used in the force-applied simulations. Higher-cost methods such as double-hybrid DFT,⁷² CASPT2,^{73,74} CASPT2/CC,^{75,76} and emerging multi-configurational DFT methods^{77,78} are expected to be more predictive than lower rungs of "Jacob's ladder" in DFT. Nevertheless, DFT functional calibration⁷⁹⁻⁸² based on careful benchmarking,⁸³⁻⁸⁵ has shown that the accuracy of DFT in predicting LS–HS energy and structural differences of transition metal complexes can be improved by tuning global hybrid functionals.^{86,87} A low-cost method is essential when paired with the numerous force-applied simulations required in a high-throughput screening scenario.

In this work, we carry out a large-scale screen of synthetically accessible Fe²⁺ and Co²⁺ complexes from the Cambridge Structural Database (CSD)⁸⁸ and curate a set of 394 complexes that are suitable for polymer network incorporation. With DFT and EFEI calculations, we demonstrate that force-activated spin-crossover is prevalent in LS Fe²⁺ and Co²⁺ complexes, and we identify 155 complexes as candidates for magnetic force probes and evaluate their spin-crossover critical force (F_{SCO}). To further accelerate computational screening, we develop methods to predict F_{SCO} of LS Fe²⁺ and Co²⁺ complexes that only rely on DFT, circumventing costly EFEI calculations. Among all force-probe candidates, we find eleven Fe²⁺ and Co²⁺ complexes with facile, reversible, and robust mechanochemical responses. We also discover two classes of complexes with unique mechanical responses and broad potential applications: one with facile spin

crossover and high force for dissociation, and another with rapid dissociation of two coordination bonds to form square planar and potentially catalytically active complexes.

2. Methods

2a. Dataset curation

We began by examining mononuclear, homoleptic, tridentate complexes in the Cambridge Structural Database (CSD)⁸⁸, version 5.41 (November 2019) combined with the March and May 2020 updates, to find transition metal complexes (TMCs) that are synthetically accessible and would be compatible with polymer network incorporation. We consider only homoleptic complexes as mechanophore candidates because it would be challenging to consistently assemble non-homoleptic transition metal complex crosslinkers in polymers. We focused on (bis)tridentate complexes rather than (tris)bidentate complexes due to the greater simplicity of the dissociation events for tridentate complexes. From this set, we curated an initial set of 2,769 mononuclear, homoleptic, tridentate complexes comprising Mn, Fe, Co, Ni, Cu, Zn, and small numbers of other metals (Figure 1 and Supporting Information Figure S1). To ensure that the corresponding monomer would be relatively straightforward to synthesize and compatible with common polymerization reactions, we excluded complexes with ligands that had non-zero charge, as indicated by differences in the CSD-specified molecular charge and user-assigned metal oxidation state. We further eliminated complexes with greater than 125 atoms to avoid the high computational cost associated with modeling those complexes, yielding a set of 893 complexes of moderate size with neutral ligands (Figure 1). From these, we selected only Fe²⁺ and Co²⁺ complexes, which are the most common metals in spin-crossover systems⁸⁹⁻⁹². This leads to a final dataset of 328 complexes. In terms of metal composition, the dataset comprises of 222 Fe²⁺ and

106 Co^{2+} complexes. The candidates are predominantly *mer*-symmetric, with 259 *mer*-symmetric and 69 *fac*-symmetric complexes.



Figure 1. (left) Workflow to repurpose CSD complexes as spin-crossover mechanophore candidates. (right) Example of attachment point identification and functionalization of a *mer*-symmetric complex. Colors for atoms are as follows: cyan for cobalt, gray for carbon, white for hydrogen, and blue for nitrogen. The carbon and hydrogen in functionalized ethyl groups used to mimic extended polymer strands are colored in light green and light gray for clarity.

As shown in previous studies, higher force loading is required to activate mechanically labile bonds in a mechanophore if the force is propagated symmetrically along a mechanophore structure.⁹³⁻⁹⁵ Therefore, to discourage ligand dissociation, we identified polymer attachment points (i.e., for ethyl attachment to mimic polymer strands for applying force, see next) as hydrogen atoms that are most distant from the metal center, as measured by the shortest path length on a molecular graph. For *mer*-symmetric complexes, we further took inspiration from previous experimental studies and selected hydrogen atoms that are in proximity to the C_{2V} axis, as defined by the central coordination atom of each ligand.^{33,34,96} Consequently, we required that the shortest path on molecular graph (or one of multiple shortest paths) connecting the attachment point and the metal center must pass through the middle coordination atom (Figure 1).

