

# Magnetic Soft Materials and Robots

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## Abstract

In conventional classification, soft robots feature mechanical compliance as the main distinguishing factor from traditional robots made of rigid materials. Recent advances in functional soft materials have facilitated the emergence of a new class of soft robots capable of tether-free actuation in response to external stimuli such as heat, light, solvent, and electric or magnetic fields. Among the various types of stimuli-responsive materials, magnetic soft materials have shown remarkable progress in their design and fabrication, leading to the development of magnetic soft robots with unique advantages and potential for many important applications. However, the field of magnetic soft robots is still in its infancy and requires further advancements in terms of design principles, fabrication methods, control mechanisms, and sensing modalities. Successful future development of magnetic soft robots would require a comprehensive understanding of the fundamental principle of magnetic actuation as well as the physical properties and behavior of magnetic soft materials. In this review, we discuss recent progress in the design and fabrication, modeling and simulation, and actuation and control of magnetic soft materials and robots. We then give a set of design guidelines for optimal actuation performance of magnetic soft materials. Lastly, we summarize potential biomedical applications of magnetic soft robots and provide our perspectives on next-generation magnetic soft robots.

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## 1. Introduction

Composed of materials with moduli close to those of soft biological materials (i.e.,  $10^4$  to  $10^9$  Pa), soft-bodied robots hold great promise for many important applications, particularly in biomedical areas because of their inherent mechanical compliance that can lead to enhanced safety during their operation. The use of soft materials helps to prevent tissue damage while interacting with biological tissues or organs,<sup>1-3</sup> by allowing for continuous deformation<sup>4,5</sup> and ensuring the mechanical similarities to the interfacing tissue. Despite the purported advantages of soft robots and burgeoning efforts to utilize them in biomedical applications, the field of soft robotics is still faced with a set of key challenges. First, conventional soft robots based on pneumatic or hydraulic actuation (i.e., fluid-driven) or antagonistic pairs of mechanical wires (i.e., tendon-driven) are mostly heavily tethered for connection to the driving actuators and supporting hardware.<sup>1,6,7</sup> This limits their practical use in applications where tether-free actuation is required or preferred, such as implantable devices for internal organ support or controlled drug release and minimally invasive devices for therapeutic or diagnostic operations. Second, most soft robots are difficult to accurately model and control, because their actuation mechanisms often rely on highly nonlinear deformation or even instabilities while requiring complex structural designs with many passive degrees of freedom.<sup>1,3,5,8</sup> This elusive nature of soft robots renders the traditional model-based approach for controlling rigid robots largely inapplicable.<sup>9</sup> Third, mainstream soft robots with conventional actuation mechanisms are difficult to miniaturize down to sub-millimeter scales, because their fabrication methods are often unfavorable to such small size.<sup>3,9,10</sup>

The invention of “stimuli-responsive” or “functional” (also referred to as “smart” or “active” in the field) soft materials has led to the development of soft actuators or artificial muscles that can be controlled remotely by means of external stimuli such as heat, light, solvent, or electric or magnetic field.<sup>11</sup> Composed of soft polymers (e.g., elastomers or hydrogels) with integrated micro- or nanomaterials as functional components, most stimuli-responsive soft materials by themselves are not new in the field of materials science. However, the recent progress in advanced fabrication techniques for functional soft materials has enabled previously inaccessible and more sophisticated designs across various length scales, facilitating the development of small-scale, untethered soft robots with programmable shape-changing capabilities.<sup>2,12,13</sup> Among the various types of soft materials that self-actuate in response to external stimuli, magnetically responsive soft materials have shown remarkable progress in terms of both their design and fabrication, leading to the development of magnetically actuated and controlled soft robots.<sup>14-16</sup> These magnetic soft robots possess great potential for biomedical applications because of a set of unique advantages of magnetic actuation. First, natural tissues and organs are transparent to static and low-frequency magnetic fields,<sup>17</sup> and magnetic fields can be remotely applied without causing any adverse effects on biological systems over a wide range of actuating field strengths and frequencies.<sup>18</sup> Second, magnetic fields are relatively easy to control in that their magnitude, phase, and frequency can be modulated accurately and rapidly.<sup>19</sup> For these reasons, magnetic fields can offer a safe and effective means of manipulating untethered soft robots in confined spaces inside the human body.<sup>20</sup>

The potential of magnetic soft robots for biomedical applications has been demonstrated in a number of impressive examples. For instance, self-folding “origami” robots have been reported that can crawl through the gut, patch wounds, and dislodge swallowed objects;<sup>21,22</sup> and soft “capsule” robots have been made that roll along the inner surface of the stomach and can perform biopsies and

deliver medicine.<sup>23-25</sup> Magnetically steerable robotic catheters have also been developed, which can perform minimally invasive therapeutic or diagnostic operations on the heart<sup>26-29</sup> or in the lung airways.<sup>30</sup> Much thinner thread-like robots have also been developed that can navigate the narrow and complex vasculature of the brain to treat intracranial aneurysms or stroke.<sup>31</sup> Ranging from hundreds of micrometers to a few centimeters in diameter, these small-scale robots would not damage interfacing tissues owing to their soft and flexible nature. Despite the promising developments and demonstrated potential of magnetic soft robots, much work still needs to be done to make them practically useful and applicable in clinical settings. Further advancements in the field of magnetic soft materials and robots would require a comprehensive understanding of physical and chemical properties of magnetic materials and fundamental principles of magnetic actuation as well as quantitative modeling of the behavior of magnetic soft materials under applied magnetic fields. Identifying key scientific and technical challenges that remain to be overcome will also be important for developing next-generation magnetic soft materials and robots.

In this review, we discuss recent developments in the field of magnetic soft materials and robots. We first discuss various types of magnetic soft materials with different characteristics depending on the chosen magnetic and polymeric substances as well as their microscopic morphologies and configuration in the composite. Then, we discuss common strategies and underlying principles for different types of magnetic soft actuators, based on which we further discuss the quantitative modeling of magnetic soft materials and robots. We also review recent developments in the related areas of additive manufacturing and microfabrication as well as magnetic manipulation platforms as they pertain to the design, fabrication, actuation, and control of magnetic soft materials and robots. We then discuss applications of magnetic soft materials to soft robotic or electronic devices and also highlight their biomedical applications, in which we see the greatest potential of magnetic soft robots for societal impact. Finally, we provide considerations for future developments of next-generation magnetic soft materials and robots, focusing on unmet needs and remaining challenges.

## 2. Composition, Structure, and Properties

### 2.1. Classification of Magnetic Soft Materials

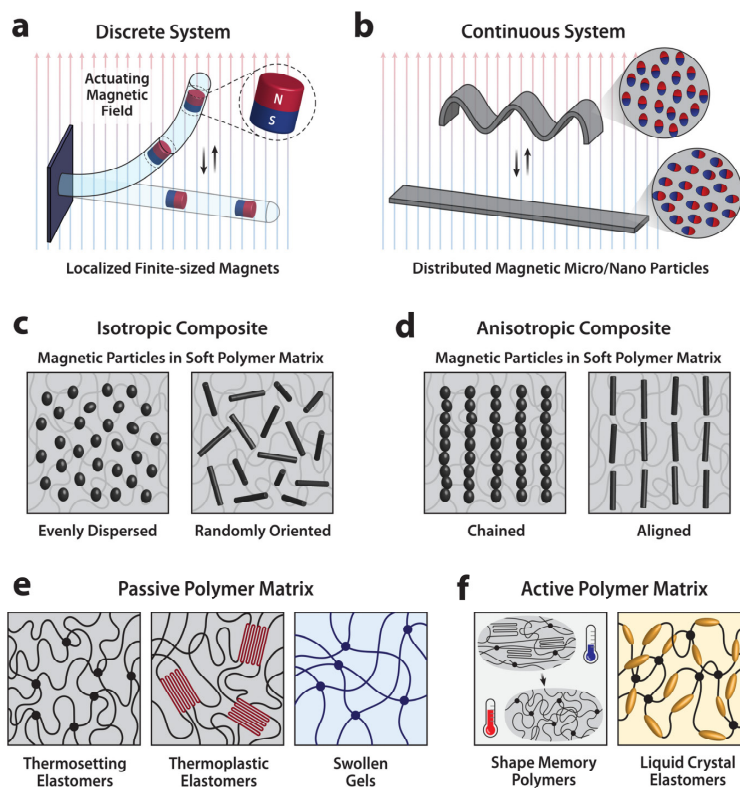
Historically, magnetically responsive soft materials in the form of elastically deformable solids have been referred to by a variety of terms such as magnetorheological,<sup>32-36</sup> magnetoactive,<sup>37,38</sup> or magnetosensitive<sup>39-41</sup> elastomers or gels or, simply ferrogels,<sup>42-45</sup> depending on their applications or the type of materials used. For simplicity, we refer to such elastic solids with mechanical softness or compliance as well as magnetic properties as *magnetic soft materials*. In our definition, and throughout this review, the term “magnetic” generally implies “strongly magnetic”. Accordingly, we will use the term “magnetic materials” to generically refer to “ferromagnetic” or “ferrimagnetic” materials that are strongly attracted to a magnet due to spontaneous magnetization (i.e., magnetic moments present in the material even in the absence of an external magnetic field). Magnetic soft materials in general have at least two constituent materials to form a composite, in which magnets of varying sizes (from nanometers to millimeters) are attached to or integrated into deformable bodies made of soft materials or flexible structures.<sup>20</sup>

Depending on the composite structure, magnetic soft materials can be classified into either discrete or continuous systems. Discrete systems have one or a few finite-sized magnets or some patches of magnetic composite attached to or embedded in the deformable body<sup>21,22,24,25,46</sup> and hence feature



highly concentrated and localized magnetic moments (**Figure 1a**). Continuous systems have dispersed magnetic materials usually in the form of micro- or nanoscale particles, which give rise to diluted and distributed magnetic moments throughout the composite matrices (**Figure 1b**). Continuous magnetic soft materials can be further divided into either isotropic or anisotropic composites, depending on the distribution and orientation of the embedded magnetic particles in the composite matrix. In isotropic composites, the magnetic particles are uniformly dispersed and randomly oriented (**Figure 1c**), regardless of whether the particles themselves are isotropic or anisotropic in shape. In anisotropic composites, however, the embedded magnetic particles are either connected to form microscopic chains that are aligned in the same direction or all oriented toward the same direction (**Figure 1d**), both of which can result from an external magnetic field applied during the solidification of the soft polymer matrix to immobilize the aligned particles.

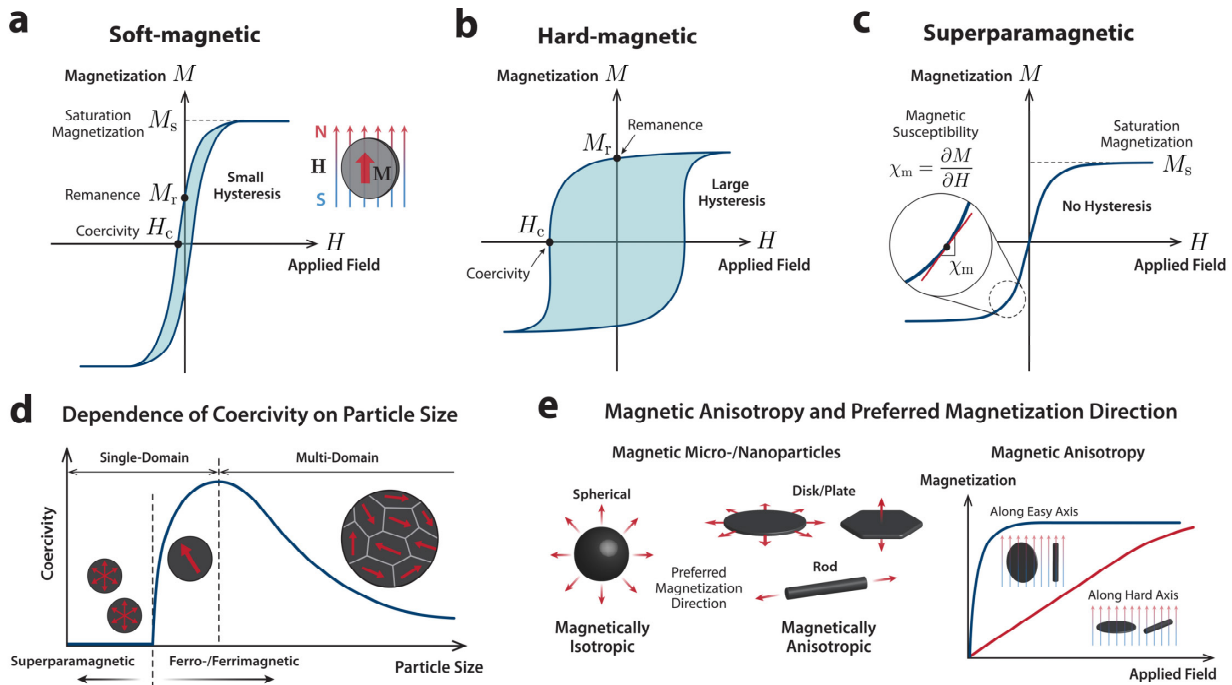
In the following sections, we summarize some common types of magnetic materials as functional components and discuss their physical properties and magnetic characteristics in the context of actuating magnetic soft materials. We then discuss common materials for host polymers or flexible substrates of magnetic soft materials and robots across various length scales.



**Figure 1. Classification and composition of magnetic soft materials.** Magnetic soft materials can be classified into either (a) discrete or (b) continuous systems depending on whether the magnetic components are in the form of finite-sized magnets embedded in the flexible structure or micro- or nanoparticles dispersed in the soft polymer matrix. Continuous magnetic soft materials can be further categorized into either (c) mechanically isotropic or (d) anisotropic composites depending on the microscopic structure or arrangement of the magnetic filler particles in the host polymer matrix. The polymeric component of magnetic soft materials can be classified into either (e) passive polymeric materials such as thermosetting or thermoplastic elastomers and swollen gels or (f) active polymeric materials such as shape memory polymers or liquid crystal elastomers depending on whether the polymer matrices themselves are responsive to external stimuli to change their physical properties or produce actuation via deformation.

## 2.2. Magnetic Components

Among the different classes of magnetic materials, the focus here is primarily on ferromagnetic or ferrimagnetic substances, which are generally considered “magnetic” due to their strong response to an externally applied magnetic field. Depending on the magnetization characteristics, these strongly magnetic materials can be classified into three categories: soft-magnetic, hard-magnetic, and superparamagnetic. The key difference among these types of magnetic materials can be described by the qualitatively different features of their magnetization curves (**Figure 2, a-c**). In doing so, two quantities of particular importance are the remanence (or remanent magnetization),  $M_r$ , and the coercivity (or coercive field),  $H_c$ . The remanence denotes the magnetization that remains in the material even in the absence of external actions once the material is magnetized by a large magnetic field. The coercivity represents the resistance to being demagnetized and measures the magnetic field strength required to reverse the remanent magnetization in the material. Other important parameters are the magnetic susceptibility  $\chi_m$ , and the saturation magnetization  $M_s$ . The magnetic susceptibility indicates how much of the material of interest will be magnetized in a given applied magnetic field and corresponds to the slope of the magnetization curve (i.e.,  $\chi_m = \partial M / \partial H$ , where  $M$  is the induced magnetization and  $H$  is the applied magnetic field) in a differential sense for magnetically isotropic materials. As the field strength  $H$  increases, the material becomes further magnetized and eventually saturated when all moments are aligned substantially with the applied magnetic field, with the induced magnetization,  $M(H)$ , approaching the saturation magnetization  $M_s$ .



**Figure 2. Classification of magnetic materials and characteristics of magnetic particles with different sizes and shapes.** (a-c) Magnetic component of magnetic soft materials can be divided into three categories (soft-magnetic, hard-magnetic, and superparamagnetic) depending on their magnetization characteristics. In general, soft-magnetic materials are characterized by their high saturation magnetization ( $M_s$ ), low coercivity ( $H_c$ ), and low remanence ( $M_r$ ) with narrow hysteresis curves, whereas hard-magnetic materials are characterized by large hysteresis due to their high coercivity and remanence. Superparamagnetic materials exhibit no hysteresis and become quickly saturated under relatively low fields. (d) Qualitative behavior of coercivity of magnetic particles depending on their size. The coercivity increases as the particles become smaller

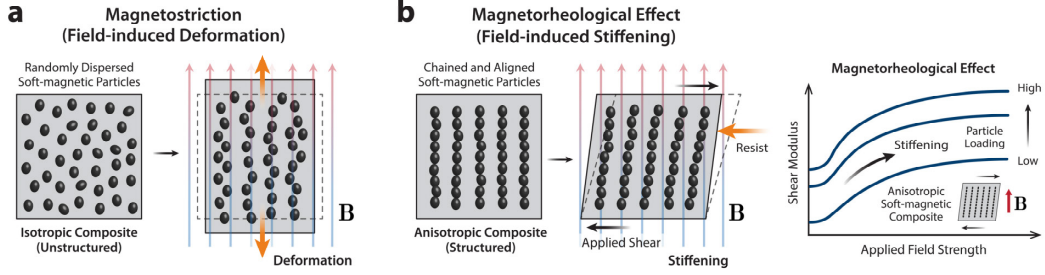
to approach the single-domain regime, but the coercivity disappears below a certain critical size to enter the superparamagnetic regime as the smaller particles become more susceptible to thermal fluctuation and hence cannot retain stable magnetism in the absence of external fields. (e) Magnetic particles can also be classified into magnetically isotropic or anisotropic particles depending on their particle morphology and preferred magnetization direction.

### 2.2.1. Soft-Magnetic Materials

Soft-magnetic materials such as iron and nickel- or silicon-based alloys of iron are characterized by high magnetic susceptibility and saturation magnetization but relatively low remanence and coercivity (**Figure 2a**). Owing to these properties, soft-magnetic materials are strongly attracted to a magnet and easy to magnetize, but at the same time, they are easily demagnetized as well by a relatively weak magnetic field. Conventional magnetic soft composites based on magnetorheological elastomers and ferrogels mostly use carbonyl iron or iron oxide particles embedded in soft polymer matrices. This type of composite exhibits soft-magnetic characteristics (i.e., low remanence and low coercivity) while being mechanically soft (i.e., low Young’s modulus), and we therefore refer to this type as *soft-magnetic soft materials*.

In general, the response of soft-magnetic soft materials to externally applied magnetic fields is complex and largely dependent on the microstructure of the composite as well as the concentration and configuration of the embedded soft-magnetic particles.<sup>47-49</sup> Our focus here is on the qualitative description of the most representative behavior of soft-magnetic soft materials. In an unstructured isotropic composite, the application of a uniform magnetic field induces dipole-dipole interactions between the neighboring particles that are magnetized by the applied field, provided that the particles are close enough to each other due their sufficient volume fraction (**Figure 3a**). Under a sufficiently strong field, the magnetized particles tend to align themselves with the applied field, causing changes in their microscopic arrangement in the composite matrix and associated physical interaction between the particles and the polymer matrix. The microscopic rearrangement of the magnetized particles leads to macroscale material response, causing the matrix to elongate in the applied magnetic field direction (**Figure 3a**).<sup>50</sup> Such magnetically induced deformation is often referred to as “magnetostriction” in the literature.<sup>38,47,49-52</sup>

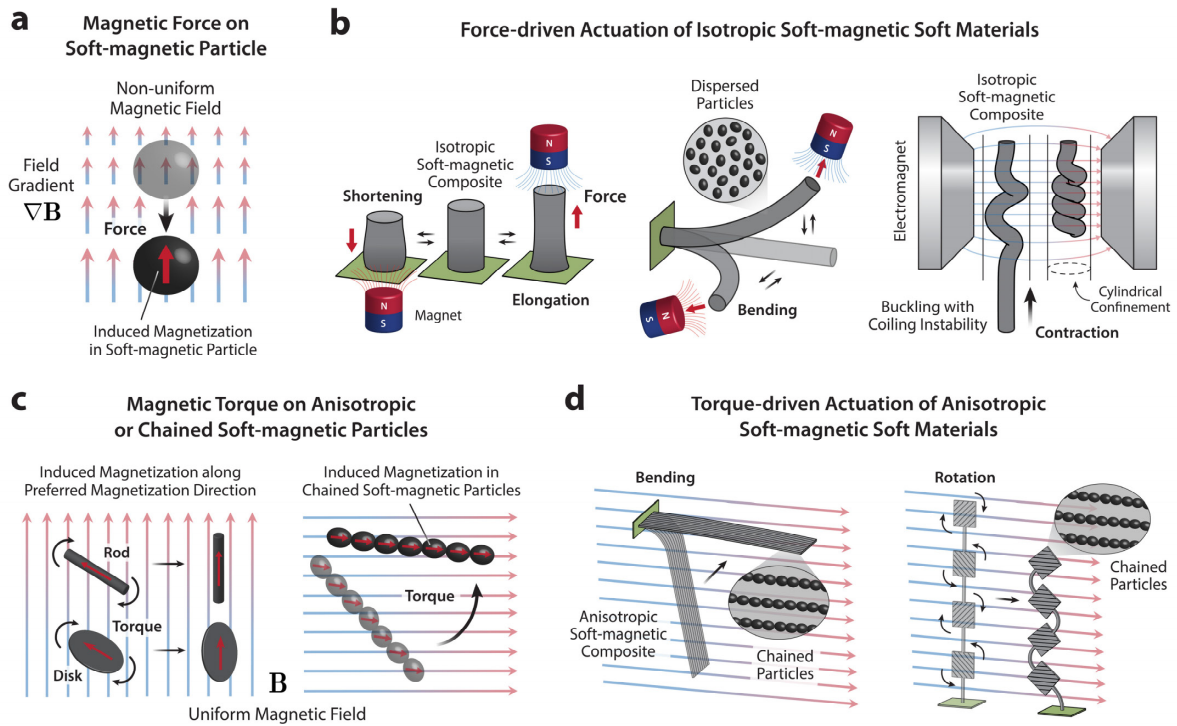
Anisotropic composites with chain-like microstructures can be obtained by applying an external magnetic field to the uncured mixture of soft-magnetic particles and polymer resin/solution during the fabrication process (**Figure 3b**). The applied field magnetizes the particles and induces dipolar coupling between the magnetized particles during the solidification of the composite mixture, after which the particle chains are immobilized within the polymer matrix, resulting in an anisotropic (or transversely isotropic) composite. When an external magnetic field is subsequently applied to this anisotropic composite along the chained particles, magnetic forces arise from the dipole-dipole interaction between the magnetized particles and help them maintain the interparticle orientation to oppose mechanical deformations, thereby increasing the apparent stiffness or modulus of the composite (**Figure 3b**),<sup>36,38,53</sup> which is often termed the “magnetorheological effect” or field-induced stiffening. Owing to their ability to rapidly modulate the viscoelastic properties (stiffness and damping) in a reversible and controllable manner, magnetorheological elastomers and gels have found utility in vibration isolation or absorption applications.<sup>54-59</sup>



**Figure 3. Traditional magnetic soft materials and their response to externally applied magnetic fields. (a)** Field-induced deformation (magnetostriction) of isotropic soft-magnetic soft materials with randomly dispersed particles. **(b)** Field-induced stiffening (magnetorheological effect) of anisotropic soft-magnetic soft materials with chained particles.