We successfully identified and functionalized with an ethyl group a single attachment point on each ligand for 137 Fe²⁺ and 67 Co²⁺ complexes. For the remaining complexes, we found multiple potential hydrogen atoms equidistant from the metal center on each ligand. To analyze these potential attachment points systematically, we characterized the chemical environment of each hydrogen atom by replacing it with a chlorine atom and calculated the graph determinant of the resulting modified ligand. We consider two hydrogens on a ligand to be chemically equivalent if substituting either hydrogen results in modified ligands that have the same graph determinant. For 59 Fe²⁺ and 29 Co²⁺ complexes, this analysis revealed that multiple structures were chemically equivalent, and one structure was randomly selected from the duplicates (Figure 1). For 26 Fe²⁺ and 10 Co²⁺ complexes, multiple possible attachment points that are chemically non-equivalent were identified on each ligand (Supporting Information Figure S2). For these complexes, we matched hydrogen atoms with identical chemical environments on both ligands, modified them into ethyl groups, and treated each resulting structure as a separate candidate for simulation. This process yielded a set of 395 candidates, comprising 263 complexes Fe^{2+} and 132 Co^{2+} complexes. Among them, 295 complexes exhibited mer symmetry and 100 exhibited fac symmetry.

2b. Computational details

All electronic structure calculations were all performed using hybrid DFT in the gas phase using Orca v 5.0.1.^{97,98} These calculations included gas-phase geometry optimizations and EFEI simulations as well as DFT functional benchmarking. Throughout all calculations, the def2-TZVP basis set was employed for transition metals and the def2-SVP basis set was used for all other atoms.⁹⁹ All calculations were carried out in the unrestricted formalism. The modified B3LYP functional¹⁰⁰⁻¹⁰² with the empirical D3 dispersion correction¹⁰³ using Becke–Johnson damping¹⁰⁴ was employed. The modified functionals were defined as the following:

$$E^{\text{B3LYP(mod)}} = \alpha E_x^{\text{HF}} + (1 - \alpha) E_x^{\text{LSDA}} + 0.9 \times (1 - \alpha) \Delta E_x^{\text{B88}} + 0.19 \times E_c^{\text{LSDA}} + 0.81 \times E_c^{\text{LYP}}$$

We benchmarked modB3LYP with $\alpha = 0.1$, 0.15, and 0.2, ultimately selecting 0.15 for our calculations (Supporting Information Figure S3). Geometry optimizations were carried out using the BFGS¹⁰⁵ algorithm in redundant internal coordinates implemented to the default tolerances of 3×10^{-4} hartree/bohr for the maximum gradient and 5×10^{-6} hartree for the change in energy between steps.

Force-free geometry optimizations were first carried out for Fe^{2+} complexes in singlet, triplet, and quintet states, and Co^{2+} complexes were studied in doublet and quartet states. We eliminated calculations in which the self-consistent field (SCF) failed to converge, and we also considered calculations as having spin-deviation error if the calculated Mulliken spin on the metal deviated from the expected metal spin by more than 1 a.u. Consequently, we discarded complexes for which geometry optimizations at one or more spin states failed, and we identified the ground spin state of the rest of the complexes (Supporting Information Table S1). For all Fe^{2+} complexes with a low-spin singlet ground state, we found that the high-spin quintet state was lower in energy than the intermediate-spin triplet state. As a result, we calculated the force-free spin-splitting energy as the energy difference between the high-spin and low-spin state for all Fe^{2+} and Co^{2+} complexes with low-spin ground states.

The EFEI method was then used to determine the force-modified ground spin states for low-spin Fe²⁺ and Co²⁺ complexes. We developed a computational workflow that enabled us to quantitatively estimate the critical force for spin-crossover (F_{SCO}), i.e., the threshold force for lowto-high spin transition of the complexes to within a 0.5 nN range (Supporting Information Figure S4). Furthermore, we evaluated the critical force for bond dissociation (F_{De}), i.e., the threshold force under which coordination bonds began to dissociate, for Fe²⁺ and Co²⁺ complexes whose F_{SCO} values were successfully determined. We considered a bond dissociated if the distance between the metal and the coordinating atom exceeded 1.37 times the sum of their covalent radii, and we used the molSimplify¹⁰⁶ package for analysis. We evaluated F_{De} to within a 0.5 nN range with EFEI calculations (Supporting Information Figure S5). During the F_{SCO} evaluation workflow, we found eight complexes remained LS under X nN, yet in their force-modified ground state under X + 0.5 nN applied force one of more coordination bond has dissociated. We concluded that bond dissociation is likely to occur before LS-to-HS transition among these complexes and consider them unable to undergo force-activated spin-crossover.

3. Results and discussion

3a. Selecting low-spin Fe²⁺ and Co²⁺ complexes for EFEI modeling

We first identified the ground state of the TMCs curated from the CSD to identify structures amenable to force-induced spin crossover (see Sec. 2). From the initial set of 395 TMCs, 201 Fe²⁺ and 100 Co²⁺ complexes with attachment points were successfully optimized in all spin states, allowing for the assignment of their ground states. Although it is possible to envision multiple changes in spin state in response to force, we focused on the most likely spin transitions expected to occur under mechanical force. In previous studies, force has been predominantly leveraged to switch low-spin complexes to high-spin,^{43,45,107} and so we discarded complexes that have intermediate-spin or high-spin ground states as indicated by DFT. This led to a final set of 139 Fe²⁺ and 60 Co²⁺ optimized, LS TMCs (Supporting Information Figure S6). In 136 out of 139 Fe²⁺ and 50 out of 60 Co²⁺ TMCs that fit these criteria, all metal-coordinating atoms were nitrogen. As all previously studied (bis)tridentate Fe²⁺ and Co²⁺ complexes exhibiting force-activated spincrossover have nitrogen as the metal-coordinating atoms,^{41,45} we removed the 13 non-nitrogencoordinated complexes from our set. Nevertheless, these complexes can act as good starting points for expanding the design space of spin-crossover mechanophores in future studies. The remaining 186 complexes were further analyzed by first-principles mechanochemistry calculations. Several Mn²⁺ complexes have also been reported as spin-crossover systems¹⁰⁸. Utilizing the above workflow, we further examined 31 Mn²⁺ complexes in the collection of 893 complexes with uncharged ligands and less than 125 atoms and generated a set of 37 uniquely functionalized mechanophore candidates. Of this set of TMCs, most were successfully calculated in all possible spin states (i.e., 24 of 37), but all of these exhibit an intermediate- or high-spin ground state (Supporting Information Table S1). As a result, Mn²⁺ complexes were not further analyzed in this study.

3b. Modeling Force-Activated Spin-Crossover in Fe²⁺ and Co²⁺ Mechanophores with First-Principles Calculations

To identify Fe²⁺ and Co²⁺ spin-crossover (SCO) mechanophores that can be activated with a moderate (i.e., ≤ 3.0 nN) force, we developed a computational workflow based on EFEI⁶⁷ simulations (Supporting Information Figure S4). Specifically, we computed the force-modified spin-splitting energy of a complex by performing geometry optimizations with EFEI and calculating the adiabatic spin-splitting energy under incrementally increasing values of applied force. We increased the magnitude of applied force to 3 nN if the complex remained low-spin at lower forces in increments of 0.5 nN, and we discarded the complexes in which coordination bond dissociation occurred prior to LS-to-HS transition (see Computational Details). For all complexes in which low-to-high spin transition was promoted by ≤ 3 nN force, we also determined the critical force for spin-crossover (*F*_{SCO}), i.e., the threshold force for spin transition of the complexes to within a 0.5 nN range (Figure 2). We successfully computed both properties for 155 out of the 186 Fe^{2+} and Co^{2+} candidates, yielding a set of 120 Fe^{2+} and 35 Co^{2+} mechanophores. On the other hand, we found eight complexes unable to undergo LS-to-HS transition without breaking one or more coordination bonds. The complexes are all *fac*-symmetric, and six exhibit asymmetric-shearing force response which we will further introduce in Sec. 3b (Supporting Information Figures S7 and S8). EFEI simulations for the remaining complexes encountered SCF convergence issues (Supporting Information Figure S9). Consistent with the properties of the 199 initial LS complexes that were mostly *mer*-symmetric Fe^{2+} , 141 of the 155 EFEI-characterized complexes are *mer*-symmetric.



Figure 2. (left) Ground state (HS) structure of an example CSD complex GOLVEK under 1 nN force. (middle) $\Delta E_{\text{H-L}}$ of GOLVEK under different EFEI forces. (right) Distribution of spincrossover critical force (F_{SCO}) of Fe²⁺ (blue) and Co²⁺ (red) mechanophores as determined by EFEI. Colors for atoms are as follows: cyan for cobalt, gray for carbon, white for hydrogen, and blue for nitrogen. The carbon and hydrogen atoms in functionalized ethyl groups are colored in light green and light gray for visualization, and the direction of the applied force for each ethyl group is indicated by a black arrow.

The EFEI simulation results revealed that force-activated spin-crossover to high-spin is prevalent (155/163) in low-spin Fe^{2+} and Co^{2+} complexes, and all the 155 complexes can act as

SCO mechanophores with $F_{SCO} \leq 3$ nN. While most prior complexes exhibiting force-activated spin-crossover have terpyridine ligands, we found that our 155 Fe²⁺ and Co²⁺ mechanophores have significantly increased diversity in ligand chemistry. Many of the mechanophores have the metal center coordinated to other heteroaromatic moieties or even non-heteroaromatic nitrogen (Supporting Information Text S1 and Figures S10–S14). Moreover, fourteen of our mechanophores have *fac*-symmetry, a feature not found among known examples (Supporting Information Figures S15 and S16). All Co²⁺ complexes and the majority of Fe²⁺ complexes undergo spin crossover at 1.5 nN or less of applied mechanical force, and all remaining Fe²⁺ complexes have an $F_{SCO} \leq 3$ nN (Figure 2). Among the Fe²⁺ complexes, 33 require very low force ($F_{SCO} \leq 0.5$ nN) for spin crossover and another 73 require only modest forces (47 0.5 nN < $F_{SCO} \leq 1$ nN and 26 1 nN < $F_{SCO} \leq 1.5$ nN). The $F_{SCO} \leq 0.5$ nN, 10 complexes having 0.5 nN < $F_{SCO} \leq 1$ nN, and 12 complexes having 1 nN < $F_{SCO} \leq 1.5$ nN.