In the context of soft robotic applications, however, traditional soft-magnetic soft materials in the form of magnetostrictive or magnetorheological elastomers and gels have somewhat limited utility in terms of creating useful functions to perform a set of different tasks. For instance, it is challenging to reproduce walking gaits or grasping tasks, which typically utilize bending motions or complex shape changes, using the simple deformation based on uniaxial elongation of isotropic composites (**Figure 3a**). Magnetic torques can help to increase the level of complexity in terms of available actuation modes and achievable shapes by introducing additional degrees of freedom associated with the rotation of body parts. However, when the embedded soft-magnetic particles have spherical shapes, the individual particles cannot produce magnetic torques. This is because the induced magnetic moment in each particle is always aligned with the applied magnetic field, meaning zero torque, as a consequence of the spherical particles being magnetically isotropic to have no preferred magnetization direction (**Figure 2e**). For this reason, typical magnetosensitive elastomers and gels based on isotropic soft-magnetic soft materials have utilized force-driven magnetic actuation to create material deformation (shortening,<sup>60</sup> elongation,<sup>42</sup> or bending<sup>61</sup>) (**Figure 4b**) based on the attractive force acting on the magnetized particles under spatially nonuniform actuating fields (**Figure 4a**). Another force-driven actuation mode for isotropic soft-magnetic soft materials in the shape of a cylindrical rod utilizes buckling and coiling instability in the presence of confinement under a strong magnetic field,<sup>62-64</sup> which leads to contraction of the rod in the axial direction to function as an artificial muscle (**Figure 4b**).

To produce magnetic torques from soft-magnetic materials, one needs to break the symmetry in their response to an externally applied magnetic field by introducing some form of magnetic anisotropy in the composite matrix. Such magnetic anisotropy can be introduced by either forming chains of isotropic particles to create asymmetry at the composite level<sup>65-67</sup> (**Figure 4c,d**) or employing anisotropic filler particles with nonspherical shapes (e.g., rods, spheroids, platelets)<sup>68-71</sup> to produce local asymmetry at the particle level (**Figure 2e**).<sup>18,69,72</sup> However, the magnetic torque arising from the broken symmetry due to either anisotropic particle arrangement or anisotropic particle shape is intrinsically nonlinear and hence nontrivial.<sup>73</sup> Unlike isotropic particles in which the magnetization is always induced along the applied field, the induced magnetization in a chain of spherical particles or in a non-spherical particle (**Figure 4c**) is largely dependent on their shape and orientation relative to the applied magnetic field. The magnetic torque produced by a chain of isotropic soft-magnetic particles or an anisotropic particle under an applied actuating field will be described more quantitatively in **Section 3.2.2**, where we discuss the principles of torque-driven actuation for anisotropic soft-magnetic materials based on idealized magnetic constitutive laws.



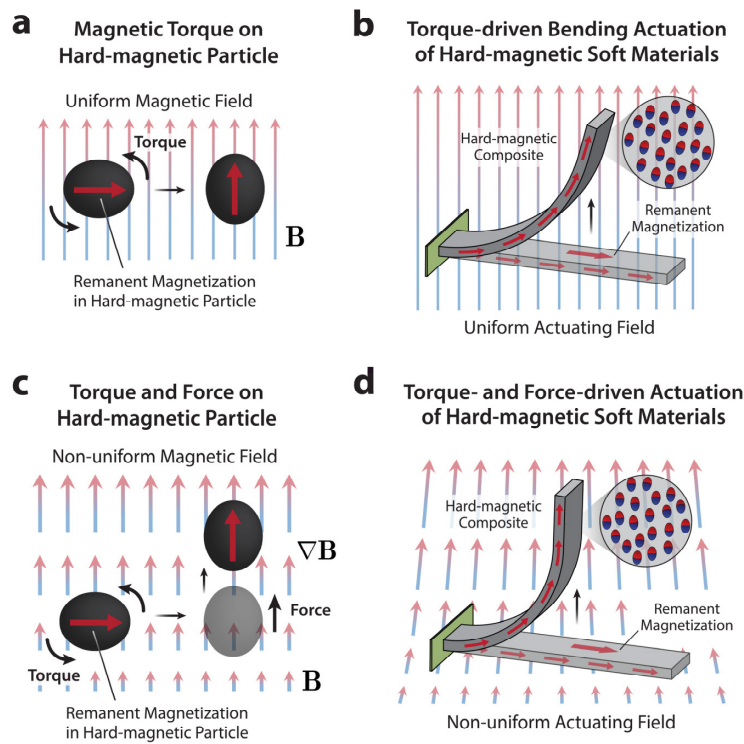
**Figure 4. Different actuation modes of soft-magnetic soft materials.** (a) Magnetic force acting on a single soft-magnetic particle under spatially nonuniform magnetic fields. (b) Force-driven actuation modes for isotropic soft-magnetic soft composites under spatially nonuniform actuating fields: shortening,<sup>60</sup> elongation,<sup>42</sup> bending,<sup>61</sup> and contraction based on buckling and coiling instability.<sup>62-64</sup> (c) Magnetic torque acting on anisotropic or chained soft-magnetic particles under spatially uniform magnetic fields. (d) Torque-driven actuation of anisotropic soft-magnetic soft composites with chained soft-magnetic particles.<sup>65-67</sup> It should be noted that the principle of torque-driven actuation of anisotropic composites based on chained soft-magnetic microparticles<sup>65</sup> also holds for superparamagnetic nanoparticles.<sup>66,67</sup>

### 2.2.2. Hard-Magnetic Materials

The most distinctive feature of hard-magnetic materials is that they can become a stable and permanent source of magnetic field after being magnetized, due to their large magnetic hysteresis characterized by the high coercivity and high remanence (**Figure 2b**). For example, the coercivities of alnico (iron alloys consisting of aluminum, nickel, cobalt, and copper) range from 30 to 150  $\text{kAm}^{-1}$ , which is orders of magnitude greater than that of soft-magnetic materials. In hexagonal ferrites, such as barium hexaferrite ( $\text{BaFe}_{12}\text{O}_{19}$ )<sup>34,46,74</sup> or strontium hexaferrite ( $\text{SrFe}_{12}\text{O}_{19}$ ), the coercivity can be around 300  $\text{kAm}^{-1}$ . It can even exceed 1000  $\text{kAm}^{-1}$  in rare-earth magnets such as samarium-cobalt ( $\text{SmCo}_5$  or  $\text{Sm}_2\text{Co}_{17}$ ) or neodymium-iron-boron ( $\text{Nd}_2\text{Fe}_{14}\text{B}$ ). The high coercivity allows them to be relatively insensitive to external conditions (e.g., temperature and magnetic fields) and have much greater resistance to being demagnetized when compared with soft-magnetic materials. In other words, hard-magnetic materials can retain their high remanent magnetization even when exposed to external magnetic fields (below the coercive field at which the magnetization reversal occurs) or elevated temperature (below the Curie point at which the material begins to lose its remanence). When hard-magnetic particles are incorporated into a soft polymer matrix, the resulting composite can exhibit hard-magnetic characteristics (i.e., high remanence and high coercivity) while being mechanically soft, acting as a flexible and deformable permanent magnet. We refer to this type of magnetic soft composite as *hard-magnetic soft materials*.



One of the unique advantages of using hard-magnetic materials is that magnetic torques can be readily exploited from individual magnetic dipole moments, which act as distributed and stable actuation sources under spatially uniform magnetic fields (**Figure 5a**). Once the embedded hard-magnetic particles are magnetized to saturation, their remanent magnetization can be considered almost independent of the external actuating field below the coercivity. The implication of this stable remanence is that the magnetic torque acting on the material linearly increases with the applied field within the actuation range below the coercivity. As a representative example of hard-magnetic soft actuators, we consider a simple rectangular beam composed of a hard-magnetic soft material that is uniformly magnetized to have its remanent magnetization formed along the length direction (**Figure 5b**). Under a spatially uniform actuating field that is applied perpendicularly to the beam, the embedded hard-magnetic particles tend to align their remanent magnetization with the actuating field due to the magnetic torques, creating bending actuation of the beam toward the applied field direction (**Figure 5b**). Under spatially nonuniform magnetic fields, magnetic forces as well as the magnetic torques act on the particles such that they are attracted toward the direction in which the field strength increases (**Figure 5c**), which helps to further increase the deflection of the beam (**Figure 5d**).



**Figure 5. Torque- and force-driven bending actuation of hard-magnetic soft materials.** (a) Magnetic torque acting on a magnetized hard-magnetic particle under a spatially uniform magnetic field. (b) Rectangular beam made of a hard-magnetic soft composite that is uniformly magnetized along the length direction and its torque-driven bending actuation under a uniform actuating field that is applied perpendicularly to the beam’s remanent magnetization. (c) Magnetic torque and force acting on a magnetized hard-magnetic particle under a spatially nonuniform magnetic field, in which the particle not only rotates due to the magnetic torque but also moves toward the direction of the increasing field due to the attractive magnetic force. (d) Bending actuation of hard-magnetic soft materials under nonuniform actuating fields is initially driven by the magnetic torque and further supported by the increasing magnetic force as the body deforms to align its remanent magnetization with the applied field.

For such bending actuators, either isotropic or anisotropic hard-magnetic particles can be used. When using magnetically anisotropic hard-magnetic particles as distributed actuation sources (e.g., platelet-shaped barium hexaferrite particles), the neighboring particles should be oriented toward the same direction (**Figure 1d**) to be able to create macroscale bending actuation of the composite using the magnetic torques generated by the particles. This is because the preferred magnetization directions of magnetically anisotropic particles are constrained to their easy axes due to the shape-induced or magnetocrystalline anisotropy (**Figure 2e**). If the magnetized rods or platelets were randomly oriented in the composite (**Figure 1c**), with their magnetic moments pointing in different directions, the magnetic torques produced by the particles would cancel each other out to yield zero net torque at the composite level. The necessity of such particle alignment in the composite to produce a nonzero net torque implies that the composite is likely mechanically anisotropic to have greater stiffness along the aligned particles which essentially act as rigid, reinforcing elements.

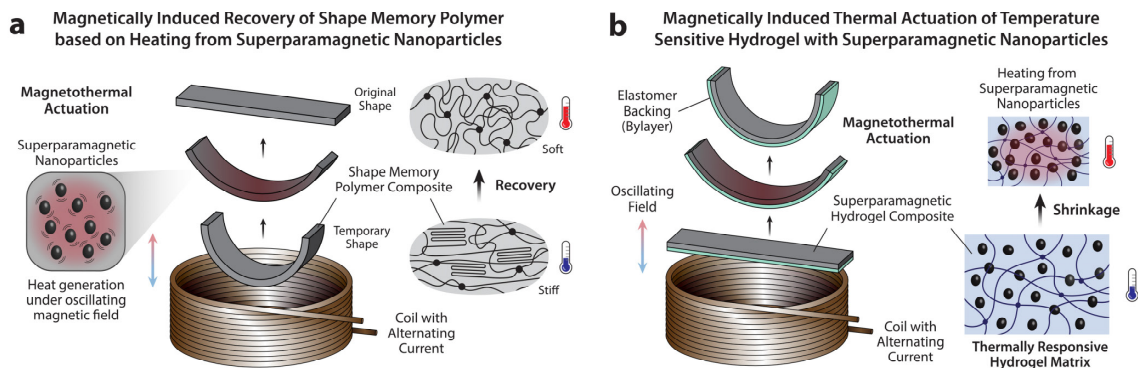
For simplicity, it is also possible to use magnetically isotropic hard-magnetic materials such as rapidly solidified (e.g., melt-spun or gas-atomized) neodymium-iron-boron microparticles.<sup>75-77</sup> Upon rapid quenching of the molten alloy, the solidified microparticles can develop nanocrystalline or amorphous microstructure with nanoscale grain size comparable to or less than a single magnetic domain, giving rise to their isotropic magnetization properties. Therefore, when magnetically isotropic hard-magnetic particles are used, the magnetic torque can be readily exploited regardless of the shape and orientation of the embedded particles, and thus the remanent magnetization within the composite matrix can be designed in a more flexible manner. Recent advances in the fabrication techniques have facilitated engineering hard-magnetic soft materials with programmable, complex shape-changing capabilities by enabling design of intricate magnetization patterns within the composite matrix. The resulting structures, as we shall see later, have demonstrated a rich array of actuation behavior due to the additional degrees of freedom controlled by the magnetic torque.

### 2.2.3. Superparamagnetic Materials

It is worth noting that the magnetization characteristics of certain magnetic materials are not necessarily their intrinsic material properties. That is, the same magnetic material can exhibit different magnetization behavior depending on its size, shape, crystalline microstructure, etc. For example, typical soft-magnetic materials such as iron, nickel, and cobalt can have relatively stable remanent magnetization when they are in the form of single-domain particles with anisotropic shape (e.g., nanorods or nanowires) due to the enhanced coercivity, which increases with their aspect ratios.<sup>78-81</sup> The coercivity of magnetic materials is largely dependent on the particle size as well. When the size is sufficiently small (e.g., below a micrometer in diameter), magnetic particles prefer to stay uniformly magnetized and to avoid the formation of magnetic domains, exhibiting single-domain characteristics with high remanence. However, when the particles become smaller than a certain critical size, the coercivity starts to decrease drastically as the particles become more susceptible to thermal fluctuation and relaxation (**Figure 2d**). Hence, ferro- or ferrimagnetic particles smaller than the critical size would behave in a way analogous to paramagnetic materials with no hysteresis (i.e., no remanence in the absence of an external magnetic field), except for the fact that it still retains relatively high magnetic susceptibility (i.e., remaining strongly magnetic in the presence of an external field). For this reason, this type of behavior has been denominated as *superparamagnetism*. The magnetization curve of a superparamagnetic particle is characterized by the near absence of remanence and coercivity and is therefore typically modeled with the Langevin function (**Figure 2c**).

Iron oxide nanoparticles, particularly magnetite ( $\text{Fe}_3\text{O}_4$ ), are most commonly used for biomedical applications because of their biocompatibility.<sup>82-84</sup>

Magnetic soft composites with embedded superparamagnetic nanoparticles, which we refer to as *superparamagnetic soft materials*, are similar to soft-magnetic soft materials in the sense that they cannot produce magnetic torques without columnar microstructures of chained particles for providing magnetic anisotropy. Magnetic torques generated by the chained superparamagnetic nanoparticles have been demonstrated to be an effective means for driving small-scale soft bending actuators (**Figure 4d**).<sup>67,85,86</sup> However, the maximum particle loading at which the nanoparticles are uniformly dispersed in the soft polymer matrix is in general far lower (i.e., typically below 10 vol%) than that of soft- or hard-magnetic microparticles.<sup>87,88</sup> This can be attributed in part to the propensity of nanoscale magnetic particles to cluster and aggregate due to attractive van der Waals forces between the particles when the interparticle distance decreases as the particle volume fraction increases.<sup>89-91</sup> For better dispersion and colloidal stability, magnetic nanoparticles need to be coated or functionalized with polymers to have thin shells to increase the electrostatic repulsion and steric interaction to balance the attractive forces.<sup>88-92</sup> With the relatively low particle concentration, the field-induced stiffening or elongation behavior under an applied field is generally less pronounced in superparamagnetic soft materials than in magnetorheological elastomers or gels based on soft-magnetic microparticles. For these reasons, previously reported superparamagnetic soft materials mostly utilized magnetic forces acting on the embedded particles in the presence of field gradients (i.e., under nonuniform magnetic fields) to induce deformations at the composite level (**Figure 2c**),<sup>60,61,93,94</sup> commonly in the form of macroporous sponge-like composites to maximize the strain. Overall, the relatively low particle concentration in superparamagnetic soft materials leads to low magnetic moment density per unit volume and therefore low magnetic torque and force densities in general, when compared with the other types of magnetic soft materials.



**Figure 6. Magnetothermal actuation of superparamagnetic soft materials based on thermally responsive polymer matrices.** The programmed shape changes of the composite structures are triggered by field-induced heating through thermal relaxation of the embedded superparamagnetic nanoparticles under alternating fields, which leads to (a) recovery of the shape memory polymer into the original shape or (b) deswelling (shrinkage) of the temperature-sensitive hydrogel in the form of bilayer structure.

Although superparamagnetic nanoparticles may not be ideal for producing actuation due to the limitations discussed above, they could offer a unique advantage in converting electromagnetic energy into heat via thermal relaxation under an alternating magnetic field.<sup>83,95,96</sup> Ferromagnetic microparticles can also produce heat by dissipating energy through other mechanisms such as



magnetic hysteresis, where the area of the hysteresis loop is proportional to the dissipated energy. However, the energy dissipation in ferromagnetic microparticles during the cycle of magnetization and demagnetization would require either high field strength due to their greater coercivity or low frequency due to the longer time scale in their magnetization/demagnetization behavior, rendering it less effective and energy-efficient than generating heat using superparamagnetic nanoparticles. When superparamagnetic nanoparticles are incorporated into thermally responsive polymeric materials, such as shape memory polymers,<sup>97-102</sup> liquid crystal elastomers,<sup>103,104</sup> and temperature-sensitive hydrogels,<sup>105,106</sup> internal heating through the released energy from the nanoparticles under alternating magnetic fields can be harnessed to induce programmed shape changes (**Figure 6a**) or control swelling/deswelling behavior of the composite (**Figure 6b**), producing indirect actuation that is different from direct magnetic actuation based on magnetic forces or torques.

### 2.3. Polymeric Components

Polymeric components of magnetic soft materials account for the elasticity of the composite matrices in which the magnetic filler particles are embedded. Forces and torques acting on the individual particles under an external magnetic field generate internal mechanical stresses, causing the soft polymer matrix to deform, the extent of which is determined by how soft or flexible the material or structure is and how the polymeric material behaves under the applied stress. A variety of soft elastomers and gels can be used as host polymers for the embedded magnetic fillers, and the choice of polymeric substances depends on various factors: desired mechanical (viscoelastic) properties of the composite, physicochemical properties of the chosen polymers and their compatibility with magnetic filler particles (especially when the particles are surface-treated or functionalized), required functions and target applications, environmental conditions, fabrication schemes, and so on. In the traditional sense of magnetic soft materials, polymeric components are mostly passive (**Figure 1e**), while the activeness comes only from the embedded magnetic particles in response to the actuating field. More recent studies have demonstrated multifunctional magnetic soft materials that utilize thermal or photothermal actuation in tandem with magnetic actuation by using stimuli-responsive materials such as shape memory polymers<sup>107-111</sup> and liquid crystal elastomers<sup>112</sup> as active polymeric components (**Figure 1f**). In the following sections, we discuss some commonly used soft polymeric materials and their characteristics in the context of magnetic soft actuators.

#### 2.3.1. Passive Polymer Matrices

##### 2.3.1.1. Elastomers

Among the various types of rubber-like soft materials, silicone-based thermosetting elastomers (**Figure 1e**) have been most commonly used as host polymers for magnetic soft materials, primarily because they are relatively easy to handle during the fabrication process for producing composite materials. In addition, there is a wide range of commercial products with different mechanical properties available off the shelf. Some of the representative products include Sylgard 184 (Dow Chemical), Ecoflex 00-10/00-20/00-30 (Smooth-On, Inc), and Elastosil RT604/RT625/RT745 or M4601/M4644 (Wacker Chemie AG), which are addition-curing type silicone elastomers that can be cured at either elevated temperature (faster curing) or room temperature (slower curing) upon the addition of platinum-based catalysts. Unless too heavily loaded, magnetic particles can be mixed easily with the base liquid of uncured silicone resin using a planetary centrifugal mixer before adding the catalysts. However, it is worth noting that microparticles or agglomerates of nanoparticles can

settle in the uncured mixture after some time due to gravitational sedimentation of the dispersed particles, leading to phase separation in the composite mixture. For composites based on hard-magnetic microparticles, it has been shown that the uncured composite mixture can become a thixotropic paste when the dispersed particles are permanently magnetized, which helps to prevent the sedimentation of the dispersed particles over time.<sup>31</sup> After mixing with the curing agent (catalysts), the composite mixture can be cast, molded, or printed to obtain desired shapes upon curing and solidification. The inclusion of rigid filler particles generally leads to the reinforcement of the elastomer, making the composite stiffer and less stretchable than unfilled elastomers. The increased stiffness and reduced stretchability can be compensated to some extent by lowering the cross-linking density of the silicone elastomer network by reducing the amount of the cross-linking agent during the fabrication process.

Thermoplastic elastomers have also been used as the host polymers for magnetic soft composites, where common types of materials include thermoplastic polyurethane<sup>65,66,113</sup> and styrene-ethylene-butylene-styrene (SEBS),<sup>114-116</sup> which are essentially block copolymers with alternating rigid and flexible segments. The rigid crystalline segments serve as physical cross-links to form a copolymer network (**Figure 1e**), while the flexible amorphous segments provide the network with elasticity.<sup>117</sup> At elevated temperature, the rigid segment becomes disentangled and softer, making the polymers melt-processable. Upon cooling, the rigid segment solidifies again, and the material regains its strength and elasticity. Magnetic particles can be mixed into the molten thermoplastic elastomers through a process called melt blending or compounding, typically using a twin-screw extruder, and then formed into desired shapes through different manufacturing processes such as extrusion, injection, blowing, and compression molding. However, such melt-processing requires dedicated facilities that are often too bulky and costly for a single laboratory to have for research purposes. Hence, it is not uncommon to use organic solvents (i.e., tetrahydrofuran<sup>65</sup> or dimethylformamide<sup>31</sup>) to dissolve the thermoplastic elastomers for blending with magnetic particles as well as processing at room temperature. The mixture can be cast, molded, or printed into desired forms that solidify upon evaporation of the solvent. This method, so-called solvent casting, however, inevitably entails a certain level of shrinkage of the composite volume during the solidification process as a result of the evaporation of the solvent molecules.

Thermoplastic elastomers in general have more desirable mechanical properties in terms of the strength and toughness and are hence more durable than silicone elastomers. However, magnetic soft composites based on thermoplastic elastomers generally exhibit smaller deformations due to their higher modulus values, when compared with softer silicone-based composites under the same conditions in terms of the geometry, magnetic particle concentration, and actuating field strength. Therefore, when it comes to design and actuation, magnetic soft materials and robots based on thermoplastic elastomers often require their structural rigidity (i.e., bending stiffness) to be smaller or the actuating magnetic fields to be stronger when compared with silicone-based magnetic soft materials and robots. In the context of biomedical applications, there exist medical-grade silicone and thermoplastic elastomers that are mechanically soft while at the same time biocompatible to be used for medical devices. Being thermosetting polymers, silicone elastomers are resistant to heat, and hence silicone-based magnetic soft materials can be readily sterilized by heat (dry heat or steam autoclave). When hard-magnetic components are used, however, elevated temperature can potentially affect the programmed magnetization pattern and the magnetization strength due to

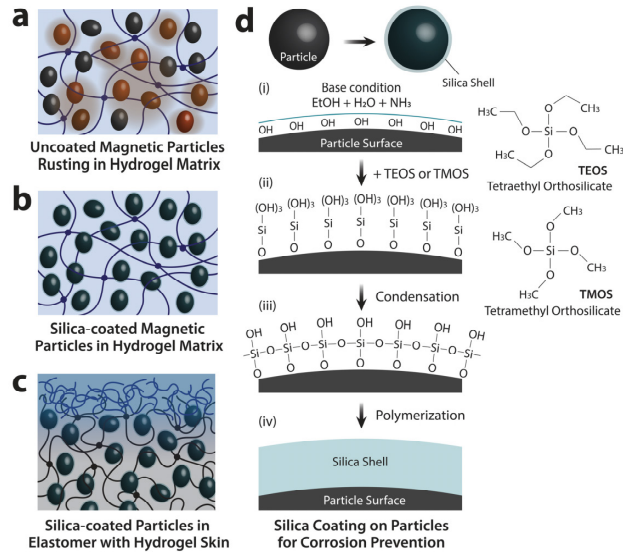
thermal relaxation and randomization as discussed earlier. Therefore, if applicable, the heat sterilization should precede the magnetization process during the fabrication; otherwise, other sterilization methods such as ethylene oxide treatment are preferred. Electron beam or gamma ray irradiation can be used, in principle, but these sterilization methods based on ionizing radiation can cause changes in the mechanical properties of silicone and thermoplastic elastomers,<sup>118,119</sup> which may affect the actuation performance as well.

### 2.3.1.2. Gels

Gels generically refer to semisolids composed of cross-linked or colloidal polymer networks with entrapped liquids throughout the entire volume of the swollen polymer network (**Figure 1e**). With a relatively low polymer content, gels are generally much softer than elastomers. The focus here, in the context of magnetic soft materials and robots, is primarily on cross-linked gels (elastic solids), which exhibit much greater elasticity than colloidal gels (complex fluids with finite yield stresses). Composed of hydrophilic polymers, gels containing water as a swelling agent are referred to as hydrogels, while gels swollen in organic solvents or oils are referred to as organogels. Organogels based on styrenic block copolymers such as styrene-ethylene-butylene-styrene (SEBS) or styrene-butadiene-styrene (SBS) swollen in paraffin or mineral oils<sup>120-122</sup> as well as polyurethane or silicone gels<sup>123</sup> have been used with carbonyl iron particles, mostly for vibration isolation and absorption applications. For biomedical applications such as targeted drug delivery, hydrogels have been more commonly used because of their purported advantages in terms of biocompatibility or biodegradability.<sup>124</sup> As the host polymers for magnetic filler particles, hydrogels based on naturally occurring polysaccharides such as alginate,<sup>60,93</sup> carrageenan,<sup>59,125-127</sup> and scleroglucan<sup>128</sup> or hydrogels based on synthetic polymers such as poly(vinyl alcohol),<sup>43,129-131</sup> poly(*N*-isopropylacrylamide),<sup>105,132-134</sup> and polyacrylamide<sup>135-137</sup> have been used. Poly(*N*-isopropylacrylamide) has been used to design thermally responsive magnetic soft robots with dual (magnetic and photothermal) actuation for multimodal locomotion<sup>134</sup> or thermal actuation combined with magnetic guidance or navigation.<sup>132</sup> When compared with elastomers, hydrogels are in general mechanically weak and brittle<sup>138,139</sup> due mainly to their high water content (i.e., low polymer content), and so are most of the hydrogel-based magnetic soft composites. To improve their mechanical robustness while maintaining the softness, highly stretchable and tough hydrogels based on double networks of polyacrylamide-alginate<sup>61</sup> or physically cross-linked poly(*N,N*-dimethylacrylamide) by nanoclays<sup>140</sup> have also been adopted for magnetic soft materials.

For hydrogel-based magnetic soft materials, it should be noted that ferromagnetic particles can be corroded in the aqueous environment of hydrogels (**Figure 7a**). The corrosion process can be accelerated in the presence of dissolved ions which are used as physical cross-linkers for ionically cross-linked hydrogels (e.g., alginate, chitosan, hyaluronan, etc.). Partly because of this corrosion problem, relatively inert (i.e., already oxidized) iron oxide nanoparticles have been more commonly used as filler particles for magnetic soft composites based on hydrogels. To prevent corrosion of ferromagnetic particles in hydrogels, protective coating can be applied to the particle surface (**Figure 7b**) through different methods. As an example, microparticles of carbonyl iron<sup>141-143</sup> and neodymium-iron-boron<sup>31</sup> can be coated with a thin layer of silica (SiO<sub>2</sub>) through hydrolysis and condensation of tetraethyl or tetramethyl orthosilicates (TEOS/TMOS), also known as the Stöber method, followed by the nucleation of silica around the magnetic particles (**Figure 7d**). Other methods for introducing an inert passivation layer on the surface of ferromagnetic particles include plasma electrolytic

deposition,<sup>144</sup> atomic layer deposition,<sup>145,146</sup> chemical vapor deposition,<sup>147</sup> and those based on chemical reactions for surface polymerization and polymer grafting.<sup>148-150</sup> Anti-corrosion coating is also useful for elastomer-based composites, when they are coated with hydrogel skin (**Figure 7c**) to enhance lubrication and biocompatibility for biomedical applications.<sup>31</sup>



**Figure 7. Silica coating on magnetic particles for corrosion prevention.** (a) Corrosion of ferromagnetic particles in the aqueous environment of magnetic soft composites based on hydrogels. Silica-coated ferromagnetic particles for corrosion prevention in (b) hydrogel-based composites or (c) elastomer-based composites with hydrogel skin for biocompatibility and lubrication. (d) Schematic of the polycondensation reaction of tetraethyl and tetramethyl orthosilicate (TEOS/TMOS) in the presence of catalysts under basic conditions, in which the nucleation and polymerization of TEOS/TMOS give rise to cross-linked layers of silica around the magnetic particles.<sup>31</sup>

### 2.3.2. Active Polymer Matrices

Magnetic soft composites based on passive polymer matrices (i.e., elastomers or gels) undergo elastic deformation under an externally applied field and revert to their original shape upon the removal of the applied field. The fact that the deformed state can be maintained only in the presence of an external actuating field may in some cases be considered an inherent limitation of magnetic soft materials for their applications to where semipermanent shape changes are preferred.

Aimed at enabling magnetic soft materials to maintain their actuated state or deformed shape without continuously applying an actuating field, thermally responsive shape memory polymers (**Figure 1f**) have been adopted as the polymeric component of both soft- and hard-magnetic soft materials.<sup>107-111</sup> Thermally activated shape memory polymers are generally stiff below the transition temperature and become softer and more malleable when heated to reach the transition point. When soft-magnetic or hard-magnetic particles are incorporated as distributed actuation sources in shape memory polymers, the composite can be deformed at or above the transition temperature into a desired shape through force- or torque-driven actuation under externally applied magnetic fields. Upon cooling below the transition point, the composite becomes stiffer again to maintain the deformed shape. The deformed composite can revert to its original shape when heated above the transition temperature in the absence of external fields or deform into a new temporary shape when heated in the presence of another actuating field to magnetically induce the deformation. It is worth

noting that there is a key difference between this type of magnetically deformable shape memory polymer with shape-locking ability and the conventional type of magnetically activated shape memory polymers<sup>97-102</sup> discussed earlier (see **Section 2.2.3**). The conventional type mostly used heat generated by the embedded superparamagnetic nanoparticles under oscillating fields to trigger the shape memory effect to recover its original shape from the temporary shape (**Figure 6a**) as an indirect means of magnetic actuation. When the two approaches are combined by adding different types of magnetic particles, such as hard-magnetic microparticles for magnetic actuation and superparamagnetic nanoparticles for magnetic heating, it has been shown that the composite can provide fully magnetically controlled actuation with shape-locking capability.<sup>107</sup>

Another class of stimuli-responsive polymeric substances for magnetic soft materials is liquid crystal elastomers, which are loosely cross-linked soft polymers containing anisotropic (rod-like) molecules called mesogens that are covalently attached to the polymers<sup>96,151</sup> either as side chains or within the main chains (**Figure 1f**). When heated above their transition temperature, liquid crystal elastomers undergo a large contraction along the direction of mesogen alignment, as the mesogens undergo a phase transition from an ordered (nematic) state to a disordered (isotropic) state. Complex shape changes can be programmed into liquid crystal elastomers by controlling the mesogen alignment in the nematic phase. Unlike shape memory polymers with mostly one-way actuation, liquid crystal elastomers can produce large deformation in a reversible manner. As is the case with shape memory polymers, liquid crystal elastomers have also been used along with superparamagnetic nanoparticles to exploit magnetic heating for triggering the nematic-isotropic phase transition<sup>103,104</sup> as discussed in **Section 2.2.3**. Recently, hard-magnetic soft composites based on liquid crystal elastomers have been used to develop small-scale untethered soft robots capable of distinct locomotion in different environments, such as walking on a solid surface or swimming by helical propulsion in a warm liquid after thermally induced shape change.<sup>112</sup>

### 3. Modeling of Magnetic Soft Materials

A comprehensive understanding of the fundamental principles for magnetic actuation, as well as the physical properties and behavior of magnetic materials, plays a key role in the design of magnetic soft materials and robots. When the behavior of magnetic soft materials is modeled, the different magnetic characteristics and constitutive relations for the chosen magnetic and polymeric components should be considered. For example, magnetized hard-magnetic particles can produce torques under externally applied fields, whereas soft-magnetic or superparamagnetic particles do not generate torques unless there is some form of magnetic anisotropy. Therefore, to exploit torque-based actuation with soft-magnetic or superparamagnetic materials, one needs to use particles with asymmetrical shapes or chained particles. In the following sections, we first review some of the fundamental magnetostatic relations and discuss how the magnetic force and torque can be formulated for hard-magnetic, soft-magnetic, and superparamagnetic soft materials.

#### 3.1. Principles of Magnetic Actuation

##### 3.1.1. Force and Torque on a Magnetic Dipole

The actuation of magnetic soft materials relies on forces and torques acting on the embedded magnetic components under externally applied magnetic fields. When a magnetic dipole (point-like source) with the magnetic moment  $\mathbf{m}$  is located at the position  $\mathbf{x}$  in free space under an externally applied magnetic field  $\mathbf{B}$ , it possesses the magnetic potential energy  $u_m$  (also known as Zeeman energy) defined as the dot product of the two vector quantities as

$$u_m = -\mathbf{m} \cdot \mathbf{B}. \quad (1)$$

A small variation in the position and orientation of the magnetic moment, with the constraint of fixed magnitude  $|\mathbf{m}|$ , causes the change in the potential energy, which can be expressed as

$$-\delta u_m = \mathbf{m} \cdot \delta \mathbf{B} + \delta \mathbf{m} \cdot \mathbf{B}. \quad (2)$$

For irrotational (i.e., curl-free) magnetic fields with no free electric currents (see Eq.(10) below), Eq.(2) can be transformed using relevant vector and tensor identities into an equivalent form as

$$-\delta u_m = \delta \mathbf{x} \cdot (\text{grad } \mathbf{B})\mathbf{m} + \delta \boldsymbol{\theta} \cdot (\mathbf{m} \times \mathbf{B}), \quad (3)$$

where  $\delta \mathbf{x}$  is the change in the magnetic moment position, and  $\delta \boldsymbol{\theta}$  is a vector that points along the axis of rotation with its magnitude corresponding to the angle of rotation of the magnetic moment  $\mathbf{m}$ . In Eq.(3),  $\text{grad } \mathbf{B}$  represents the spatial gradient of the applied magnetic field with respect to the point  $\mathbf{x}$ . It is worth noting that the infinitesimal rotation of the magnetic moment  $\delta \mathbf{m}$  is related to  $\delta \boldsymbol{\theta}$  by the following cross-product relation:  $\delta \mathbf{m} = \delta \boldsymbol{\theta} \times \mathbf{m}$ . From Eq.(3), the magnetic force,  $\mathbf{f}_m$ , acting on the magnetic moment is given by

$$\mathbf{f}_m = -\frac{\partial u_m}{\partial \mathbf{x}} = (\text{grad } \mathbf{B})\mathbf{m}, \quad (4)$$

while the magnetic torque,  $\boldsymbol{\tau}_m$ , acting on the magnetic moment is given by

$$\boldsymbol{\tau}_m = -\frac{\partial u_m}{\partial \boldsymbol{\theta}} = \mathbf{m} \times \mathbf{B}. \quad (5)$$

It is worth noting that Eq.(4) can be expressed equivalently as

$$\mathbf{f}_m = (\mathbf{m} \cdot \nabla)\mathbf{B}, \quad (6)$$

using a more common expression in the literature based on the vector operator  $\nabla = (\partial/\partial x_i) \mathbf{e}_i$  (also called the nabla operator), where  $\mathbf{e}_i$  represents the three Cartesian basis vectors ( $i = 1, 2, 3$ ).

From Eq.(5) we know that the magnetic torque vanishes when the magnetic moment  $\mathbf{m}$  is aligned (either parallel or antiparallel) with the actuating field  $\mathbf{B}$ . We also know from Eq.(4) (or equivalently from Eq.(6)) that the magnetic force  $\mathbf{f}_m$  exists only in the presence of magnetic field gradients. This implies that the actuation based on spatially uniform magnetic fields is driven solely by the magnetic torque  $\boldsymbol{\tau}_m$ . Under spatially nonuniform actuating fields, magnetic forces as well as torques can contribute to the actuation of magnetic soft materials. In Eq.(6),  $(\mathbf{m} \cdot \nabla)$  denotes the directional derivative in the direction of  $\mathbf{m}$  multiplied by its magnitude. Physically, this implies that the magnetic force can be produced when there is a variation in the applied field in the direction of the magnetic moment. In general, it is the magnetic torque that drives the actuation by rotating the magnetic object to align its remanent or induced magnetic moment with the applied field, while the magnetic force attracts the aligned object in the direction of increasing field strength (**Figure 5, c,d**), usually toward the external source of actuating magnetic fields.

### 3.1.2. Fundamental Equations in Magnetostatics

In the presence of homogeneous magnetizable media, it is often more convenient to introduce an additional field, the  $\mathbf{H}$  field, which shares with  $\mathbf{B}$  the name and the status of magnetic field (for differentiation,  $\mathbf{B}$  is usually termed the magnetic induction or flux density, while  $\mathbf{H}$  is called the magnetic field).<sup>152</sup>  $\mathbf{B}$  and  $\mathbf{H}$  fields are related by

$$\mathbf{B} = \mu_0(\mathbf{M} + \mathbf{H}), \quad (7)$$

where  $\mu_0$  is the magnetic permeability of free space (vacuum) and  $\mathbf{M}$  is the magnetization that measures the average magnetic moment density in the magnetic media (per unit volume). The magnetization vector at a material point  $\mathbf{x}$  can be defined such that

$$\mathbf{m} = \int_V \mathbf{M}(\mathbf{x}) dV \quad \text{or} \quad \mathbf{M} = \frac{d\mathbf{m}}{dV}, \quad (8)$$

where  $\mathbf{m}$  is the total magnetic moment and  $V$  is the volume of the magnetic media. When the material is uniformly magnetized, Eq.(8) becomes  $\mathbf{m} = V\mathbf{M}$ . It is worth noting that  $\mathbf{B}$  and  $\mathbf{H}$  fields are simply related by  $\mathbf{B} = \mu_0\mathbf{H}$  in the absence of magnetizable media, under which Eqs.(1) to (6) can also be written in terms of  $\mathbf{H}$  fields.

For magnetostatic systems with no time variation of the pertinent electromagnetic quantities, the Maxwell's equations in differential forms can be stated as

$$\text{div } \mathbf{B} = \nabla \cdot \mathbf{B} = 0, \quad (9)$$

$$\text{curl } \mathbf{B} = \nabla \times \mathbf{B} = \mu_0\mathbf{J}, \quad (10)$$

where  $\text{div } \mathbf{B}$  denotes the spatial divergence of  $\mathbf{B}$  fields,  $\text{curl } \mathbf{B}$  denotes the spatial curl of  $\mathbf{B}$  fields, and  $\mathbf{J}$  is the electric current density. The boundary conditions corresponding to Eqs.(9) and (10) are given by

$$\mathbf{n} \cdot \llbracket \mathbf{B} \rrbracket = 0, \quad (11)$$

$$\mathbf{n} \times \llbracket \mathbf{B} \rrbracket = \mathbf{K}, \quad (12)$$

where  $\mathbf{n}$  is the outward unit normal to the boundary,  $\llbracket \rrbracket$  denotes the jump of the field at the interface (i.e.,  $\llbracket \mathbf{B} \rrbracket = \mathbf{B}^{\text{out}} - \mathbf{B}^{\text{in}}$ ), and  $\mathbf{K}$  denotes the surface current density. Eq.(9) is also known as Gauss's law for magnetism and states that no magnetic monopoles exist and suggests that  $\mathbf{B}$  fields should be solenoidal (divergence-free).

Substituting Eq.(7) into Eq.(9) leads to the definition of magnetic charge density,  $\rho_m$ , in the material (per unit volume) which is given by

$$\nabla \cdot \mu_0\mathbf{H} = -\nabla \cdot \mu_0\mathbf{M} = \rho_m, \quad (13)$$

from the analogy to the description of the electric charge density in electrostatics, except for the absence of magnetic monopoles, which are analogous to unpaired electric charges. Although they have no physical existence, the concept of magnetic charges often provides a useful abstraction when understanding the behavior of a magnetized body (**Figure 8**).<sup>152</sup> Eq.(10) is usually referred to as Ampere's law and can also be expressed by using Eq.(7) as

$$\text{curl } \mathbf{H} = \nabla \times \mathbf{H} = \mathbf{J}_f, \quad (14)$$

where  $\mathbf{J}_f$  denotes the free electric current density, along with the definition of the magnetization current density  $\mathbf{J}_m$  given by

$$\text{curl } \mathbf{M} = \nabla \times \mathbf{M} = \mathbf{J}_m, \quad (15)$$

with the total current density given by the sum of two:  $\mathbf{J} = \mathbf{J}_f + \mathbf{J}_m$ . Eq.(14) requires  $\mathbf{H}$  fields to be irrotational (curl-free) when there is no free current (i.e.,  $\mathbf{J}_f = \mathbf{0}$ ), while Eq.(15) allows the magnetization to be treated as a current.