The prevalence of spin-crossover induced by low or modest forces among Fe²⁺ and Co²⁺ complexes incentivized us to further elucidate the chemical factors distinguishing those that change spin state at very low forces from those that change spin state at higher forces. To begin our analysis on factors influencing force-activated spin-crossover, we first examined the larger *mer*-symmetric grouping, which accounts for more than 90% of the total mechanophores, as response mechanisms can be expected to differ between *mer*-symmetric and *fac*-symmetric mechanophores. We hypothesized that *mer*-symmetric mechanophores with lower spin-splitting energy (ΔE_{H-L}) would require less force to undergo spin-crossover. If F_{SCO} could be predicted with ΔE_{H-L} alone, this would accelerate mechanophore discovery, as the need for extensive EFEI simulations would be eliminated. Our results support this hypothesis for both *mer*-symmetric Fe²⁺

and Co^{2+} mechanophores, as comparison of spin-splitting energies and spin-crossover forces indicates grouping of F_{SCO} for both Fe²⁺ and Co²⁺ complexes according to $\Delta E_{\text{H-L}}$ (Figure 3).



Figure 3. Stacked histograms of spin-splitting energy ($\Delta E_{\text{H-L}}$) of *mer*-symmetric (left) Fe²⁺ and (right) Co²⁺ (right) mechanophores, as colored by F_{SCO} (blue for $F_{\text{SCO}} \le 0.5$ nN, green for 0.5 nN $< F_{\text{SCO}} \le 1$ nN, yellow for 1 nN $< F_{\text{SCO}} \le 1.5$ nN, and red for 1.5 nN $< F_{\text{SCO}} \le 2$ nN).

Having identified a clear relationship between $F_{\rm SCO}$ and $\Delta E_{\rm H-L}$ for *mer*-symmetric Fe²⁺ and Co²⁺ mechanophores, we next aimed to predict the $F_{\rm SCO}$ of these mechanophores based on the force-free $\Delta E_{\rm H-L}$. We developed decision tree classifiers to quantify such trends using scikitlearn.¹⁰⁹ The two classifiers employ $\Delta E_{\rm H-L}$ values to estimate the $F_{\rm SCO}$ of *mer*-symmetric Fe²⁺ or Co²⁺ mechanophores, respectively, to the nearest calculated 0.5 nN range (Figures 4 and 5). To avoid overfitting, we rounded the decision boundaries derived by the training algorithm to the nearest 0.5 kcal/mol of $\Delta E_{\rm H-L}$ and used these rounded values to calculate the prediction accuracies. The classifier for *mer*-symmetric Fe²⁺ mechanophores correctly categorizes $F_{\rm SCO}$ for the majority of complexes with an accuracy of 73% (Figure 4). Furthermore, given our goal of identifying mechanophores with highly labile spin-crossover behavior, we are particularly interested in finding mechanophores with $F_{\rm SCO} \leq 0.5$ nN. We can identify these complexes robustly by identifying *mer*-symmetric Fe²⁺ mechanophores with $\Delta E_{\text{H-L}} \leq 2$ kcal/mol, as more than 95% of the complexes with these small $\Delta E_{\text{H-L}}$ values also have F_{SCO} values ≤ 0.5 nN (Figure 4). The classifier for *mer*-symmetric Co²⁺ mechanophores also correctly categorizes F_{SCO} of them with 73% accuracy (Figure 5 and Supporting Information Figure S17). As with Fe²⁺ complexes, all *mer*-symmetric Co²⁺ mechanophores with $\Delta E_{\text{H-L}} \leq 2$ kcal/mol have F_{SCO} values ≤ 0.5 nN, facilitating the discovery of highly labile SCO mechanophores. Meanwhile, as *mer*-symmetric Co²⁺ mechanophores is lower than those for the Fe²⁺ classifier (Figures 4 and 5). Overall, our analysis reveals an intuitive relationship between critical force for spin-crossover and spin-splitting energy for *mer*-symmetric Fe²⁺ and Co²⁺ complexes, enabling the quantitative predictions of force-activated spin-crossover based on simple force-free DFT calculations alone.



Figure 4. (left) Decision tree classifier diagram of F_{SCO} prediction based on ΔE_{H-L} for *mer*-symmetric Fe²⁺ mechanophores. Prediction boundaries are specified, and prediction accuracies are shown. (right) F_{SCO} statistics of *mer*-symmetric Fe²⁺ mechanophores having different ΔE_{H-L} values as classified by the decision tree. Statistics of mechanophores with $\Delta E_{H-L} \leq 2$ kcal/mol that are promising candidates for labile spin-crossover mechanophore are also visualized. The decision

tree diagram and the stacked bar plots are colored by F_{SCO} (blue for $F_{SCO} \le 0.5$ nN, green for 0.5 nN < $F_{SCO} \le 1$ nN, orange for 1 nN < $F_{SCO} \le 1.5$ nN, and red for 1.5 nN < $F_{SCO} \le 2$ nN).



Figure 5. (left) Decision tree classifier diagram of F_{SCO} prediction based on ΔE_{H-L} for *mer*-symmetric Co²⁺ mechanophores. Prediction boundaries are specified, and prediction accuracies are shown. The decision tree diagram is colored by F_{SCO} (blue for $F_{SCO} \le 0.5$ nN, green for 0.5 nN < $F_{SCO} \le 1$ nN, and orange for 1 nN < $F_{SCO} \le 1.5$ nN). (right) Force-free ground state (LS) structure of CSD complex QARHUM as an example of a *mer*-symmetric Co²⁺ complex with low ΔE_{H-L} thus low F_{SCO} . Colors for atoms are as follows: cyan for cobalt, gray for carbon, white for hydrogen, and blue for nitrogen. The carbon and hydrogen in functionalized ethyl group are colored in light gray for visualization.

To obtain deeper insights into the behaviors of Fe²⁺ and Co²⁺ mechanophores, we also explored whether the coordination bond lengths in both LS and HS are predictive of F_{SCO} . Predicting spin-crossover behavior with bond length values is desirable, as bond lengths are less sensitive to functional choices compared to ΔE_{H-L} .^{110,111} Analysis of crystal structures in multiple spin states indicates that the LS-to-HS transition typically leads to a bond length increase of 0.2 Å for Fe²⁺ complexes and 0.1 Å for Co²⁺ complexes.^{52,91} One might expect that lower than average distortion between the two states, characterized by longer bonds in LS or shorter bonds in HS, could lead to more facile force-induced spin crossover. As elongation of distal and compression of central coordination bonds are generally observed in Fe²⁺ and Co²⁺ complexes due to steric strain and Jahn–Teller distortion,^{52,91} we also calculated the averages of two central and four distal bonds in the LS and HS state for each complex. We identified a number of *mer*-symmetric Fe²⁺ mechanophores with LS bond lengths elongated due to steric strain that also exhibit a relatively low F_{SCO} (Supporting Information Figures S18 and S19). Beyond this subset of complexes, it is challenging to distinguish F_{SCO} values of most *mer*-symmetric Fe²⁺ and Co²⁺ complexes using a single bond length factor (Supporting Information Figures S20–S24). Decision tree classifiers built with multiple bond length features are also less predictive than ΔE_{H-L} -based classifiers (Supporting Information Figures S25 and S26). On the other hand, we find that these decision trees are relatively accurate at categorizing *mer*-symmetric Fe²⁺ and Co²⁺ mechanophores that are the most force responsive (i.e., $F_{SCO} \leq 0.5$ nN). This finding prompted our further analysis on what bond length features are indicative of the most labile SCO mechanophores.

We identified two geometric factors that are predictive of *mer*-symmetric Fe²⁺ and Co²⁺ complexes exhibiting most reactive mechanochemical responses: the average distal Fe–N coordination bond length in the force-free LS state and the difference in average central Co–N coordination bond length between force-free HS and LS states. Here, central refers to the bond formed between the metal and the middle coordinating atom of the three coordinating atoms on the tridentate ligand, whereas distal can refer to either of the other two coordinating atoms in the tridentate ligand. These two bond length features (i.e., the distal bond in Fe²⁺ and the central one in Co²⁺) can be used to accurately categorize Fe²⁺ and Co²⁺ mechanophores with $F_{SCO} \le 0.5$ nN (Figure 6 and Supporting Information Figures S27 and S28). In fact, all nine *mer*-symmetric Co²⁺ mechanophores with a greater than 0.15 Å difference in central bond length between HS and LS have $F_{SCO} \le 0.5$ nN, while a large majority (i.e., 77% or 17 out of 22) of *mer*-symmetric Fe²⁺

complexes with larger than 2.02 Å average distal Fe–N bond length in the LS state exhibit $F_{SCO} \leq$ 0.5 nN. Additionally, all but three *mer*-symmetric Fe^{2+} complexes have an > 0.14 Å HS-LS central bond length difference (Figure 6). The three outliers are all derived from CSD complex QERDIB, and discarding them leads to 89% prediction accuracy (17 out of 19) of the most labile mersymmetric Fe²⁺ mechanophores using average LS distal Fe–N bond length alone (Supporting Information Figure S29). The chemical factors leading to central bond compression and distal bond elongation differ between Fe^{2+} and Co^{2+} complexes, and this variation results in differences in geometric factors that are predictive of the most labile Fe^{2+} and Co^{2+} complexes. Because the elongation of distal bonds in Fe²⁺ complexes in the force-free state can be attributed to sterics, longer distal bonds indicate that complexes are likely to favor HS states under force. On the other hand, the $d^7 \operatorname{Co}^{2+}$ complexes undergo Jahn–Teller compression, leading to shorter central bonds in LS states.⁹¹ A large difference in HS and LS central bond lengths of a complex thus indicates that its LS state is stabilized by a stronger Jahn-Teller effect. If the complex is extended by external force and the Jahn-Teller effect quickly diminishes, then the LS state will become less favorable and LS-to-HS transition will occur. We conclude that, for mer-symmetric Fe²⁺ and Co²⁺ mechanophores, force-activated spin-crossover can be quantitatively predicted by spin-splitting energetics, and that complexes with most labile spin-crossover can be identified by examining distinct bond length factors for Fe²⁺ and Co²⁺ complexes.