At the material surface, the magnetic surface charge density (per unit area), denoted by  $\rho_{ms}$ , can be defined from Eq.(13) as

$$\mathbf{n} \cdot \llbracket \mu_0 \mathbf{H} \rrbracket = -\mathbf{n} \cdot \llbracket \mu_0 \mathbf{M} \rrbracket = \rho_{ms}, \quad (16)$$

while the boundary conditions for Eqs. (14) and (15) are given by

$$\mathbf{n} \times \llbracket \mathbf{H} \rrbracket = \mathbf{K}_f, \quad (17)$$

$$\mathbf{n} \times \llbracket \mathbf{M} \rrbracket = \mathbf{K}_m, \quad (18)$$

where  $\mathbf{K}_f$  denotes the free surface current density and  $\mathbf{K}_m$  is the surface magnetization current density. Since the magnetization is zero outside the body (**Figure 8a**), which yields  $\llbracket \mathbf{M} \rrbracket = -\mathbf{M}$ , the boundary conditions for a magnetized body given in Eqs.(16) and (18) can be simplified as  $\rho_{ms} = \mu_0 \mathbf{M} \cdot \mathbf{n}$  and  $\mathbf{K}_m = \mathbf{M} \times \mathbf{n}$ , respectively.

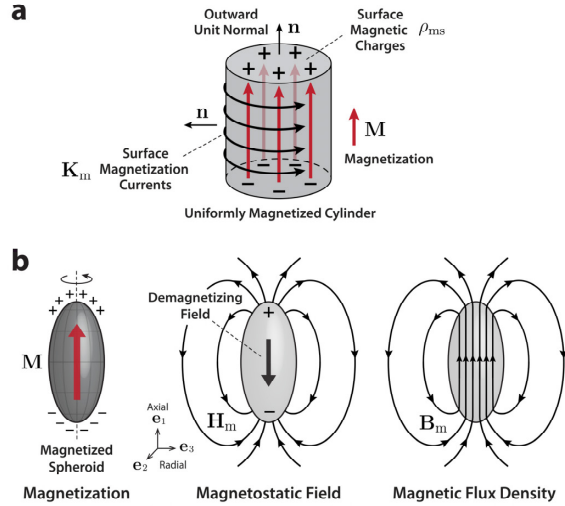
The  $\mathbf{H}$  fields being irrotational in the absence of free electric currents from Eq.(14) implies that the magnetic scalar potential, denoted by  $\Phi$ , can be defined such that

$$\mathbf{H} = -\text{grad } \Phi = -\nabla \Phi, \quad (19)$$

from the vector identity,  $\text{curl}(\text{grad } f) = \nabla \times (\nabla f) \equiv 0$ , which holds for any scalar field  $f(\mathbf{x})$ . Then, from Eqs.(13) and (19), it follows that the magnetic scalar potential  $\Phi$  obeys Poisson's equation:

$$\nabla^2 \Phi = -\frac{\rho_m}{\mu_0}, \quad (20)$$

which reduces to  $\nabla^2 \Phi = 0$  for uniformly magnetized materials with no divergence ( $\nabla \cdot \mathbf{M} = 0$ ).



**Figure 8. Graphical representation of a uniformly magnetized body. (a)** Uniformly magnetized cylinder with graphical representations of the surface magnetic charges ( $\rho_{ms}$ ) and the magnetization currents ( $\mathbf{K}_m$ ). **(b)** Magnetization ( $\mathbf{M}$ ), magnetostatic field ( $\mathbf{H}_m$ ), and magnetic flux density ( $\mathbf{B}_m$ ) of a uniformly magnetized spheroid, which represent the effect of a demagnetizing field inside the magnetized body.

### 3.1.3. Magnetostatic and Demagnetizing Fields

In the absence of magnetizable media (i.e.,  $\mathbf{M} = \mathbf{0}$ ), the externally applied magnetic field in empty space can be expressed as  $\mathbf{B}_a = \mu_0 \mathbf{H}_a$  from Eq.(7), with the subscript a used to denote the applied fields. When a magnetizable body is introduced into the space, it becomes magnetized by the



externally applied field  $\mathbf{H}_a$  to have the induced magnetization  $\mathbf{M}$  inside the body. Then, it follows from Eq.(16) that positive and negative magnetic surface charges are induced on its top and bottom surfaces, respectively (**Figure 8b**). The surface charges induce another magnetic field, often termed the *magnetostatic field* and denoted by  $\mathbf{H}_m$ , originating from the positive charge at the top and terminating on the negative charge at the bottom. Then, the total magnetic field  $\mathbf{H}$  can be expressed as

$$\mathbf{H} = \mathbf{H}_a + \mathbf{H}_m, \quad (21)$$

and from Eq.(7), the corresponding  $\mathbf{B}$  field (magnetic flux density) becomes

$$\mathbf{B} = \mathbf{B}_a + \mathbf{B}_m = \mu_0(\mathbf{M} + \mathbf{H}_a + \mathbf{H}_m), \quad (22)$$

with  $\mathbf{B}_m = \mu_0(\mathbf{M} + \mathbf{H}_m)$  inside the body and  $\mathbf{B}_m = \mu_0\mathbf{H}_m$  outside the body and with  $\mathbf{B}_a = \mu_0\mathbf{H}_a$  everywhere. It is worth noting that because  $\nabla \cdot \mathbf{B}_a = \nabla \cdot \mu_0\mathbf{H}_a = 0$  from Eq.(9), that Eqs.(13) and (16) can be expressed in terms of the magnetostatic field  $\mathbf{H}_m$  by simply replacing  $\mathbf{H}$  with  $\mathbf{H}_m$ .

In a uniformly magnetized body, the magnetostatic field  $\mathbf{H}_m$  acts to oppose the magnetization  $\mathbf{M}$  and hence reduces the overall magnetization (**Figure 8b**). For this reason, the magnetostatic field  $\mathbf{H}_m$  inside the body is often termed the *demagnetizing field* and is given by

$$\mathbf{H}_m = -\mathcal{N}\mathbf{M}, \quad (23)$$

where  $\mathcal{N}$  denotes the demagnetizing tensor. When the coordinate frame is chosen such that the Cartesian axes are aligned with the principal axes of the magnetized body, the demagnetizing tensor becomes diagonal in the following matrix form:

$$[\mathcal{N}] = \text{diag}(N_1, N_2, N_3) = \begin{bmatrix} N_1 & 0 & 0 \\ 0 & N_2 & 0 \\ 0 & 0 & N_3 \end{bmatrix}, \quad (24)$$

where  $N_i$  ( $i = 1, 2, 3$ ) represents the three eigenvalues that correspond to the demagnetizing factors associated with each of the principal axes. These demagnetizing factors obey the general constraint  $N_1 + N_2 + N_3 = 1$ , which suggests that  $N_1 = N_2 = N_3 = 1/3$  when the body is of spherical shape due to symmetry. For an ellipsoidal body with axial symmetry (i.e., the spheroid in **Figure 8b**), the demagnetizing factors are further constrained by  $N_2 = N_3 = (1 - N_1)/2$ , with  $N_1$  denoting the demagnetizing factor along the axis of symmetry and  $N_2 = N_3$  denoting the factors along the radial directions perpendicular to the symmetry axis.

In an idealized sense, a magnetic body can be considered an assembly of magnetic moments that are subject to magnetostatic interactions with each other. Then, the mechanical work spent in building the body by assembling the elementary magnetic moments can be represented by the magnetostatic energy, which is determined by the spatial distribution of the magnetization and by the geometric shape of the magnetic body. The magnetostatic energy density (per unit volume) is defined by

$$\mathcal{U}_m = -\frac{\mu_0}{2}\mathbf{H}_m \cdot \mathbf{M}, \quad (25)$$

which is calculated as  $\mathcal{U}_m = \mu_0(N_1M_1^2 + N_2M_2^2 + N_3M_3^2)/2$  when the coordinate frame is aligned with the principal axes of the body. For isotropic (spherical) particles, the magnetostatic energy density can be expressed as  $\mathcal{U}_m = \mu_0M^2/2$  with  $M$  denoting the magnitude of the magnetization.

## 3.2. Modeling of Magnetic Actuation

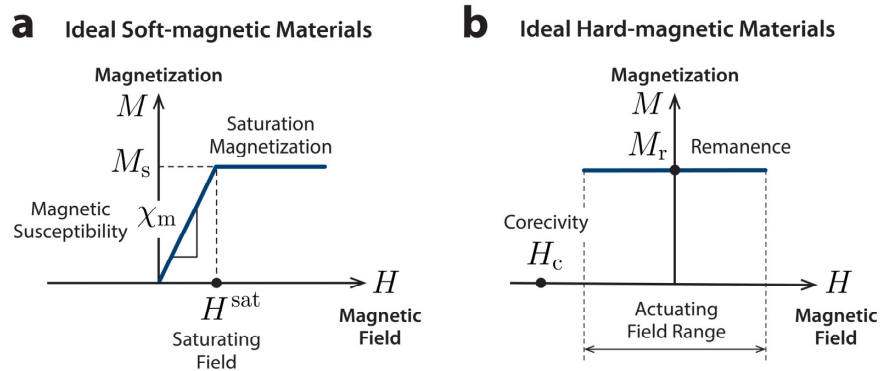
### 3.2.1. Idealized Magnetic Constitutive Laws

The constitutive law of a magnetic medium describes the material's response to the magnetic field acting on it and can be stated in the form of either  $\mathbf{M}(\mathbf{H})$  or  $\mathbf{B}(\mathbf{H})$ , with  $\mathbf{H}$  denoting the field experienced by the material. In general, the constitutive laws for ferromagnetic materials can be quite complex when the magnetization process exhibits anisotropic, nonlinear, and hysteretic behavior. Therefore, to simplify the analysis without loss of generality, it is often practically more advantageous to idealize the constitutive laws for typical magnetic materials.

In soft-magnetic materials, the induced magnetization is largely dependent on the applied field and hence the magnetization process should be taken into account when modeling their behavior. In the presence of magnetic anisotropy, the induced magnetization is dependent on the particle orientation and can occur in directions other than that of the applied magnetic field. Ideal soft-magnetic materials are assumed to have no hysteresis (i.e., zero remanence and zero coercivity) as superparamagnetic particles (**Figure 2c**). In addition, at low fields below the saturating field,  $\mathbf{H}^{\text{sat}}$ , the induced magnetization  $\mathbf{M}$  in ideal soft-magnetic materials is assumed to increase linearly with the magnetic field  $\mathbf{H}$  experienced by the material (**Figure 9a**), until it reaches the saturation magnetization (denoted  $M_s$  in **Figure 9a**). The constitutive law for such linearly magnetic materials can be stated as

$$\mathbf{M}(\mathbf{H}) = \begin{cases} \chi_m \mathbf{H} & \text{for } |\mathbf{H}| < |\mathbf{H}^{\text{sat}}|, \\ \mathbf{M}_s & \text{for } |\mathbf{H}| \geq |\mathbf{H}^{\text{sat}}|, \end{cases} \quad (26)$$

where  $\chi_m$  denotes the magnetic susceptibility of the soft-magnetic particle under the applied field and  $\mathbf{M}_s$  represents the saturation magnetization of the particle. It is worth noting that  $\chi_m$  is a dimensionless constant on the order of  $10^3$  to  $10^6$  for typical soft-magnetic materials. It is also worth noting that the graphical representation of the constitutive law for ideal soft-magnetic materials in **Figure 9a** shows the representative magnetization curve where both the induced magnetization  $\mathbf{M}$  and the applied magnetic field  $\mathbf{H}_a$  point along the same direction.



**Figure 9. Idealized magnetic constitutive laws for soft-magnetic and hard-magnetic materials.** (a) Ideal soft-magnetic materials are characterized by the linear relationship between the induced magnetization and the magnetic field with constant magnetic susceptibility before saturation and constant magnetization after saturation without magnetic hysteresis (zero remanence and coercivity). (b) Ideal hard-magnetic soft materials are characterized by large magnetic hysteresis (high remanence and coercivity) to maintain the remanence under an actuating field below the coercivity.

In contrast to soft-magnetic materials, ideal hard-magnetic materials are considered to have strong hysteresis (i.e., high remanence and high coercivity). When hard-magnetic particles are magnetized to saturation, they can be regarded as small permanent magnets whose magnetic moments (or remanent magnetization) are independent of the actuating field below coercivity,  $\mathbf{H}_c$  (**Figure 9b**). Thus, in the context of magnetic actuation, the constitutive law for ideal hard-magnetic materials can be expressed as

$$\mathbf{M}(\mathbf{H}) = \mathbf{M}_r \quad \text{for} \quad |\mathbf{H}| < |\mathbf{H}_c|, \quad (27)$$

where  $\mathbf{M}_r$  is the remanent magnetization of the hard-magnetic particle after magnetization. The constitutive law for ideal hard-magnetic soft materials in Eq.(27) implies that there is no energy transformation related to the magnetization process taking place during actuation.

### 3.2.2. Ideal Soft-Magnetic Materials

#### 3.2.2.1 Shape-Induced Magnetic Anisotropy

The induced magnetization in soft-magnetic materials is largely dependent on the particle orientation due to the magnetic anisotropy and hence is not necessarily collinear with the applied magnetic field. Among the different causes of magnetic anisotropy, our focus here is on the shape-induced anisotropy, which originates from the magnetostatic energy when the particles are not of spherical shape. Applying the relations given in Eqs.(21) and (23), the linear constitutive law for soft-magnetic particles in Eq.(26) (for  $|\mathbf{H}| < |\mathbf{H}^{\text{sat}}|$ ) can be written as

$$\mathbf{M}(\mathbf{H}) = \chi_m(\mathbf{H}_a + \mathbf{H}_m) = \chi_m(\mathbf{H}_a - \mathcal{N}\mathbf{M}), \quad (28)$$

which can be rearranged and expressed as a function of the externally applied field  $\mathbf{H}_a$  as

$$\mathbf{M}(\mathbf{H}_a) = \chi_m(\mathbf{I} + \chi_m\mathcal{N})^{-1}\mathbf{H}_a = \mathcal{X}\mathbf{H}_a, \quad (29)$$

where  $\mathbf{I}$  denotes the identity tensor and  $\mathcal{X}$  is defined for convenience as the apparent magnetic susceptibility tensor,<sup>73</sup> which relates the induced magnetization  $\mathbf{M}$  in an anisotropic particle with the applied magnetic field  $\mathbf{H}_a$ . Then the idealized constitutive law for soft-magnetic particles can be expressed in terms of the applied field  $\mathbf{H}_a$  as

$$\mathbf{M}(\mathbf{H}_a) = \begin{cases} \mathcal{X}\mathbf{H}_a & \text{for } |\mathbf{H}_a| < |\mathbf{H}_a^{\text{sat}}|, \\ \mathbf{M}_s & \text{for } |\mathbf{H}_a| \geq |\mathbf{H}_a^{\text{sat}}|, \end{cases} \quad (30)$$

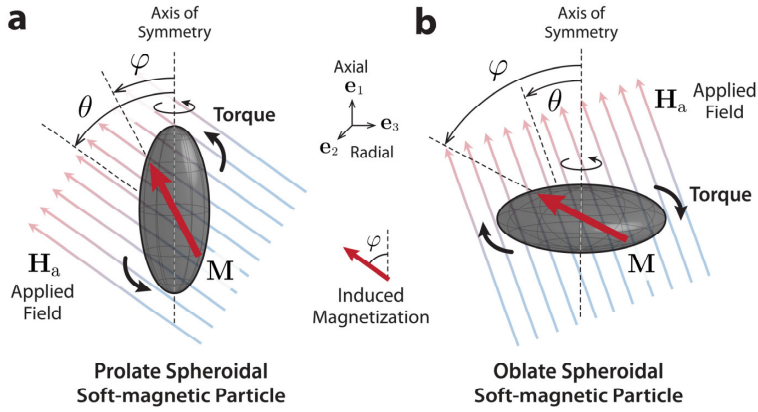
with  $\mathbf{H}_a^{\text{sat}}$  denoting the applied field at which saturation takes place.

For isotropic soft-magnetic particles of spherical shape, the apparent magnetic susceptibility tensor is given by  $\mathcal{X} = 3\chi_m(3 - \chi_m)^{-1}\mathbf{I}$ , which makes the two vectors  $\mathbf{M}$  (induced magnetization) and  $\mathbf{H}_a$  (applied magnetic field) collinear so as to produce no magnetic torques. For anisotropic (i.e., nonspherical) soft-magnetic particles, the susceptibility tensor  $\mathcal{X}$  is largely dependent on the particle shape as well as its orientation and hence can be complicated in general. To simplify the analysis while illustrating the soft-magnetic characteristics without loss of generality, we can assume that the particles are of ellipsoidal shape, for which the demagnetizing factors are known to have tractable analytical expressions.<sup>153</sup> To make the problem even simpler, we can further assume that the ellipsoidal particles have axial symmetry to be essentially spheroids (**Figure 8b**). There are two types

of spheroids: prolate spheroids have symmetry around their long (i.e., easy) axes (**Figure 10a**), whereas oblate spheroids are symmetric around their short (i.e., hard) axes (**Figure 10b**). When the coordinate frame is chosen to be aligned with the principal axes of the spheroidal particle, such that its symmetry axis lies with the Cartesian basis  $\mathbf{e}_1$  (**Figure 10**), the demagnetizing tensor  $\mathcal{N}$  becomes diagonal as given in Eq.(24). Then, the apparent susceptibility tensor  $\mathcal{X}$  also takes the diagonal matrix form, which is given by

$$[\mathcal{X}] = \text{diag} \left( \frac{\chi_m}{1 + \chi_m N_A}, \frac{\chi_m}{1 + \chi_m N_R}, \frac{\chi_m}{1 + \chi_m N_R} \right), \quad (31)$$

with  $N_1 = N_A$  denoting the magnetization factor along the symmetry axis of the spheroidal soft-magnetic particle and  $N_2 = N_3 = N_R$  along the radial directions perpendicular to the symmetry axis under the constraint  $N_A + 2N_R = 1$ .



**Figure 10. Anisotropic soft-magnetic particles of spheroidal shape.** (a) Prolate and (b) oblate spheroidal (ellipsoid with axis symmetry) soft-magnetic particles under externally applied magnetic fields (at an angle  $\theta$  relative to the symmetry axis) and the induced magnetization (at an angle  $\varphi$  relative to the symmetry axis) that is not parallel to the applied field due to the presence of shape anisotropy.

### 3.2.2.2 Induced Magnetization Direction

When an actuating magnetic field  $\mathbf{H}_a$  is applied to a spheroidal soft-magnetic particle at an angle  $\theta$  with respect to the particle's axis of symmetry (**Figure 10**), the magnetization  $\mathbf{M}$  is induced toward the long axis (i.e., easy axis), forming an angle  $\varphi$  relative to the symmetry axis. Then, from Eqs.(29) and (31), it can be shown that the magnetization direction  $\varphi$  is related to the field angle  $\theta$  by

$$\varphi = \tan^{-1} \left( \frac{1 + \chi_m N_A}{1 + \chi_m N_R} \tan \theta \right) \approx \tan^{-1} \left( \frac{N_A}{N_R} \tan \theta \right), \quad (32)$$

where the approximation made can be considered reasonable because the magnetic susceptibility  $\chi_m$  is typically very large ( $\chi_m > 10^3$ ) for soft-magnetic materials. We know from Eq.(32) that the magnetization direction  $\varphi$  for a given applied field at an angle  $\theta$  relative to the particle's axis of symmetry is determined by the ratio of the demagnetization factors along the axial and radial directions ( $N_A/N_R$ ) at low fields before saturation (i.e.,  $|\mathbf{H}_a| < |\mathbf{H}_a^{\text{sat}}|$ ).

At high fields beyond the saturating point (i.e.,  $|\mathbf{H}_a| \geq |\mathbf{H}_a^{\text{sat}}|$ ), the magnetization direction  $\varphi$  can be determined such that it minimizes the magnetic energy. The magnetostatic energy density due to the demagnetizing field can be expressed (per unit volume of the particle) as

$$\mathcal{U}_m = -\frac{\mu_0}{2} \mathbf{H}_m \cdot \mathbf{M}_s = \frac{\mu_0}{2} \mathcal{N} \mathbf{M}_s \cdot \mathbf{M}_s, \quad (33)$$

from the definition given in Eq.(25), with  $\mathbf{H}_m = -\mathcal{N}\mathbf{M}$  from Eq.(23) and the magnetization  $\mathbf{M}$  replaced by the saturation magnetization  $\mathbf{M}_s$ . For the given configuration in **Figure 10**, in which the principal axes of the spheroidal soft-magnetic particle are aligned with the coordinate frame to yield  $[\mathcal{N}] = \text{diag}(N_A, N_R, N_R)$ , the magnetostatic energy density can be calculated as

$$\mathcal{U}_m = \frac{\mu_0}{2} M_s^2 \left( N_A + (N_R - N_A) \sin^2 \varphi \right), \quad (34)$$

where  $M_s = |\mathbf{M}_s|$  denotes the magnitude of the saturation magnetization vector. The magnetized particle under the applied field  $\mathbf{B}_a = \mu_0 \mathbf{H}_a$  possesses the magnetic potential energy density as well, expressed per unit volume and denoted by  $U_m$ , which can be given from Eqs.(1) and (8) as

$$U_m = -\mu_0 \mathbf{M}_s \cdot \mathbf{H}_a = -\mu_0 M_s |\mathbf{H}_a| \cos(\theta - \varphi), \quad (35)$$

which holds for both the prolate and oblate spheroidal particle configurations in **Figure 10**. Then the total magnetic energy density is given by the sum of the magnetostatic energy density  $\mathcal{U}_m$  in Eq.(34) and the magnetic potential energy density  $U_m$  in Eq. (35). Taking the derivative of this sum with respect to the magnetization direction  $\varphi$ , we know that the total magnetic energy density is minimized at  $\varphi = \varphi^*$  which satisfies the following transcendental equation:

$$M_s(N_R - N_A) \sin(2\varphi^*) = 2|\mathbf{H}_a| \sin(\theta - \varphi^*). \quad (36)$$

When the applied field is strong enough, we know from Eq.(36) that the induced magnetization direction  $\varphi^*$  in the saturated particle approaches the applied field direction  $\theta$  (i.e.,  $\varphi^* \rightarrow \theta$ ), if the particle is fixed not to rotate despite the influence of magnetic torque.