Figure 6. Average distal bond lengths in the force-free LS state (LS d(Fe–N)-distal and LS d(Co–N)-distal) vs differences between average central HS and LS bond lengths (HS-LS Δd (Fe–N)-central and HS-LS Δd (Co–N)-central) for *mer*-symmetric (left) Fe²⁺ mechanophores and (right) Co²⁺ mechanophores that have $F_{SCO} \le 0.5$ nN or $F_{SCO} \ge 0.5$ nN. Note that as bond length values are rounded to closest 0.01 Å in decision-tree prediction to maximize generalizability, the categorization visualized here may have subtle differences compared to actual prediction outcomes.

While in *mer*-symmetric mechanophores external forces are symmetrically propagated along the entire molecule, force propagation can be expected to be distinct for *fac*-symmetric mechanophores. Here, we observe two different modes through which applied force is propagated based on the position of polymer attachment point: i) symmetric pulling and ii) asymmetric shearing (Supporting Information Figures S30 and S31). This distinction arises because, unlike tridentate ligands in *mer*-symmetric mechanophores, tridentate ligands in *fac*-symmetric mechanophores have each coordinating atom located on branches that are bonded to a central atom or group. If the attachment points of a *fac*-symmetric mechanophore are bonded to the central atom or group, then under applied force the mechanophore would be pulled symmetrically. On the other hand, if the attachment points are on the branches, then the mechanophore would undergo asymmetric shearing. Among 12 *fac*-symmetric Fe²⁺ mechanophores, eight are of pulling-type and the remaining four are of shearing-type. For the two *fac*-symmetric Co^{2+} mechanophores, one is of the pulling-type and one is shearing-type.

As symmetric propagation of force along the entire mechanophore leads to less reactive mechanochemical responses, we anticipate that shearing-type fac-symmetric mechanophores should exhibit more significant distortion under same magnitude of force. As a result, shearingtype complexes may have lower F_{SCO} than pulling-type ones. By comparing between two facsymmetric Fe²⁺ complexes with similar ligands differing by only one methyl group, we validated that asymmetric shearing leads to more significant elongation of coordination bonds (Supporting Information Figures S30 and S31). We find that all mechanophores in our set that exhibit $F_{SCO} >$ 2 nN are fac-symmetric Fe²⁺ mechanophores that exhibit pulling-type force responses, and all shearing-type Fe²⁺mechanophores exhibit $F_{SCO} \le 1.5$ nN (Supporting Information Figure S32). Due to the limited number of complexes, it would be challenging to derive more general conclusions. On the other hand, as we have seen among the *fac*-symmetric complexes that undergo bond dissociation before spin transition, we anticipate that if higher magnitude forces are applied, the two bonds that are most significantly elongated in shearing-type complexes would readily dissociate (Supporting Information Figure S7). Nevertheless, this mechanochemical response can become productive instead of destructive as force can be used to stabilize square-planar coordination, as we will consider further in Sec. 3c.

3c. Probing mechanical stability of Fe²⁺ and Co²⁺ spin-crossover mechanophores

Dissociation of the ligands in a SCO mechanophore would be problematic for sensing applications because it would not be reversible, so we thus aimed to identify Fe²⁺ and Co²⁺ complexes with labile spin-crossover that also had good mechanical robustness for reversible

coordination bond extension without subsequent dissociation. Consequently, we evaluated the critical force for bond dissociation (F_{De}), i.e., the threshold force under which coordination bonds began to dissociate (see Computational Details), for all 120 Fe²⁺ and 35 Co²⁺ mechanophores. We evaluated this force to within an 0.5 nN interval successfully for 125 of 155 complexes, while EFEI simulation for the remaining complexes encountered SCF convergence issues (Supporting Information Figures S5 and S33). For this set, we found that 27 complexes remain structurally intact without bond dissociation under applied force of 4 nN or higher, and the remaining > 70% of mechanophores have $F_{De} \le 4$ nN (Figure 7). Moreover, all four complexes that exhibit $F_{De} > 5$ nN are all pulling-type, *fac*-symmetric Fe²⁺ species (Figure 7 and Supporting Information Figure S34). Although symmetric force propagation along the entire complex causes pulling-type, *fac*-symmetric complexes to be less force-responsive in their spin-crossover behavior, it also makes these complexes particularly robust under mechanical loading. We expect these pulling-type complexes to be building blocks of polymer networks with high tearing and outstanding mechanical strength.¹¹²