### 3.2.2.3 Magnetic Torque on Anisotropic Particles

The magnetic force and torque density (per unit volume) acting on a soft-magnetic particle with the induced magnetization  $\mathbf{M}$  can be expressed in terms of the applied field  $\mathbf{H}_a$  as

$$\bar{\mathbf{f}}_m = \mu_0(\text{grad } \mathbf{H}_a) \mathbf{M} = \mu_0(\mathbf{M} \cdot \nabla) \mathbf{H}_a, \quad (37)$$

$$\bar{\boldsymbol{\tau}}_m = \mu_0(\mathbf{M} \times \mathbf{H}_a), \quad (38)$$

with the bar symbol used to denote the force and torque density per unit volume, by replacing  $\mathbf{m}$  with  $\mathbf{M}$  and  $\mathbf{B}$  with  $\mu_0 \mathbf{H}_a$  in Eqs.(4) to (6). Our focus here is on the modeling of the torque-driven actuation of soft-magnetic materials (**Figure 4c,d**). For the spheroidal soft-magnetic particle in **Figure 10**, the torque density can be calculated as  $\bar{\boldsymbol{\tau}}_m = \mu_0 |\mathbf{M}| |\mathbf{H}_a| \sin(\theta - \varphi)$ , where the induced magnetization  $\mathbf{M}$  is given as a function of the applied field  $\mathbf{H}_a$  in Eq.(30).

Before saturation (i.e.,  $|\mathbf{H}_a| < |\mathbf{H}_a^{\text{sat}}|$ ), the magnetic torque acting on the spheroidal particle per unit volume can be calculated using the apparent susceptibility tensor  $\boldsymbol{\chi}$  given in Eq.(31) as

$$\bar{\boldsymbol{\tau}}_m = \frac{\mu_0}{2} \left( \frac{\chi_m}{1 + \chi_m N_A} - \frac{\chi_m}{1 + \chi_m N_R} \right) |\mathbf{H}_a|^2 \sin(2\theta), \quad (39)$$

which can be simplified as

$$\bar{\boldsymbol{\tau}}_m \approx \frac{\mu_0}{2} \left( \frac{1}{N_A} - \frac{1}{N_R} \right) |\mathbf{H}_a|^2 \sin(2\theta), \quad (40)$$

for typical soft-magnetic materials with high magnetic susceptibility  $\chi_m$  (e.g.,  $\chi_m > 10^3$ ). From the equation above, we know that the magnetic torque on the particle is maximized at  $\theta = 45^\circ$ , when the actuating field (below the saturating field) is applied obliquely to the particle with an angle of  $45^\circ$  relative to the particle's axis of symmetry (**Figure 10**).

At high fields beyond the saturating field (i.e.,  $|\mathbf{H}_a| \geq |\mathbf{H}_a^{\text{sat}}|$ ), the magnetic torque density on the saturated spheroidal particle in **Figure 10** can be expressed as

$$\bar{\tau}_m = \mu_0 M_s |\mathbf{H}_a| \sin(\theta - \varphi^*), \quad (41)$$

with  $\varphi^*$  denoting the magnetization direction in the saturated particle. Using the relation given in Eq.(36), the torque in Eq.(41) can be expressed equivalently as

$$\bar{\tau}_m = \frac{\mu_0 M_s^2}{2} (N_R - N_A) \sin(2\varphi^*). \quad (42)$$

Since the saturation magnetization  $\mathbf{M}_s$  and the applied field  $\mathbf{H}_a$  become collinear at sufficiently high fields (i.e.,  $\varphi^* \rightarrow \theta$ ), we can consider that the magnetic torque is maximized at  $\theta \approx 45^\circ$  when the applied field strength is sufficiently high.

It is worth noting that, even when the particles are not of exact spheroidal shape, practical approximation can be made to simplify the analysis. For example, rod-like particles and disk-like particles (**Figure 4c**) can be approximated as prolate spheroids (**Figure 10a**) and oblate spheroids (**Figure 10b**), respectively. When the aspect ratio (i.e., the ratio of the long and short axes) is large enough, the demagnetizing factors for rod-like particles (very slender prolate spheroids) can be approximated as  $N_A = 0$  and  $N_R = 0.5$ , whereas those for disk-like particles (very flat oblate spheroids) can be approximated as  $N_A = 1$  and  $N_R = 0$ .<sup>18</sup> Then, for rod-like particles, the magnetic torque density before and after saturation can be approximated from Eqs.(39) and (42) as

$$\bar{\tau}_m = \begin{cases} \frac{\mu_0}{2} \left( \frac{\chi_m^2}{\chi_m + 2} \right) |\mathbf{H}_a|^2 \sin 2\theta & |\mathbf{H}_a| < |\mathbf{H}_a^{\text{sat}}|, \\ \frac{\mu_0 M_s^2}{4} \sin(2\varphi^*) & |\mathbf{H}_a| \geq |\mathbf{H}_a^{\text{sat}}|. \end{cases} \quad (43)$$

Likewise, for disk-like soft-magnetic particles, the magnetic torque density can be expressed as

$$\bar{\tau}_m = \begin{cases} -\frac{\mu_0}{2} \left( \frac{\chi_m^2}{\chi_m + 1} \right) |\mathbf{H}_a|^2 \sin 2\theta & |\mathbf{H}_a| < |\mathbf{H}_a^{\text{sat}}|, \\ -\frac{\mu_0 M_s^2}{2} \sin(2\varphi^*) & |\mathbf{H}_a| \geq |\mathbf{H}_a^{\text{sat}}|. \end{cases} \quad (44)$$

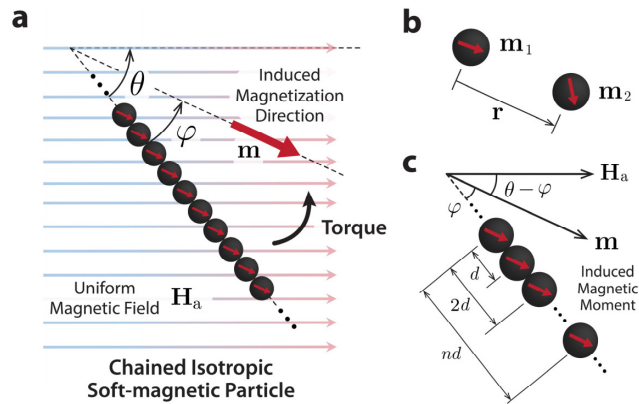
For both the rod-like and disk-like particles (**Figure 4c**), the magnetic torque is maximized when  $\theta = 45^\circ$ , with the long axes of the particle misaligned by  $45^\circ$  from the actuating field below the saturating field ( $|\mathbf{H}_a| < |\mathbf{H}_a^{\text{sat}}|$ ). Before saturation takes place, it is evident from Eq.(32) that the magnetization is induced preferentially along the long dimension of the particles with high aspect ratios, with  $\varphi = 0^\circ$  for rod-like particles and  $\varphi = 90^\circ$  for disk-like particles. When the particles are saturated, we know from Eqs.(41) and (42) that the magnetic torque can still be maximized when  $\theta \approx 45^\circ$ , provided that the applied field is sufficiently high.



It should be noted that the analysis above is the first-order approximation that holds for ideal soft-magnetic materials, which are assumed to have no hysteresis, even when the particles are of anisotropic shape, to suppress the highly nonlinear and complex nature of magnetic hysteresis. As discussed in **Section 2.2.3**, single-domain soft-magnetic particles of anisotropic shape with high aspect ratios (e.g., nanorods or nanowires) can exhibit hysteresis, which is more pronounced in particles with higher aspect ratios.<sup>78-81</sup> These single-domain soft-magnetic particles with high aspect ratios can be reasonably considered to have hard-magnetic characteristics, in the context of magnetic actuation, as permanently magnetized particles. When compared with typical hard-magnetic particles, however, they can be more easily demagnetized or remagnetized by lower fields, because their coercivity is not as high as that of typical hard-magnetic materials. For these reasons, the use of anisotropic soft-magnetic particles as distributed actuation sources has been limited mostly to small, thin features that require relatively weak magnetic torques for actuation. The fact that the coercivity of soft-magnetic nanorods varies with their aspect ratios has recently been employed as a strategy for selective magnetic programming in microfabricated shape-morphing structures with patterned nanomagnet arrays<sup>80</sup> (see **Figure 21a**).

### 3.2.2.4 Chained Isotropic Soft-Magnetic Particles

As discussed earlier, no magnetic torque is generated by a single isotropic (i.e., spherical) soft-magnetic particle because the induced magnetization  $\mathbf{M}$  (or the magnetic moment  $\mathbf{m}$ ) is always aligned with the applied field  $\mathbf{H}_a$ . Isotropic soft-magnetic particles can produce magnetic torques when they are connected and aligned to form chains to create magnetic anisotropy (**Figure 4c,d**).<sup>65-67,108,109</sup> To model the magnetic torque acting on the chained soft-magnetic particles, we consider a long chain of spherical particles (each of which has a diameter of  $d$ ) under a uniform magnetic field  $\mathbf{H}_a$  that is applied obliquely to the chain with an angle of  $\theta$  (**Figure 11a**). The dipole-dipole interaction between the neighboring particles causes the induced magnetization in each particle to form an angle  $\varphi$  relative to the chain (**Figure 11a**), which can be determined such that it minimizes the magnetic energy, as was the case with spheroidal soft-magnetic particles.



**Figure 11. Modeling of the magnetic torque produced by chained soft-magnetic particles.** (a) Isotropic (spherical) soft-magnetic particles connected to form a chain. The chain of identical isotropic particles as a whole can be considered a rod-like anisotropic particle that produces induced magnetization (at an angle  $\varphi$  relative to the chain) under an applied uniform field (at an angle  $\theta$  relative to the chain) to generate the magnetic torque. (b) Magnetostatic interaction between two magnetic dipoles under the influence of their dipolar fields on each other. (c) Modeling the magnetostatic dipolar interaction of a particle in the chain with its neighboring particles on both sides at distances of  $d$ ,  $2d$ , ...,  $nd$  under the assumption of a sufficiently long chain.

We first consider the magnetostatic energy associated with building up the chain by bringing the magnetized particles, each of which in an idealized sense can be treated as a magnetic dipole (point-like source), one after the other from infinity to their current position. A magnetic dipole with the magnetic moment  $\mathbf{m}$  generates the dipolar field given by

$$\mathbf{B}(\mathbf{r}) = \frac{\mu_0}{4\pi} \left( \frac{3\mathbf{r}(\mathbf{r} \cdot \mathbf{m})}{r^5} - \frac{\mathbf{m}}{r^3} \right), \quad (45)$$

at any position  $\mathbf{r}$  from the dipole. When two magnetic dipoles with magnetic moments  $\mathbf{m}_1$  and  $\mathbf{m}_2$  are separated by distance  $r$  (with the corresponding position vector  $\mathbf{r}$ ) as depicted in **Figure 11b**, their dipolar interaction energy (denoted  $e_{12}$ ) is given by

$$e_{12} = \frac{\mu_0}{4\pi} \left( \frac{\mathbf{m}_1 \cdot \mathbf{m}_2}{r^3} - \frac{3(\mathbf{r} \cdot \mathbf{m}_1)(\mathbf{r} \cdot \mathbf{m}_2)}{r^5} \right), \quad (46)$$

from the magnetic potential energy (defined in Eq.(1)) of either dipole under the field produced by its counterpart. Within a long chain consisting of a great number of particles (**Figure 11a**), the dipolar interaction energy of each particle can be calculated by considering its interaction with the neighboring particles in both sides at distances of  $d, 2d, \dots, nd$  (**Figure 11c**) as

$$e = \sum_{k=1}^n \frac{\mu_0}{2\pi} \left( \frac{m^2}{k^3 d^3} \right) (1 - 3 \cos^2 \varphi), \quad (47)$$

where  $m$  denotes the magnitude of the particle's magnetic moment ( $m = |\mathbf{m}|$ ). For sufficiently long chains ( $n \gg 15$ ), Eq.(47) can be simplified as

$$e \approx \frac{0.6\mu_0 m^2}{\pi d^3} (1 - 3 \cos^2 \varphi), \quad (48)$$

using the fact that  $\sum_{k=1}^n k^{-3} \approx 1.2$  for  $n > 15$  (note:  $\sum_{n=1}^{\infty} n^{-3} \approx 1.2021$ ).<sup>66</sup> If the chain consists of  $N$  particles, the total dipolar interaction energy can be expressed as

$$e_{\text{total}} = \frac{0.6\mu_0 N m^2}{\pi d^3} (1 - 3 \cos^2 \varphi). \quad (49)$$

Next, we consider the magnetic potential energy of the chained particles due to the externally applied field  $\mathbf{H}_a$  which can be expressed from Eq.(1) as

$$u_m = -\mu_0 N m |\mathbf{H}_a| \cos(\theta - \varphi). \quad (50)$$

Then, the magnetization direction  $\varphi$  can be determined by finding  $\varphi = \varphi^*$  that minimizes the total magnetic energy. For the derivative of the sum of Eqs.(49) and (50) to be zero at  $\varphi = \varphi^*$ , the following transcendental equation should be satisfied:

$$0.3M \sin(2\varphi^*) = |\mathbf{H}_a| \sin(\theta - \varphi^*), \quad (51)$$

where the single particle's magnetic moment  $m$  was replaced by the magnetization  $M$  (magnetic moment density) using the relation  $m = M\pi d^3/6$ . When the particles are magnetically saturated (i.e.,  $M = M_s$ ), the magnetization direction can be identified based on the material's property  $M_s$  and the actuating field strength  $|\mathbf{H}_a|$  and direction  $\theta$  from Eq.(51). Then the magnetic torque density acting on the chained particles per unit volume can be expressed as



$$\bar{\tau}_m = \mu_0 M_s |\mathbf{H}_a| \sin(\theta - \varphi^*) = 0.3 \mu_0 M_s^2 \sin(2\varphi^*). \quad (52)$$

It is worth noting that the individual isotropic particles in the chain can be considered each as an assembly of elementary magnetic moments as discussed in **Section 3.1.3**. As given in Eq.(25), the magnetostatic energy density for individual isotropic particles in the chain is  $\mathcal{U}_m = \mu_0 M^2/2$ , which, unlike that of an anisotropic particle given in Eq.(34), does not vary with the applied field direction  $\theta$  and remain constant even when the magnetization direction  $\varphi$  changes. Therefore, the magnetostatic energy of individual particles does not contribute to the magnetic torque produced from the chained particles. This is why the magnetostatic energy of individual particles was not considered when deriving Eq.(51) for finding the magnetization direction  $\varphi^*$  that minimizes the total magnetic energy of the chained particles.

From the analysis above, we know that the behavior of chained soft-magnetic particles is close to that of anisotropic particles discussed earlier in terms of the magnetic torque produced under a uniform actuating field. This implies that the chained isotropic soft-magnetic particles can be approximated as a rod-like particle with a high aspect ratio, as can be compared from Eq.(43) and Eq.(52). It is also worth noting that the analysis and equations presented above can be applied to modeling of the magnetic torque produced by chained superparamagnetic nanoparticles.<sup>66,67</sup>

### 3.2.3. Ideal Hard-magnetic Materials

Ideal hard-magnetic materials are characterized by their remanent magnetization  $\mathbf{M}_r$ , which remains constant and independent of the applied field within the actuating field range below the coercivity (**Figure 9b**), as described in the constitutive law in Eq.(27). This implies that there is no energy transformation related to the magnetization process taking place during actuation. In other words, within the actuating field range below the coercivity, the magnetostatic energy plays no role in generating magnetic forces and torques. Therefore, the magnetic force and torque acting on a hard-magnetic particle (**Figure 5a,c**) per unit volume can be expressed simply as

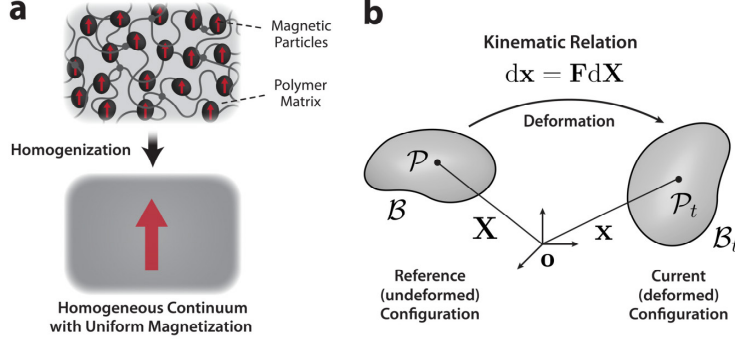
$$\bar{\mathbf{f}}_m = \mu_0 (\text{grad } \mathbf{H}_a) \mathbf{M}_r = \mu_0 (\mathbf{M}_r \cdot \nabla) \mathbf{H}_a \quad (53)$$

$$\bar{\boldsymbol{\tau}}_m = \mu_0 (\mathbf{M}_r \times \mathbf{H}_a), \quad (54)$$

by replacing  $\mathbf{m}$  with  $\mathbf{M} = \mathbf{M}_r$  and  $\mathbf{B}$  with  $\mathbf{B}_a = \mu_0 \mathbf{H}_a$  in Eqs.(4) and (5), respectively. It is worth emphasizing that the remanent magnetization  $\mathbf{M}_r$  independent of the applied field  $\mathbf{H}_a$  greatly simplifies the calculation of the magnetic force and torque for hard-magnetic soft materials.

### 3.3. Continuum Mechanical Framework

For magnetic soft materials and robots with one or a few rigid, finite-sized magnets attached to or incorporated in a deformable body (**Figure 1a**), the magnetic force and torque generated by the magnet can be considered a point load acting on the center of the magnet. For such discrete systems with simple geometry, theoretical models can be derived by considering the global force and moment balance of the structure to find its deformed configuration in static equilibrium.<sup>154</sup> For continuous systems with dispersed magnetic particles in the polymer matrices (**Figure 1b** and **Figure 5b,d**), the composite can be treated as a homogenized continuum that exhibits both elastic and magnetic characteristics simultaneously (**Figure 12a**). Modeling of such continuous systems can be formulated in a continuum mechanical framework by considering the local force and moment balance that holds at every point of the composite.



**Figure 12. Continuum mechanical framework for magnetic soft materials.** (a) Treatment of magnetic soft composites based on polymer matrices with filler particles as a homogeneous continuum with uniform magnetization for continuum mechanical approaches. (b) Kinematic relation for deformable solids in the continuum mechanical framework.

When a continuum (denoted by  $\mathcal{B}$ ) deforms (**Figure 12b**), a material point  $\mathbf{X}$  (denoted by  $\mathcal{P}$ ) on the body in its reference (undeformed) configuration is mapped to a spatial point  $\mathbf{x}$  (denoted by  $\mathcal{P}_t$ ) on the deformed body (denoted by  $\mathcal{B}_t$ ) in the current configuration. The deformation of the body can be measured by the deformation gradient tensor  $\mathbf{F}$  which is defined by

$$\mathbf{F} = \frac{d\mathbf{x}}{d\mathbf{X}}. \quad (55)$$

The deformation gradient is a linear transformation that maps the infinitesimal line elements  $d\mathbf{X}$  and  $d\mathbf{x}$  between the reference and current configurations and hence serves as a primary measure of deformation. The determinant of the deformation gradient characterizes the change in volume during the deformation as

$$J = \det \mathbf{F} = \frac{dv}{dV}, \quad (56)$$

which is termed the volumetric Jacobian that relates the infinitesimal volume elements  $dV$  and  $dv$  in the reference and current configurations, respectively.