Figure 7. (left) Distribution of bond dissociation critical force (F_{De}) of Fe^{2+} (blue) and Co^{2+} (red) mechanophores as determined by EFEI. (right) Ground state (HS) structure of CSD complex BANSEQ under 5 nN applied force as an example of a pulling-type, *fac*-symmetric Fe^{2+} complex that remained structurally intact under elevated force. Colors for atoms are as follows: orange for

iron, gray for carbon, white for hydrogen, blue for nitrogen. The carbon and hydrogen in functionalized ethyl groups are colored in light green and light gray for better visualization.

While terpyridine ligands are commonly found in prior complexes exhibiting forceactivated spin-crossover,^{41-43,45} replacing the central or both distal pyridine groups result in ligands and mechanophores simultaneously exhibiting labile spin-crossover and good mechanical robustness. Among all mechanically robust mechanophores with $F_{\text{De}} > 4$ nN, we identified nine *mer*-symmetric Fe²⁺ and two *mer*-symmetric Co²⁺ mechanophores that exhibit $F_{SCO} \le 1$ nN. Based on ligand structures, the Fe²⁺ mechanophores can predominantly be categorized into two types. In the four Type 1 complexes, the ligands are derivatives of 2,6-bis(pyridine)-1-phenyltriazine (Figure 8 and Supporting Information Figures S35 and S36). The Type 1 CSD complex with refcode BUKDOB has the lowest F_{SCO} ($F_{SCO} \le 0.5$ nN) and highest F_{De} (4.5 nN < $F_{De} \le 5$ nN) (Figure 8). One Co²⁺ mechanophore, CSD complex TABDOP, also has a ligand with the bis(pyridine)-triazine motif (Supporting Information Figure S37). In the four Type 2 complexes, the central and distal Fe-N bonds are formed with nitrogen in conjugated pyridine and fivemembered rings with two heteroatoms (Figure 8 and Supporting Information Figure S38). Additionally, in the last Fe²⁺ mechanophore, the central and one distal Fe–N bonds are formed with pyridine rings fused in a phenanthroline group, and the other distal Fe–N bond is formed with a tetrazole bonded to the phenanthroline (Supporting Information Figure S39). Finally, in the other Co²⁺ mechanophore, all Co-N coordination bonds are formed with pyridine groups, yet the pyridine rings are bonded not by C-C single bonds but through NH bridges (Supporting Information Figure S40). These ligands can act as starting points for further systematic discovery of spin-crossover Fe^{2+} mechanophores and especially Co^{2+} mechanophores.



Figure 8. (left, top) Chemical diagram of ligands in *Type 1* Fe²⁺ complexes that contain conjugated triazine, pyridine, and benzene rings. (right, top) Ground state (LS), force-free structure of one complex (CSD refcode: BUKDUH) as an example of a *Type 1* complex. (left, bottom) Chemical diagram of ligands in *Type 2* Fe²⁺ complexes that contain one pyridine conjugated to heteroaromatic rings. (right, bottom) Ground state (LS) structure of one complex (CSD refcode: CAZJET) as an example of a *Type 2* Fe²⁺ complex that exhibits low F_{SCO} and high F_{De} . Colors for atoms are as follows: orange for iron, gray for carbon, white for hydrogen, and blue for nitrogen. The carbon and hydrogen in functionalized ethyl groups are colored in light green and light gray for better visualization.

Due to asymmetric propagation of applied force on two coordination bonds, shearing-type

fac-symmetric mechanophores are less mechanically robust compared to pulling-type complexes,

leading to bond breaking in three Fe²⁺ and four Co²⁺ complexes at moderate forces. Nevertheless,

this bond rupture could lead to the design of functional materials, as mechanical loading would promote octahedral-to-square-planar conformation switching in shearing-type mechanophores to stabilize the resulting square planar complex. We found that with 3 nN applied force, all three Fe^{2+} and three out of four Co^{2+} shearing-type complexes evolve into a distorted square-planar geometry (Figure 9 and Supporting Information Text S2). For one complex, an applied force of 5 nN is needed to promote such structural evolution (Supporting Information Figure S41). In all seven complexes, this transition is characterized by a coplanar arrangement of the metal atom and the four remaining coordinating nitrogen atoms. Although the average angle between two adjacent coordination bonds is 90°, the angles between two adjacent bonds in the same ligand are compressed. This means that angles between the adjacent bonds in different ligands are then increased in a compensatory fashion (Figure 9).