For quasi-static equilibrium, the principle of linear momentum balance reduces to the force balance equation that holds for each point  $\mathbf{x}$ :

$$\operatorname{div} \boldsymbol{\sigma} + \bar{\mathbf{f}} = \mathbf{0}, \quad (57)$$

which is also known as Cauchy's equilibrium equation, where  $\boldsymbol{\sigma}$  is the Cauchy stress, with  $\operatorname{div} \boldsymbol{\sigma}$  denoting its spatial divergence with respect to the point  $\mathbf{x}$ , and  $\bar{\mathbf{f}}$  is the body force density (per unit volume of the continuum) exerted by the environment on  $\mathbf{x}$  (including the gravitational body force). For a polar continuum with distributed body torque density  $\bar{\boldsymbol{\tau}}$  (per unit volume of the continuum), the balance of angular momentum reduces to the following moment balance:

$$\boldsymbol{\mathcal{E}} : \boldsymbol{\sigma}^T + \bar{\boldsymbol{\tau}} = \mathbf{0}, \quad (58)$$

where  $\boldsymbol{\mathcal{E}} = \varepsilon_{ijk} \mathbf{e}_i \otimes \mathbf{e}_j \otimes \mathbf{e}_k$  is the third-order permutation tensor with  $\varepsilon_{ijk}$  being the permutation (also known as Levi-Civita) symbol and the operator  $\otimes$  denoting the tensor (dyadic) product.  $\boldsymbol{\sigma}^T$  is the transpose of the Cauchy stress tensor, and the operator  $:$  denotes the double contraction of the two tensors. When there is no body torque, Eq.(58) requires the Cauchy stress to be symmetric:  $\boldsymbol{\sigma} = \boldsymbol{\sigma}^T$ . In the presence of body torques, however, the Cauchy stress may no longer be symmetric.

The mechanical behavior of the composite matrix can be described by relevant constitutive models for hyperelastic solids, such as neo-Hookean, Mooney-Rivlin, Gent, and Arruda-Boyce models, to name a few. The material model defines the Helmholtz free energy per unit reference volume (also called the strain energy density), denoted by  $\Psi(\mathbf{F})$ , as a function of the deformation gradient  $\mathbf{F}$ . For hyperelastic solids with no internal energy dissipation in isothermal conditions, the mechanical stress in the referential form can be directly obtained from the derivative of the Helmholtz free energy density as

$$\mathbf{P} = \frac{\partial \Psi}{\partial \mathbf{F}}, \quad (59)$$

which is termed the first Piola-Kirchhoff stress, or simply the Piola stress, which measures the force acting on the deformed material per unit reference (undeformed) area. The Piola stress is related to the Cauchy stress  $\boldsymbol{\sigma}$  (force per unit current area) by  $\mathbf{P} = J\boldsymbol{\sigma}\mathbf{F}^{-\top}$ , which leads to

$$\boldsymbol{\sigma} = \frac{1}{J} \frac{\partial \Psi}{\partial \mathbf{F}} \mathbf{F}^{\top}. \quad (60)$$

Substituting this into the equilibrium equation in Eq.(57) and solving it for the deformation gradient  $\mathbf{F}$ , typically through the finite element method with relevant boundary conditions taken into account, the deformed configuration of the material in equilibrium can be found.

It should be noted that the magnetic force and torque densities calculated in **Sections 3.2.2** and **3.2.3** measure the force and torque on a single particle per unit volume of the particle. When they are multiplied by the particle's volume fraction, denoted by  $\phi$ , the magnetic body force and torque densities per unit volume of the composite can be obtained, under the assumption of homogeneous continua (**Figure 12a**) discussed above. Then, the magnetic body force and torque densities (per unit volume of the homogenized composite) can be substituted into Eqs. (57) and (58).

## 4. Design, Fabrication, and Characterization

Material design and fabrication schemes have been central to the development of magnetic soft materials and robots with complex shapes and sophisticated functions. Remarkable progress in the field has been made lately by actively adopting emerging fabrication techniques in additive manufacturing (**Table 1**). The technical developments have been focused on the incorporation of magnetic components into polymer matrices or flexible substrates and their alignment to achieve desired magnetization patterns or profiles within the composite structures across different scales. In the following sections, we discuss how the field of magnetic soft materials and robots has been evolving with advances in design and fabrication techniques.

### 4.1. Optimal Design Strategies

As discussed in the previous section on the modeling of magnetic actuation, magnetic soft materials can be considered essentially bending actuators driven by the magnetic torque. From a materials design perspective, it is worth discussing the strategies to optimize the performance of magnetic soft actuators. Our focus here is on the hard-magnetic soft materials, which provide simple and effective bending actuation. To achieve optimal actuation performance, a good balance between the mechanical resistance of the composite structure and the driving magnetic torque is required. For composites based on soft polymers with embedded hard-magnetic particles, both the mechanical and magnetic properties of the composite vary with particle volume fraction  $\phi$ .

For a uniformly magnetized homogeneous continuum (**Figure 12a**), we can assume that the magnetization of the composite  $M$  is proportional to the particle volume fraction  $\phi$  (**Figure 13a**):

$$M = \phi M_p, \quad (61)$$

where  $M_p$  represents the magnetization of an individual particle. The shear modulus of the filled composite, denoted by  $G$ , increases nonlinearly with the particle concentration (**Figure 13a**). This nonlinear dependence can be expressed as

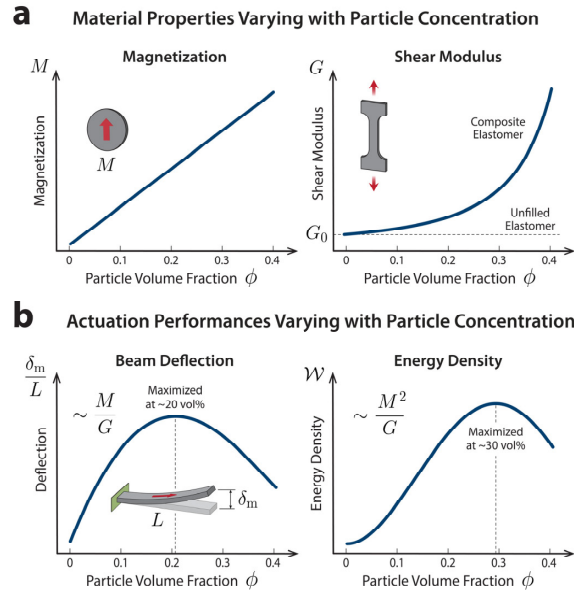
$$G = G_0 \exp\left(\frac{2.5\phi}{1 - 1.35\phi}\right), \quad (62)$$

which is known as the Mooney model for spherical particles with  $G_0$  denoting the shear modulus of an unfilled elastomer.<sup>155</sup>

For a beam made of hard-magnetic soft composite under small bending, the deflection of the beam,  $\delta_m$ , due to the applied magnetic field  $B$  can be modeled with the following scaling relation:<sup>156</sup>

$$\frac{\delta_m}{L} \sim \left(\frac{MB}{G}\right) \left(\frac{L}{D}\right)^2, \quad (63)$$

where  $L$  and  $D$  are the length and diameter (or thickness) of the beam, respectively, and  $M$  is the magnetization of the beam along its length direction. In Eq.(63), the dimensionless number  $MB/G$ , which represents the applied field  $B$  normalized by the material properties  $M$  and  $G$ , characterizes the competition or balance between the magnetic interaction and the elasticity of the composite.  $L/D$  is the aspect ratio of the bending actuator that contributes to the structural bending stiffness. Substituting Eqs. (61) and (62) into Eq.(63), it can be analytically shown that the deflection is maximized when the particle volume fraction is around 20% ( $\phi = 0.207$ ; **Figure 13b**). Although the scaling in Eq.(63) holds only for small deflection, it has been shown that the overall tendency and the optimal concentration to maximize the deflection hold true for large deformation as well.<sup>31</sup>



**Figure 13. Design optimization of magnetic composites based on soft polymers with embedded hard-magnetic particles. (a)** Material properties (magnetization and shear modulus) of magnetic soft composites varying with the particle volume

fraction. **(b)** Actuation performance of magnetic soft bending actuators in terms of the free-end deflection (normalized by the beam length  $L$ ) and energy density varying with the particle volume fraction.

When the actuation force is of greater importance than the large deflection under the given applied field  $B$ , the material design can be optimized in terms of the energy density to maximize the mechanical work that can be produced per unit volume during actuation. For hard-magnetic soft bending actuators with small deflection, the energy density (denoted by  $\mathcal{W}$ ) scales with<sup>31</sup>

$$\mathcal{W} \sim \left( \frac{M^2 B^2}{G} \right) \left( \frac{L}{D} \right)^2. \quad (64)$$

Then, the optimal particle volume fraction that maximizes the energy density under the given conditions is calculated to be around 30% ( $\phi = 0.293$ ; **Figure 13b**).

From Eq.(63), we know that the geometric factor  $L/D$  (aspect ratio) also plays an important role in determining how much the beam would bend under the applied field  $B$ . This implies that fine features with high aspect ratios, such as magnetic cilia,<sup>109,157-161</sup> would require significantly lower field strength to induce the bending actuation. It is worth noting, however, that such slender structures can be more susceptible to sagging due to gravity and their self-weight because of the small structural rigidity. The competition between the gravitational body force and the magnetic interaction can be characterized from the following scaling relation:

$$\frac{\delta_g}{\delta_m} \sim \frac{\rho g L}{MB}, \quad (65)$$

where  $\delta_g$  denotes the deflection of the beam due to gravity, with  $\rho$ ,  $g$ , and  $L$  denoting the mass density of the composite material, the gravitational acceleration, and the free length of the bending actuator, respectively. This can be derived from standard beam equations along with Eq.(63).

## 4.2. Fabrication and Magnetic Programming

### 4.2.1. Molding and Casting

Molding and casting have been the most common fabrication method for conventional magnetic soft materials with relatively simple geometry, usually in the form of blocks or sheets (**Figure 14a**). When soft-magnetic or superparamagnetic soft materials are molded, chained microstructures can be introduced by applying a uniform magnetic field along the desired direction in which the chains are to be formed. Molding has also been used to fabricate magnetically responsive mechanical metamaterials based on 3D-printed lattice structures into which magnetorheological fluids or elastomers with soft-magnetic particles are injected to impart magnetic responsiveness.<sup>162,163</sup>

When hard-magnetic soft materials are molded or cast into planar structures or flat beams, they are usually magnetized after curing on purpose for shape-programming. The fabricated (cured) composite with magnetizable hard-magnetic particles is first deformed into a desired temporary shape using a fixture or template and then magnetized to saturation by a strong magnetic field in the deformed state (**Figure 14a** and **Table 1**). This leads to nonuniform magnetization profile in the composite structure, which tends to revert to the programmed shape when an actuating field is applied (see examples in **Figure 19, b to d**).<sup>164-169</sup> This template-aided magnetization and shape-programming strategy is often useful for planar structures with relatively simple geometry. However, it should be noted that the programmed shape may not always be achievable (especially when the

desired shape requires large deflection from the original shape). There often can exist some gap between the desired shape and the actual shape upon magnetic actuation, partly because the actuating field has an upper limit below the coercivity.

Unlike other fabrication techniques based on additive manufacturing, which often require certain material properties (i.e., optical transparency of resins for light-based 3D printing or thixotropy of ink materials for extrusion-based 3D printing; see **Section 4.2.2**) for compatibility with their fabrication process, molding and casting are generally applicable to a wide range of elastomers and hydrogels with minimal material modifications. Contrary to the 3D printing techniques, which are often sensitive to the rheological properties of the ink materials, molding and casting can be used without the need to carefully tune the rheological properties. Therefore, molding and casting are most commonly used when developing new magnetic soft composites with unconventional functionalities by including additional components due to their wide applicability and procedural simplicity. For magnetorheological elastomers, as an example, adding a liquid phase such as glycerol-based ferrofluids into the elastomer matrix has been shown to enable exceptional stiffening due to the enhanced mobility of the embedded soft-magnetic particles.<sup>170,171</sup> For validation of such new materials and approaches, the uncured composites are usually molded into sheets to prepare testing samples with simple geometry. Similar examples of adding phase-changing materials in hard-magnetic soft materials to facilitate magnetic reprogramming (see **Section 4.3**) also utilized the simple molding and casting technique for sample preparation and fabrication.

#### 4.2.2. Additive Manufacturing

Recent advances in additive manufacturing for soft materials have accelerated progress in the design and fabrication of magnetic soft materials and robots with more complex shapes and more sophisticated actuation and functions. Widely used additive manufacturing techniques such as extrusion-based 3D printing (e.g., direct ink writing<sup>156,172-174</sup> and fused deposition modeling<sup>175,176</sup>) and light-based 3D printing<sup>177-180</sup> have been adopted for fabricating different types of magnetic soft materials and robots (**Figure 14b,c**, and **Table 1**).

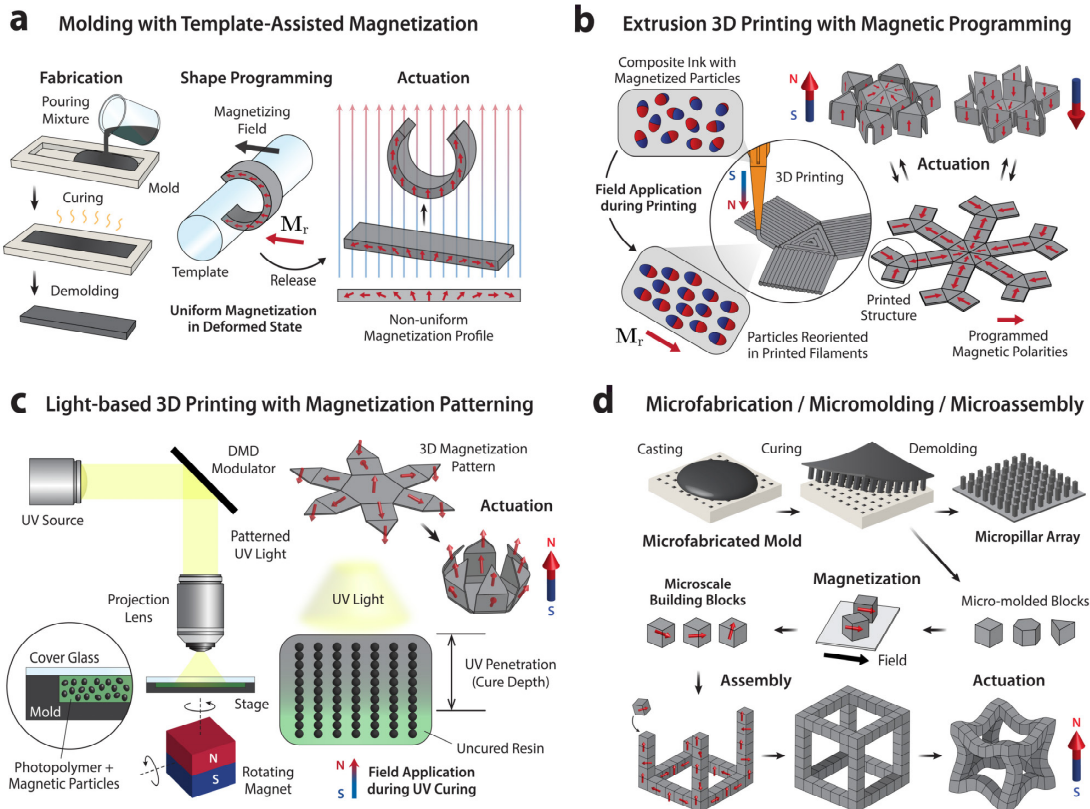
##### 4.2.2.1 Extrusion-Based 3D Printing

Among different extrusion-based 3D printing techniques, our focus here is on direct ink writing which enables 3D printing of viscoelastic inks composed of uncured polymer resins and magnetic particles. By extrusion of the composite inks through deposition nozzles under applied pressure and arrangement of the deposited filaments in each layer, 2D or 3D structures can be fabricated in a layer-upon-layer fashion. For 3D-printed hard-magnetic soft materials, it has been shown that the magnetization pattern can be controlled at the filament level by applying weak magnetic fields during printing to align the magnetized particles in the printed composite fibers (**Figure 14b**).<sup>156</sup> This technique has demonstrated its ability to fabricate magnetic soft materials with complex shape-changing capabilities due to the intricate patterns of magnetic polarities in the printed structures, including mechanical metamaterials with negative Poisson's ratios (see **Section 6.1.2**), and has recently been adopted for hard-magnetic shape memory polymers<sup>110</sup> as well.

For magnetic soft composites based on anisotropic filler particles, alignment of the particles is required to induce collective macroscale response of the printed structure, because the magnetic torque is dependent on the particle orientation relative to the actuating field direction (see **Section 3.2.2**). For composite inks containing rod-shaped magnetic particles, the particles undergo shear-

induced alignment as the ink flows through the printing nozzle,<sup>181-184</sup> and hence the alignment can be obtained naturally while printing. For disk-shaped particles (e.g., alumina platelets coated with iron oxide nanoparticles<sup>185,186</sup>), it has been shown that the particles can be aligned while printing under a weak rotating magnetic field.<sup>172</sup> It is worth noting that the aligned anisotropic particles lead to mechanical anisotropy with increased stiffness along the aligned particles.<sup>81,182,185</sup>

To use the direct ink writing method, the composite ink should possess thixotropic properties, meaning that the material should maintain a stable form at rest but become a fluid that can flow when agitated by externally applied stresses. In most cases, the un-cross-linked or uncured polymer base resin mixed with magnetic particles can be considered a Newtonian fluid,<sup>172</sup> a viscous but freely flowing fluid with a constant viscosity, unless it is heavily loaded with the particles (e.g.,  $\phi > 0.3$ ). Therefore, rheological modifiers such as fumed silica nanoparticles (for silicone elastomers) or nanoclays such as Laponite (for hydrogels) are often added to impart desired ink properties such as shear thinning and shear yielding to ensure that the composite ink can be extruded easily through the nozzle when pressurized and that the deposited inks maintain their shapes even when stacked up to multiple layers.<sup>187,188</sup> For hard-magnetic composite inks, it has also been shown that the ink materials can exhibit thixotropic properties when the embedded hard-magnetic particles are magnetized,<sup>31,189</sup> even without the addition of rheological modifiers, and hence become printable for the extrusion-based processes. For soft-magnetic composite inks, it has been shown that the capillary forces between the liquid phase (uncured polymer resin) and the solid phase (polymer beads encasing magnetic particles) due to wetting (solid beads connected to each other by binding liquid) can provide thixotropic properties<sup>190,191</sup> to obtain printability for direct ink writing without rheological modification.<sup>173,192</sup>



**Figure 14. Fabrication and magnetic shape-programming methods for magnetic soft materials.** (a) Molding and casting for fabrication and templated-assisted magnetization for shape programming to obtain a nonuniform magnetization profile.<sup>166</sup> (b) Extrusion-based 3D printing of magnetic composites containing magnetized particles that can be reoriented by the applied magnetic field during the printing process to program desired magnetization patterns in the printed structure.<sup>156</sup> (c) Light-based 3D printing or UV photolithography of magnetic composites based on photocurable resins mixed with magnetic particles, which can be aligned to form chains along the applied field direction during the UV curing process to create desired magnetization patterns in the printed structure.<sup>178</sup> (d) Fabrication of micropillar arrays<sup>193</sup> or microscale building blocks<sup>194</sup> through molding of magnetic soft composites using microfabricated molds. Microscale building blocks based on hard-magnetic composites can be magnetized and assembled into 3D structures capable of programmed shape changes under applied magnetic fields due to the designed magnetization patterns.<sup>194</sup>

#### 4.2.2.2 Light-Based 3D Printing

In addition to extrusion-based methods, light-based 3D printing techniques have also been used to fabricate magnetic soft materials and robots. Light-based 3D printing uses photopolymerizable or photocurable polymer resins that can solidify upon the application of patterned ultraviolet (UV) light or focused laser light, and this light-based 3D printing includes stereolithography (SLA) and continuous liquid interface production (CLIP)<sup>195</sup> techniques. SLA 3D printing based on digital light processing (DLP) has been adopted for fabrication of hard-magnetic and soft-magnetic soft materials by coupling a permanent magnet<sup>178</sup> or electromagnetic coils<sup>177</sup> beneath or around the printing platform to control the alignment of the embedded magnetized or magnetizable particles while selectively curing the photopolymer resin using patterned UV light (**Figure 14c**). This DLP-based 3D printing is similar to UV photolithography (see **Section 4.2.3**) in terms of the fabrication process when printing 2D (single-layer) structures. Both SLA/DLP 3D printing and CLIP 3D printing have been adopted to fabricate flexible magnetic actuators and grippers using 3D-printed isotropic superparamagnetic soft composites based on photopolymerizable materials containing uniformly dispersed iron oxide nanoparticles.<sup>179,180,196</sup>

When compared with the direct ink writing method discussed above, where the programmed magnetization patterns lie on the printing plane onto which the inks are deposited (**Figure 14b**), the light-based 3D printing methods provide greater degrees of freedom in terms of the achievable magnetization direction in printed structures (i.e., 3D magnetization patterns in printed 2D or 3D structures), allowing for programming complex shape changes in hard-magnetic soft materials (**Figure 14c**). However, the maximum thickness of UV-curable layer (i.e., cure depth) is limited because the photocurable resin containing light-absorbing magnetic particles is no longer optically transparent, with the UV penetration depth decreasing rapidly with the particle concentration. For example, the cure depth is below 200  $\mu\text{m}$  when the concentration of  $\text{Nd}_2\text{Fe}_{14}\text{B}$  microparticles is 50% by mass (around 13% by volume) or below 100  $\mu\text{m}$  when the concentration is 60% by mass (around 18% by volume),<sup>178</sup> which may potentially affect the scalability of the light-based 3D printing techniques for magnetic soft materials due to the limited processable layer thickness.

#### 4.2.3. Microfabrication and Microassembly

The above-mentioned additive manufacturing techniques are mostly limited to millimeter or centimeter scales in terms of the typical feature size. For fabricating small-scale magnetic soft materials in size of tens or hundreds of micrometers, different types of microfabrication techniques have been adopted. To realize magnetically controlled microgrippers<sup>197</sup> or micropillar or microplate arrays<sup>157,193,198,199</sup> using magnetic soft materials, microscale molding and casting has been used. For



this, microfabrication techniques such as photolithography or femtosecond laser writing have been used to prepare micromolds, into which uncured composite mixture is poured, followed by curing and demolding processes (**Figure 14d**).

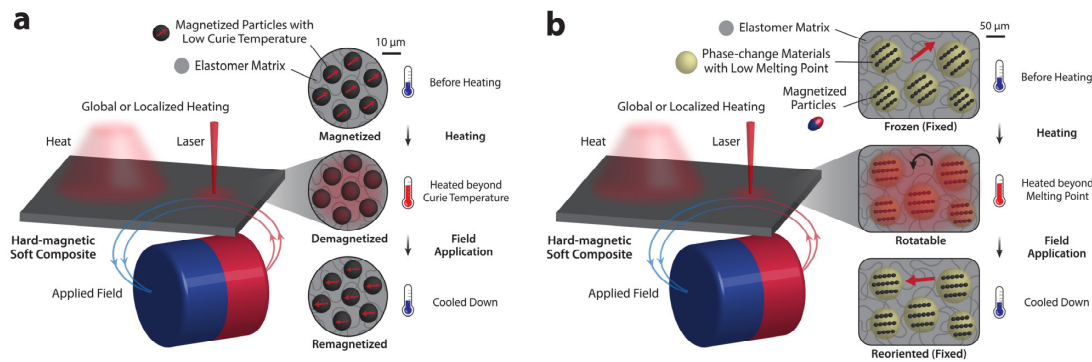
UV photolithography has been used to fabricate small-scale magnetic soft materials and robots based on poly(ethylene glycol) diacrylate (PEGDA) hydrogels and superparamagnetic (iron oxide) nanoparticles. The superparamagnetic nanoparticles are chained and aligned by externally applied magnetic fields while the photocurable pregel solution is selectively cross-linked through patterned (either masked or digitally modulated) UV light to inscribe desired magnetic or mechanical anisotropy patterns in the fabricated structures for actuation purposes.<sup>67,200,201</sup> As mentioned earlier, it is worth noting that maskless photolithography based on digitally modulated patterned UV light<sup>67</sup> is similar to the DLP-based 3D printing (**Figure 14c**) in terms of their working principles for magnetic programming. Standard photolithography has shown that fabricated microcubes can build magnetically reconfigurable microstructures that are capable of self-assembly under externally applied fields, when the microcube building blocks are coated with thin layers of cobalt to impart magnetic responsiveness.<sup>202,203</sup> Electron-beam lithography has also been used to fabricate magnetically controlled microstructures with complex shape-changing capabilities by depositing micropatterned arrays of nanoscale magnets (e.g., single-domain cobalt with anisotropic shape) onto flexible structures with microfabricated hinges.<sup>80</sup>

The two-photon polymerization technique, also known as direct laser writing,<sup>204</sup> has been widely used to fabricate helical microstructures that can be driven magnetically for drug or cell delivery purposes.<sup>205-210</sup> However, despite the unique advantage of two-photon polymerization among other microfabrication techniques in terms of the ability to produce complex 3D microstructures, the technique has demonstrated limited applicability to the fabrication of shape-shifting magnetic soft materials and robots, possibly because of the incompatibility of the opaque composite mixture with the two-photon polymerization process beyond a certain size limit. Instead, the technique has been used to fabricate micromolds for tiny building blocks of magnetic soft materials, which can be manually assembled under a microscope to build 3D structures with 3D magnetization patterns (**Figure 14d**),<sup>194</sup> similarly to large-scale assembly of magnetic building blocks to realize 3D shapes or magnetization patterns.<sup>211-213</sup> Lacking an automated workflow, however, the microassembly process based on micromolding, magnetization, and manual assembly of the building blocks piece by piece to build 3D objects can be labor-intensive and hence is not likely scalable. Thus far, to the best of our knowledge, there is currently no automated fabrication technique to realize small-scale magnetic soft materials and robots in fully 3D shapes with 3D magnetization patterns to achieve complex transformation, which will be an important area of research and development for next-generation magnetic soft robots with more advanced and sophisticated functions.

### 4.3. Magnetic Reprogramming Strategies

As discussed earlier in **Sections 2.2.2** and **3.2.1**, the high coercivity of typical hard-magnetic materials used for magnetic soft composites allows them to be stable and reliable sources of torque-driven magnetic actuation within the actuating field range below the coercivity (**Figure 9b**). This also means, however, that it is not easy to reprogram the magnetization pattern of hard-magnetic soft materials. For example, common hard-magnetic materials of rare-earth type (e.g., NdFeB and SmCo; see **Section 2.2.2**) require strong magnetizing fields due to their high coercivity values.

Different strategies have been proposed to enable facile reprogramming of the magnetization patterns of hard-magnetic soft materials. One strategy is to use magnetic materials with relatively low Curie temperature, above which the material loses its remanent magnetization. Such materials include chromium dioxide ( $\text{CrO}_2$ ), the Curie point of which is around  $118\text{ }^\circ\text{C}$ , which is far lower than that of typical magnetic materials (e.g., iron, nickel, and cobalt) that ranges from  $300$  to  $1200\text{ }^\circ\text{C}$ . It has been shown that magnetic soft composites based on  $\text{CrO}_2$  can be readily demagnetized through either global heating or localized laser heating and then remagnetized upon cooling while applying an external magnetic field.<sup>214,215</sup> It has also been shown that the demagnetization and remagnetization can be done in a spatially selective manner by applying a focused laser beam for localized heating (**Figure 15a**) to create intricate 3D magnetization patterns in planar structures.<sup>215</sup> Magnetic materials with low Curie temperature such as  $\text{CrO}_2$ , however, have in general relatively low remanence and coercivity as well, which can limit the actuation performance. Microparticles of  $\text{CrO}_2$  microparticles ( $\sim 10\text{ }\mu\text{m}$ ) have the remanence of around  $75\text{ kAm}^{-1}$  (8 times lower than that of NdFeB particles of similar size) and the coercivity of around  $50\text{ mT}$  (12 times lower than that of NdFeB particles of similar size),<sup>214</sup> and hence the maximum magnetic torque density can be substantially lower (i.e., 96 times) than that of NdFeB microparticles of similar size.



**Figure 15. Head-assisted magnetic reprogramming strategies for hard-magnetic soft materials. (a)** Magnetic materials with low Curie temperature (above which the material loses its remanent magnetization) can be easily demagnetized upon global heating or localized laser heating above the Curie point and then remagnetized by an externally applied magnetic field during cooling.<sup>215</sup> **(b)** Hard-magnetic particles encapsulated in phase-change materials with low melting temperature can temporarily move and rotate when heated above the melting point to reorient themselves along the applied field during the heating process. Upon cooling, the reoriented particles are immobilized within the solidified phase-change material to yield a newly programmed magnetization direction in the composite.<sup>216,217</sup>

Another heat-assisted reprogramming strategy for hard-magnetic soft materials is to use phase-change materials with relatively low melting temperature, such as poly(ethylene glycol) (PEG)<sup>216</sup> or polycaprolactone (PCL),<sup>217</sup> to encapsulate the magnetized particles incorporated in the elastomer matrix (**Figure 15b**). Below the melting temperature, which is around  $60\text{ }^\circ\text{C}$  for PEG and PCL, the particles are enclosed and fixed within the solid PEG or PCL. When heated above the melting point, through either global heating or localized laser heating, the particles enclosed in the molten (i.e., liquid) PEG or PCL can temporarily move and reorient when an external magnetic field is applied simultaneously during heating.<sup>216,217</sup> Upon cooling, the reoriented particles are immobilized within the solidified PEG or PCL, yielding a newly programmed magnetization direction in the composite matrix (**Figure 15b**). Allowing the use of magnetized particles with high remanence and coercivity, this reprogramming method based on solid-liquid phase transition would not inherently sacrifice the

actuation performance of hard-magnetic soft composites in terms of the torque density. It is likely, however, that the increase in the average size of particulate fillers due to the inclusion of the melttable solid phase (i.e., the phase-changing beads encasing the magnetic particles) in an elastomer matrix may affect the mechanical properties and behavior of the composite,<sup>218,219</sup> such as more pronounced softening after stretching due to the Mullins effect.<sup>220</sup>

**Table 1. Comparison of Representative Fabrication and Programming Methods for Magnetic Soft Materials and Robots.**

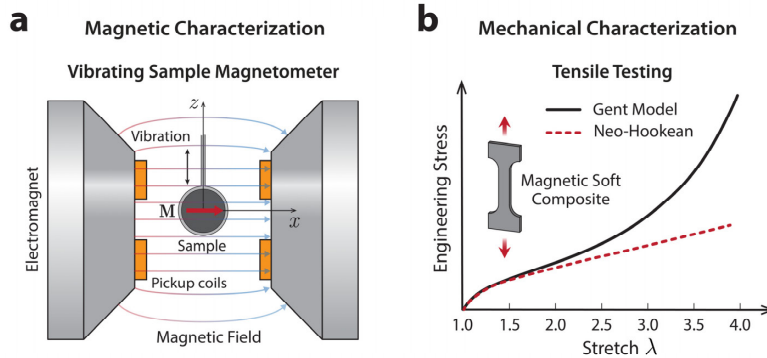
Fabrication	Material Composition	Magnetization Programming	Shape	Magnetization	Scale	Resolution	Refs
Molding and casting	Hard-magnetic (NdFeB) microparticles uniformly dispersed in silicone elastomers	Template-assisted magnetization of composite while deformed into temporary shapes	2D	Continuous, 3D	5–100 mm	~0.5 mm	164-166
Extrusion-based 3D printing	Hard-magnetic (NdFeB) microparticles uniformly dispersed in silicone elastomers	In situ alignment of magnetized particles in printed fibers while depositing composite inks	3D	Discrete, 2D	10–100 mm	~100 $\mu\text{m}$	156
Light-based 3D printing	Hard-magnetic (NdFeB) microparticles chained and aligned in photocurable elastomers	In situ alignment of magnetized particles in printed areas while curing with patterned UV light	2D	Discrete, 3D	2–10 mm	~100 $\mu\text{m}$	178
Micro-molding and assembly	Hard-magnetic (NdFeB) microparticles uniformly dispersed in silicone elastomers	Assembly of microscale building blocks made of magnetized composite into 3D structures	3D	Discrete, 3D	0.5–5 mm	~50 $\mu\text{m}$	194
UV photolithography	Superparamagnetic (iron oxide) nanoparticles aligned in photocurable hydrogels	In situ chain formation and alignment of particles in while curing with patterned UV light	2D	Discrete, 3D	50–500 $\mu\text{m}$	~1.5 $\mu\text{m}$	67,200,201
Electron-beam lithography	Single-domain anisotropic nanomagnets (cobalt) aligned on thin, flexible silicon substrates	Patterning arrays of nanomagnets with different aspect ratios and selective magnetization	2D	Discrete, 2D	10–100 $\mu\text{m}$	~0.1 $\mu\text{m}$	80

## 4.4. Characterization Methods

### 4.4.1. Magnetic Characterization

Magnetic properties of composite samples can be measured using different magnetometry techniques. One of the most common ways to measure the magnetization properties of a sample is using a vibrating sample magnetometer (VSM).<sup>221,222</sup> In typical VSM settings, a magnetizable or already magnetized sample is placed in a spatially uniform magnetic field between a pair of electromagnets and then vibrated perpendicularly to the applied field at a prescribed frequency and amplitude (**Figure 16a**). The vibrating motion (usually vertical) of the magnetized sample causes the magnetic flux entering the pickup coil to change, which in turn creates an induced voltage in the coil that is proportional to the sample’s magnetic moment. By measuring the induced voltage while varying the applied field strength over a range, the hysteresis curve can be obtained for ferromagnetic materials. For already magnetized samples, the measurement should be performed under weak magnetic fields to ensure that the sample’s remanent magnetization remains unaffected by the applied field. It is also worth noting that the sample’s orientation matters when characterizing samples with anisotropic soft-magnetic particles or magnetized hard-magnetic particles, because what is measured from the VSM is the component of the sample’s magnetic moment vector, which is perpendicular to the pickup coil.<sup>156</sup> For small-scale samples, which require higher sensitivity in measurement, more

recent characterization methods, such as using a superconducting quantum interference device (SQUID), can be used.<sup>80,221,223</sup> SQUID magnetometers allow the measurement of the sample's magnetization as a function of temperature as well as the applied magnetic field.<sup>223</sup> Characterization of even smaller magnetic materials such as nanomagnet arrays<sup>79,80,224</sup> requires optical magnetometry techniques based on the magneto-optical Kerr effect, which describes the changes to polarized light when it is reflected from a magnetized surface.<sup>225</sup> Magneto-optical sensors can also be useful when visualizing the complex magnetization patterns programmed in hard-magnetic soft materials with planar geometry (see **Figure 22f**).<sup>178,215</sup>



**Figure 16.** (a) Magnetic characterization of magnetic materials using a vibrating sample magnetometer (VSM) and (b) mechanical characterization of elastomeric composites through tensile testing, where the obtained stress-strain curve can be fitted with hyperelastic constitutive models such as Gent or neo-Hookean models.

#### 4.4.2. Mechanical Characterization

Mechanical properties of magnetic soft materials are as important as their magnetic properties in determining the performance and characteristics of the magnetically driven soft actuators. Our focus here is primarily on the mechanical response of the magnetic soft composite at zero field (i.e., purely mechanical response). For magneto-mechanical characterization of the field-induced stiffening of traditional magnetorheological elastomers, the reader is encouraged to consult other reviews more specifically focused on magnetorheological elastomers and gels.<sup>226-230</sup> As mentioned earlier in **Section 3.3**, the mechanical response of magnetic soft composites can be described by hyperelastic constitutive models. The neo-Hookean model provides the simplest form of strain energy density (Helmholtz free energy per unit reference volume) function, which for isotropic and incompressible ( $J = 1$ ) solids is given by

$$\Psi(\mathbf{F}) = \frac{G}{2}(I_1 - 3), \quad (66)$$

where  $G$  is the shear modulus of the material and  $I_1 = \text{tr}(\mathbf{F}^T \mathbf{F})$  is the trace of the right Cauchy-Green tensor  $\mathbf{F}^T \mathbf{F}$ . It is worth noting that most rubber-like materials can be reasonably considered to be incompressible because their bulk modulus values are typically orders of magnitude greater than their shear modulus values.<sup>231</sup> For incompressible solids, the constitutive equation in Eq.(60) is modified with the additional constraint of incompressibility taken into account as

$$\boldsymbol{\sigma} = \frac{\partial \Psi}{\partial \mathbf{F}} \mathbf{F}^T - p \mathbf{I}, \quad (67)$$

where  $p$  is often termed the hydrostatic pressure, a scalar quantity that can be determined from the equilibrium equations and the boundary conditions. Substituting Eq.(66) into Eq.(67) gives the following form of the Cauchy stress for incompressible neo-Hookean solids:

$$\boldsymbol{\sigma} = G\mathbf{F}\mathbf{F}^T - p\mathbf{I}. \quad (68)$$

Under uniaxial loading, the deformation gradient  $\mathbf{F}$  can be expressed in terms of the principle stretches as  $[\mathbf{F}] = \text{diag}(\lambda_1, \lambda_2, \lambda_3)$ . With the incompressibility constraint ( $J = \det \mathbf{F} = \lambda_1 \lambda_2 \lambda_3 = 1$ ), the deformation gradient tensor can be expressed in the matrix form as

$$[\mathbf{F}] = \begin{bmatrix} \lambda & 0 & 0 \\ 0 & \lambda^{-1/2} & 0 \\ 0 & 0 & \lambda^{-1/2} \end{bmatrix}, \quad (69)$$

with  $\lambda_1 = \lambda$  and  $\lambda_2 = \lambda_3 = \lambda^{-1/2}$ . Then, from Eqs.(68) and (69), each component of the Cauchy stress is calculated as  $\sigma_{11} = G\lambda^2 - p$  and  $\sigma_{22} = \sigma_{33} = G\lambda^{-1} - p$ . With the traction-free boundary condition  $\sigma_{22} = \sigma_{33} = 0$ , which gives  $p = G/\lambda$ , the true tensile stress can then be expressed as

$$\sigma_{11} = G\left(\lambda^2 - \frac{1}{\lambda}\right), \quad (70)$$

which measures the true stress (force per unit current area) in the elongated specimen. In practice, the engineering or nominal stress, which characterizes the force per unit reference (undeformed) area, is easier to measure. From the relation between the Piola stress and the Cauchy stress in Eqs.(59) and (60) (i.e.,  $\mathbf{P} = J\boldsymbol{\sigma}\mathbf{F}^{-T}$ ), the engineering tensile stress can be expressed as

$$P_{11} = G\left(\lambda - \frac{1}{\lambda^2}\right). \quad (71)$$

By fitting the experimentally obtained stress-stretch curve with Eq.(71), one can find the shear modulus of the material that is assumed to be an incompressible neo-Hookean hyperelastic solid (**Figure 16b**). In general, the neo-Hookean model captures the experimental data reasonably well for relatively small deformation (i.e.,  $\lambda \leq 1.5$ ). At higher stretch levels, the neo-Hookean fails to predict the stiffening behavior that is observed in most rubber-like materials, and therefore other hyperelastic models (e.g., Gent, Mooney-Rivlin, Ogden, etc.) should be used along with additional fitting parameters. Given that the local maximum strain is typically around 30% (i.e.,  $\lambda \leq 1.3$ ) even for large bending, it is reasonable to use the neo-Hookean model to find the material property (i.e., shear modulus  $G$ ) when characterizing the mechanical response of magnetic soft bending actuators. It is worth noting that, for magnetic soft materials with mechanical anisotropy due to the aligned anisotropic particles, the strain energy density function should be chosen accordingly to account for their anisotropic mechanical response. Such anisotropic composites with directional mechanical properties can be regarded as transversely isotropic materials in general and treated similarly as fiber-reinforced composite materials in their modeling and characterization.<sup>81</sup>

## 5. Magnetic Actuation and Manipulation Platforms

Magnetic actuation utilizes torques and forces generated from the embedded magnetic particles under an applied magnetic field and therefore requires an external magnetic source that generates the actuating field. Manipulation of magnetic soft materials and robots can be achieved through the

spatiotemporal control of the actuating magnetic field. Magnetic actuation and manipulation platforms can be categorized into different groups depending on the type of magnetic sources (permanent magnet or electromagnets) and their configuration (single, paired, or multiaxial), the characteristics of the actuating fields (spatially uniform or nonuniform, static or time-varying), and the mobility of the magnetic source (moving or stationary). In the following sections, we discuss some of the common types of magnetic actuation platforms that have been proposed for manipulation and control of magnetic objects in space for different applications.