Figure 9. Ground state (HS, square planar) structure of one Fe^{2+} complex (CSD refcode: QAXQAJ) (top) and a Co²⁺ complex (CSD refcode: HUYKOC) (bottom) under 3 nN applied force as examples of shearing-type, *fac*-symmetric Fe^{2+} and Co²⁺ complexes. Relevant bond lengths and bond angles in each complex are labeled. Nitrogen atoms forming coordination bonds in force-free structures that are dissociated upon applied force are highlighted. Colors for atoms are as follows: orange for iron, cyan for cobalt, gray for carbon, white for hydrogen, and blue for

nitrogen. The carbon and hydrogen in functionalized ethyl groups are colored in light green and light gray for better visualization.

We observe that all seven conformation-switching complexes have similar ligands. The ligands are all comprised of three pyrazole, imidazole, or pyridine rings bonded to a linking atom, and coordination bonds are formed between the metal center and a nitrogen in each of the three heteroaromatic rings. In all but one complex, four pyrazole or four imidazole rings remain coordinated to the Fe²⁺ or Co²⁺ center in the distorted square-planar complexes, and the four coordination bonds in each complex have similar lengths (Figure 9 and Supporting Information Figures S42–S45). In one complex (CSD refcode: DIFBAX), two pyrazole and two pyridine rings remained coordinated to the metal center, and the bonds formed with nitrogen in pyridine are 0.12 Å longer than bonds formed with nitrogen in pyrazole (Supporting Information Figure S42). Moreover, in six out of the seven complexes, the pulling points are attached to pyrazole or imidazole rings coordinated to the metal center in the force-free structures. In one complex (CSD refcode: QIZJIU) mentioned earlier for its high 5 nN force required for structural evolution, this can be attributed to the fact that the pulling points are attached to pyridine rings instead. Here, the need to displace a six-membered ring from the metal center during which higher steric hindrance is experienced during molecular rotation could explain the higher force (Supporting Information Figures S41). In their force-free HS states, the seven complexes have average bond lengths between 2.13 and 2.20 Å, which are similar to their bond lengths in the distorted square planar geometry (2.10 to 2.26 Å). In fact, in five out of seven complexes, the force-free and forcemodified bonds differ by less than 0.03 Å (Supporting Information Table S2). In two complexes, the square-planar structure has even shorter bond lengths, suggesting favorability of forming the square-planar conformation. Based on our findings, we envision a broad design space of shearingtype ligands for conformation switching complexes, and we consider these complexes as promising candidates for mechanically activated catalysts that have broad applications in polymer science.^{15,16,113}

4. Conclusions

We developed a strategy for computational discovery of synthetically accessible transition metal complexes with the potential to change spin in response to mechanical force. From a set of complexes mined from the CSD, we identified 199 synthetically accessible LS Fe^{2+} and Co^{2+} complexes that are feasible candidates for spin-crossover mechanophores. By simulating the application of mechanical force with EFEI, we found that force-activated spin-crossover from LS to HS is prevalent. We revealed that among the majority of *mer*-symmetric complexes, labile force-activated spin-crossover is associated with low values of force-free spin-splitting energy. From this insight, we trained decision tree classifiers that enable quantitative prediction of critical force for spin-crossover based on spin-splitting energy and, thus, simple force-free DFT. Furthermore, we found that the most reactive *mer*-symmetric Fe^{2+} and Co^{2+} spin-crossover mechanophores can be predicted using bond lengths of distal bonds in the LS and central bond in the HS state, which are easy to compute and less sensitive to DFT functional choice than the spin-splitting energy.

To understand what the factors leading to facile spin crossover but high mechanical stability, we focused on the 11 Fe²⁺ and Co²⁺ complexes that can be activated for spin-crossover at 0.5 nN force while remaining structurally intact under higher mechanical forces. We found that ligands in these complexes are made by substituting the central or both distal groups in the previously studied terpyridine ligands or by inserting NH bridges between the pyridines. This class of spin-crossover transition metal mechanophores broadens the range of mechanical responses

beyond what is possible with current organic mechanophores, and the abovementioned 11 complexes are promising candidates for follow-up synthesis and characterization. In addition, we discovered a second class of promising complexes comprising certain *fac*-symmetric ligands, wherein applied force led to not only spin-crossover but also a transition to square-planar geometries upon rupture of two coordination bonds. This makes these latter complexes promising candidates for future study to identify complexes with catalytic centers that can be mechanically activated.

Future work is envisioned that expands upon the present study by enlarging the chemical space surveyed. In exploring an even greater number of compounds, we anticipate further refinement of design principles for transition metal mechanophores exhibiting labile spincrossover or identifying reactions that can benefit from complexes that are "unmasked" by mechanical force, paving the way for their development as versatile building blocks for smart polymer materials and molecular devices.

AUTHOR INFORMATION

Corresponding Author

*email:hjkulik@mit.edu

Notes

The authors declare no competing financial interest.

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Data Availability

All data is available in the main text, supporting information, and Zenodo repository.¹¹⁴

Author Contributions

Xiao Huang: data curation, investigation, conceptualization, writing – original draft preparation, visualization; Ilia Kevlishvili: data curation, conceptualization, writing – reviewing and editing; Heather J. Kulik: writing – reviewing and editing, supervision, conceptualization.

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