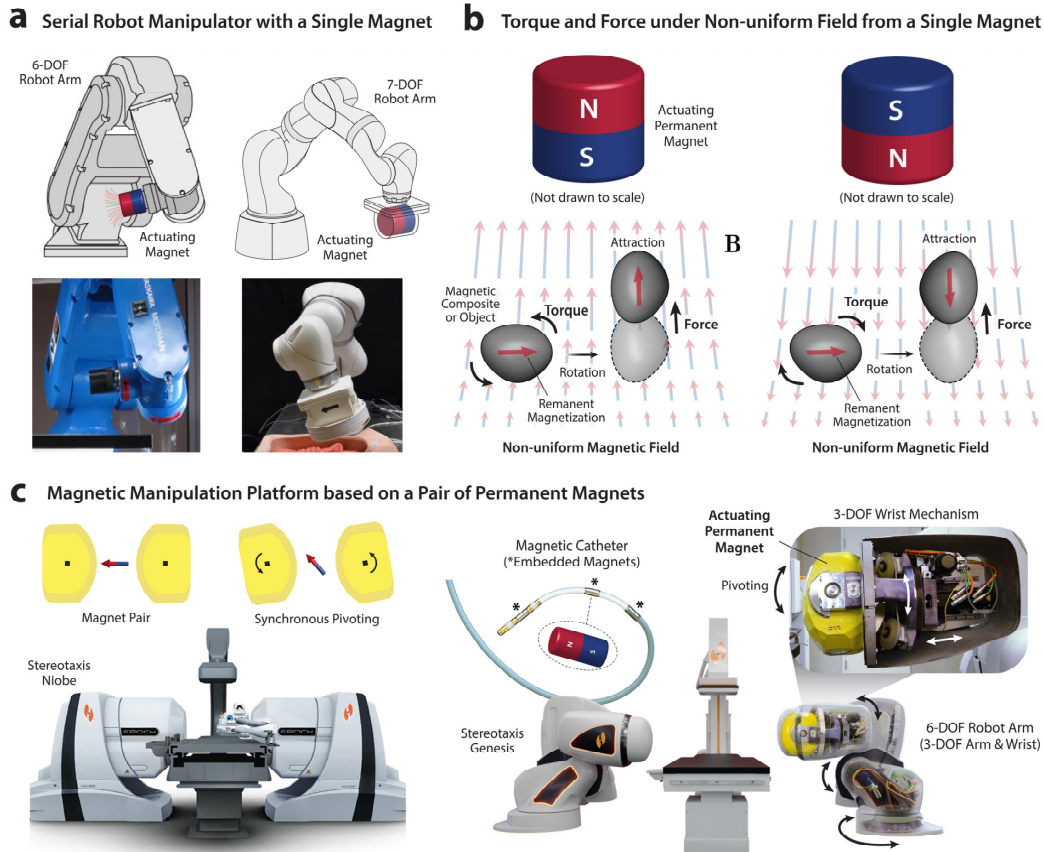
### 5.1. Platforms Based on Permanent Magnets

One of the advantages of using a permanent magnet comes from the fact that it can give rise by itself to a static and relatively strong magnetic field in outer space. Contrary to electromagnets with current-carrying coils, which are subject to heat loss, permanent magnets do not experience heat loss and hence are generally more energy-efficient than electromagnets in generating magnetic fields of the same strength. Typical electromagnets are based on stacking multiple coils around a highly permeable soft-magnetic core to concentrate the magnetic flux. Even in the presence of a core, however, the field of a permanent magnet can in general exceed that of an electromagnet of the same size by up to an order of magnitude.<sup>232</sup>

For this reason, a single permanent magnet has been commonly used to actuate magnetic soft materials and robots as well as rigid magnetic objects or devices in different forms (e.g., pills or capsules). Magnetic manipulation can be achieved through spatial positioning of the actuating magnet while changing the position and orientation of the magnet relative to the object being manipulated. It is not uncommon to see a hand-held magnet being used to manipulate small magnetic objects in the literature, usually for validation of the proposed concepts or devices, for different applications such as capsule endoscopy,<sup>233-237</sup> therapeutic delivery,<sup>60,131,238</sup> endovascular navigation,<sup>31</sup> and other general soft robotic applications.<sup>156,194</sup> For more precise and reliable manipulation, it is also common to use a serial robot arm manipulator with multiple degrees of freedom (DOFs) to carry the actuating magnet and place it around the object being manipulated (**Figure 17a**). While in early days heavy and bulky industrial robot manipulators were employed,<sup>239-247</sup> recently more compact and lightweight robot arms have been used for magnetic manipulation in medical applications.<sup>248-250</sup>

A single permanent magnet, however, produces spatially nonuniform magnetic fields, and the presence of field gradients gives rise to the magnetic force as well as the magnetic torque acting on the object being manipulated (**Figure 17b**). The coupled interaction of magnetic force and torque, along with the complex geometry of the magnetic fields that depends on the shape of the magnet, make it nontrivial or rather difficult to precisely manipulate magnetic objects in many cases. One way to mitigate the geometrical complexity is to make the field symmetric by choosing an actuating magnet of simple symmetrical shape (e.g., cylindrical or spherical) with its remanent magnetization along the axis of symmetry. Then, the rotation of the magnet around its symmetry axis causes no change in the actuating magnetic field, which effectively reduces the DOFs involved in the manipulation of the magnet to 5 (3 for translations and 2 for rotations). Accordingly, for an untethered magnetic object (e.g., a magnetic capsule or pill containing a small magnet) with uniform magnetization in an unrestricted workspace, the number of DOFs that can be controlled by a single actuating magnet is at most five.<sup>243,251</sup> The reduction of the effective DOFs due to the symmetry of the actuating magnet is equivalent to having kinematic redundancy when using a serial robot arm to spatially manipulate the magnet. This allows for more flexible operation of the robot arm when

controlling a magnetic body through spatial positioning of the actuating magnet while avoiding collision with surrounding obstacles and other constraints such as kinematic singularity and joint limits.



**Figure 17. Magnetic actuation and manipulation platforms based on permanent magnets.** (a) Multi-DOF serial robot manipulators with a single actuating magnet attached at the end for steering untethered or tethered magnetic devices. (b) Magnetic torque and force on a hard-magnetic object in spatially nonuniform fields from a single actuating magnet. (c) Stereotaxis Niobe and Genesis platforms based on a pair of large permanent magnets for steering magnetic catheters by changing the applied field direction through synchronous pivoting of the actuating magnets. Panel (a) reproduced with permission from refs 243 and 249. Copyright 2016 SAGE Publications and 2019 American Association for the Advancement of Science.

In addition to having symmetry in the actuating field, magnetic manipulation can be further simplified by effectively decoupling the magnetic torque and force acting on the magnetic object by design. We know from Eq.(4) that the magnetic force can be suppressed by minimizing the effect of field gradients while reducing the strength of the object’s magnetic moment. When the magnetic object is sufficiently smaller than the actuating magnet and manipulated at sufficiently large distance from the magnet, the field gradients become substantially weaker due to the nature of the dipole field,<sup>252</sup> for which the field gradient decays rapidly with the distance from the source (i.e., inversely proportional to the fourth power).<sup>17</sup> Furthermore, by reducing the strength of the magnetic moment through dispersing small magnetic particles instead of embedding finite-sized permanent magnets, magnetic forces acting on the object can be suppressed. It has been shown, for example, that sub-millimeter-scale soft continuum robots based on hard-magnetic soft materials can be steered easily

and intuitively with a single magnet.<sup>31,253</sup> By design, such continuum devices with uniformly distributed magnetic particles have much diluted magnetization across the device, whereas conventional magnet-tipped devices, which contain one or a few embedded magnets, have highly concentrated and localized magnetic moments. Because the magnetic force always tends to attract the embedded magnets toward the actuating magnet (**Figure 17b**), steering control of the magnet-tipped devices using a single magnet can be easily complicated by the coupled interaction from the magnetic torques and forces. By contrast, the continuum devices based on hard-magnetic soft materials can utilize the magnetic torque as the primary source of actuation in steering control while experiencing negligible influence from the magnetic force.

For purely torque-based actuation and manipulation, spatially uniform magnetic fields can be created when two permanent magnets are configured in such a way that their opposite poles face each other. Commercially available magnetic actuation platforms based on spatially uniform fields include the Niobe and Genesis systems (Stereotaxis Inc.), which use a pair of large permanent magnets (**Figure 17c**). These systems have been used mostly for cardiac electrophysiology to treat heart arrhythmia using magnetic ablation catheters with a few rigid magnets incorporated in the distal portion for steering purposes.<sup>26,28</sup> By synchronously rotating the two actuating magnets, each around its pivot inside the casing, these magnetic actuation platforms can create relatively uniform magnetic fields of 80-100 mT in any direction in the workspace between the magnets and hence enable force-free, intuitive steering control of the magnetic catheters (**Figure 17c**).<sup>28,254-257</sup>

## 5.2. Platforms Based on Electromagnets

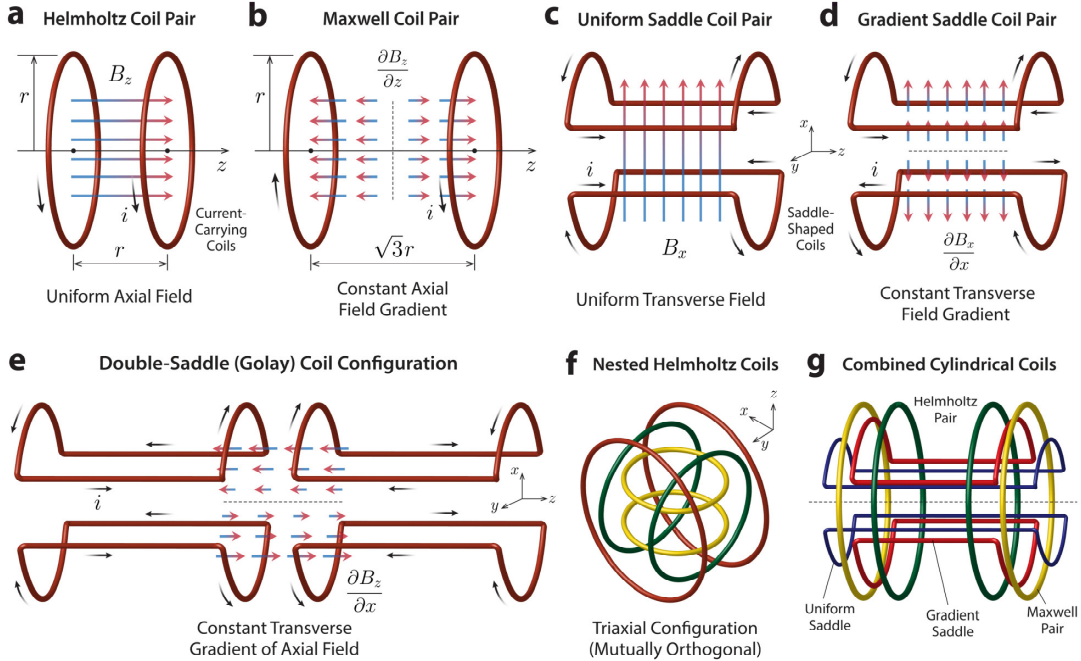
While current-carrying coils are generally less energy-efficient in producing magnetic fields than permanent magnets, magnetic actuation platforms based on electromagnets offer several benefits that make them preferable to permanent magnets in many practical applications. Electromagnets provide a larger design space, with a variety of possible configurations of multi-axial coils, and a larger control space as well due to the ability to quickly turn on and off each coil or reverse the magnetic polarities of the individual coils to create complex (rotating or oscillating) fields without the need to move the set of coils physically. Furthermore, magnetic actuation platforms based on electromagnets can be designed to provide the capability to control both the magnetic force and torque either independently or simultaneously,<sup>154,258,259</sup> to enable more flexible and sophisticated manipulation of magnetic objects within the workspace. To date, numerous types of magnetic actuation and manipulation systems based on electromagnets have been developed, which vary in the shape, number, and configuration of the current-carrying coils. According to the classification used by Abbott et al.,<sup>258</sup> magnetic actuation and manipulation platforms based on electromagnets can be categorized into magnetically orthogonal systems or magnetically nonorthogonal systems.

### 5.2.1. Magnetically Orthogonal Systems

Magnetically orthogonal systems utilize special types of electromagnets, based on either circular or saddle coils arranged in pairs, which are designed to produce spatially uniform fields or constant field gradients in the workspace. When two identical circular coils are separated coaxially by a distance equal to their radius  $r$  and carry equal currents in the same direction, the field produced between the two coils in the axial direction ( $z$ -axis) is nearly uniform (**Figure 18a**). This is known as the Helmholtz coil configuration, and a pair of coils in such an arrangement is commonly called a Helmholtz coil-pair.<sup>260</sup> The magnitude of the uniform field is proportional to the current strength  $i$



and inversely proportional to the radius  $r$  (i.e.,  $B_z \sim i/r$ ), and a Helmholtz coil-pair can be used to apply a uniform torque on a magnetic object in the workspace. When the two circular coils are separated further by a distance  $\sqrt{3}r$  and carry equal currents in the opposite direction (**Figure 18b**), the pair of coils can generate a nearly constant field gradient in the axial direction ( $\partial B_z/\partial z$ ), the magnitude of which is proportional to the current  $i$  and inversely proportional to the square of the radius  $r$  (i.e.,  $\partial B_z/\partial z \sim i/r^2$ ). Such an arrangement is called the Maxwell coil configuration,<sup>261</sup> which can be used to apply a uniform force on a magnetic object in the workspace. These circular coil-pairs are easy to construct and offer good accessibility to the workspace of cylindrical shape.



**Figure 18. Magnetic actuation and manipulation platforms based on orthogonally arranged or specially shaped electromagnetic coils.** (a) Helmholtz and (b) Maxwell coil pairs for creating a uniform axial field (Helmholtz) or field gradient (Maxwell). Saddle-shaped coil pair for creating (c) a uniform transverse field or (d) a constant transverse field gradient depending on the direction of currents. (e) Golay coil configuration based on two saddle coil pairs for creating a constant transverse gradient of the axial magnetic field. (f) Nested Helmholtz coils in mutually orthogonal triaxial configuration for creating uniform actuating fields in three different directions. (g) Combination of different coil-pair types for multi-DOF magnetic manipulation based on magnetic torques and forces in a cylindrical workspace.

When it is desired to have an actuating magnetic field perpendicular to the symmetry axis of the cylindrical workspace, a pair of saddle-shaped coils can be used. In the saddle coil-pair system, two saddle-shaped coils that are confined to a thin cylindrical shell (i.e., coils wound on the surface of a cylinder) carry equal currents either in the same (parallel) direction to produce a uniform field (**Figure 18c**) or in the opposite (antiparallel) direction to produce a uniform field gradient (**Figure 18d**).<sup>262</sup> It is worth noting, however, that the symmetry of the actuating field can be reduced with the saddle coil-pair system, when compared with the circular coil-pair system.<sup>263</sup> When two saddle coil-pairs are aligned to have a common symmetry axis of the arcs, forming a specific configuration called Golay or double-saddle coils (**Figure 18e**),<sup>261,264</sup> a uniform field gradient can be generated in the transverse direction ( $\partial B_z/\partial x$  or  $\partial B_z/\partial y$ ) depending on their orientation.

To increase the controllable DOFs, Helmholtz or Maxwell coil pairs can be nested in a mutually orthogonal fashion such that the symmetry axes of the coil pairs intersect at the common center (**Figure 18f**),<sup>265-268</sup> where each coil pair independently produces a uniform field (Helmholtz) or field gradient (Maxwell) along its axial direction. For example, one or two Maxwell coil pairs can be incorporated into a triaxial Helmholtz coil system to apply forces in one or two directions in addition to torques in three directions on a magnetic object in the workspace.<sup>269,270</sup> However, the available workspace for such orthogonally nested coil pairs is constrained to the workspace of the innermost (smallest) coil pair, which often leads to the scalability issue,<sup>259</sup> given that both the field strength ( $\sim r^{-1}$ ) and the field gradient ( $\sim r^{-2}$ ) decrease as the coil radius  $r$  increases under the same current strength. When saddle coil pairs are combined with circular Helmholtz and Maxwell coil pairs, a spatially more compact system with a cylindrical workspace (**Figure 18g**) can be designed to enable multi-DOF magnetic manipulation.<sup>271-275</sup> Lacking soft-magnetic cores, however, magnetically orthogonal systems based on nested Helmholtz/Maxwell or saddle coil pairs are usually suitable for applications with relatively small workspace. This is because the generated field strength is limited by the coil radius, while the problem of overheating<sup>276</sup> precludes the use of large currents to produce stronger fields unless the setup is equipped with a cooling system like clinical magnetic resonance imaging (MRI) scanners.

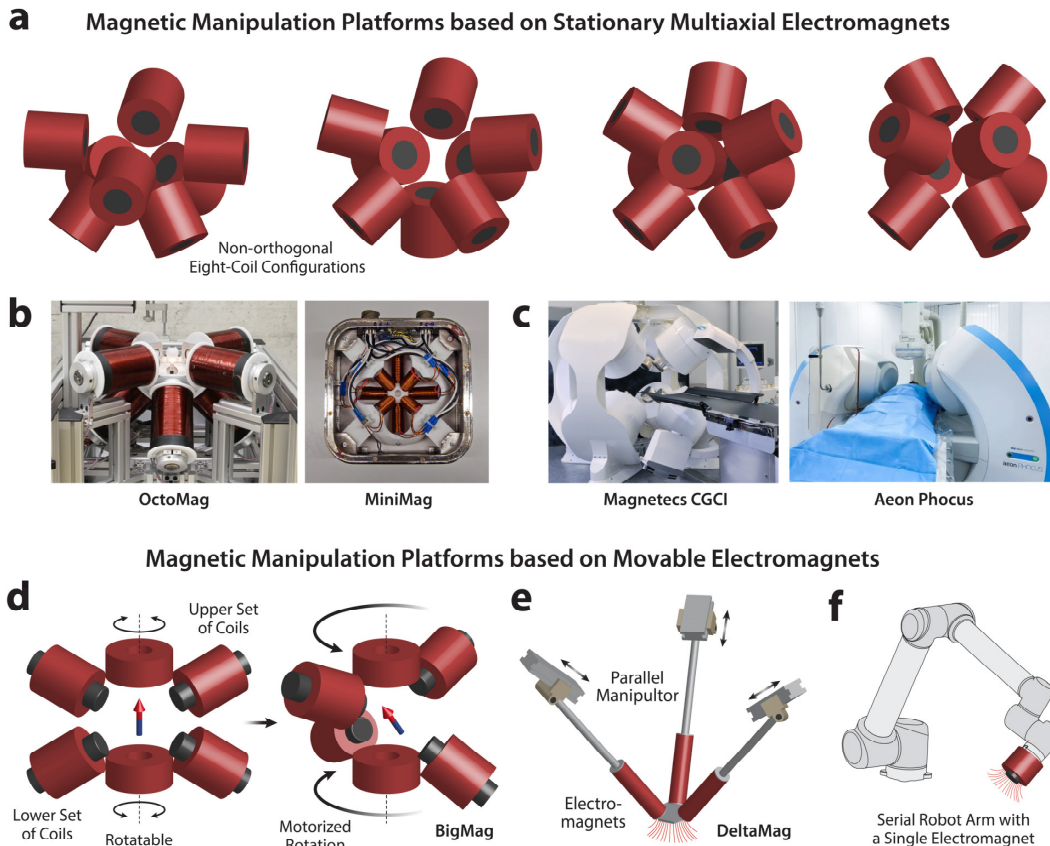
In the clinical MRI scanner, field gradients can be generated in the bore by two pairs of Golay coils (for transverse gradients) and one pair of Maxwell coils (for axial gradient), in addition to the strong and uniform bore field in the axial direction generated by the main superconducting electromagnet. Therefore, clinical MRI scanners have been proposed as a magnetic manipulation platform with integrated imaging capabilities in many studies,<sup>258,277,278</sup> despite some image artifacts that can be caused by magnetic objects,<sup>17</sup> and used after minor hardware/software modifications for wireless actuation of magnetically controlled medical robots or devices based on magnetic forces generated through the gradient coils.<sup>279-287</sup> Instead of using the field and field gradients in the bore, it has also been proposed that the strong fringe fields emanating from the clinical MRI scanner can be used to steer a magnet-tipped continuum device (e.g., guidewire), for which an industrial robot arm was employed for spatial positioning of the patient table around the MRI scanner as a large stationary magnet.<sup>288</sup>

### 5.2.2. Magnetically Nonorthogonal Systems

Another class of magnetic actuation and manipulation platforms, termed the magnetically nonorthogonal system,<sup>258</sup> utilizes multiple columnar coils with soft-magnetic cores that are arranged around the workspace such that they all point to the center of the workspace. The fields generated by individual electromagnets are superimposed to create desired fields and field gradients for manipulation, and hence all electromagnets are active in general. It is known that in general at least eight coils are needed to control the five DOFs of an unconstrained magnetic object (i.e., three translations and two rotations except one rotation around the magnetization axis due to symmetry) independently without orientation-dependent singularities,<sup>289</sup> at which the system loses the ability to generate magnetic force or torque on the object.<sup>259</sup> Various designs of magnetic manipulation platforms based on eight electromagnets (**Figure 19a**) have been developed,<sup>29,197,290-294</sup> which have different characteristics and performances in terms of torque- and force-generation capabilities and the accessibility of the workspace surrounded by the electromagnets.<sup>258,295</sup> For small scales (i.e., table-top), the MagnebotiX OctoMag<sup>296</sup> or MFG-100<sup>297</sup> (or MiniMag<sup>298</sup>) systems based on eight stationary

electromagnets are commercially available (**Figure 19b**). For human-body scale, clinical magnetic manipulation platforms based on eight stationary electromagnets include the Magnetecs (Neuro-Kinesis) CGCI (Catheter Guidance Control and Imaging)<sup>26,27,290</sup> and the Aeon Phocus<sup>29,292</sup> systems (**Figure 19c**), which have been used for cardiac electrophysiology as the Stereotaxis Niobe/Genesis system. These products are capable of independently controlling both the field and field gradient at any location in the workspace.<sup>154,234</sup>

The number of coils can be increased for systems based on stationary electromagnets to have manipulation redundancy<sup>258,299</sup> or to enable spatially selective magnetic actuation.<sup>266,268</sup> The number of coils can be reduced as well by adding motorized actuators<sup>168,300</sup> (**Figure 19d**) or a parallel robot manipulator<sup>301,302</sup> (**Figure 19e**) to rotate or move the electromagnets, which helps to increase the available workspace by reducing the number of electromagnets. A 6-DOF serial robot arm with a single electromagnet at its end-effector (**Figure 19f**) has also been proposed and demonstrated as a magnetic manipulation platform for steering tethered magnetic devices such as a magnet-tipped catheter.<sup>303-306</sup> Instead of employing a multi-DOF serial robot arm to change the position and orientation of a single electromagnet, a simple passive arm has been used to carry and hold a cube-shaped electromagnet consisting of three nested mutually orthogonal coils, also known as Omnimagnet,<sup>307,308</sup> to control a magnetically steerable cochlear implant (see **Figure 25g** in **Section 6.2.2**).<sup>309</sup> When compared with the platforms based on multiple stationary electromagnets (**Figure 19a-c**), these mobile electromagnetic actuation platforms can provide a larger workspace for more flexible operation with increased compatibility with external imaging or sensing devices.



**Figure 19. Magnetic actuation and manipulation platforms based on electromagnets.** (a) Representative examples of magnetic actuation and manipulation platforms based on stationary multiaxial electromagnets in nonorthogonal eight-coil configurations<sup>258,295</sup> and commercially available systems for (b) table-top<sup>296-298</sup> and (c) human-body scales. Magnetic manipulation platforms based on movable electromagnets: (d) motorized actuation of rotatable electromagnets<sup>168,300</sup> and (e) a parallel<sup>297,298</sup> or (f) a serial<sup>303-306</sup> robot manipulator for controlling the position and orientation of the actuating electromagnet in the workspace. Photo on the right in panel (b) reproduced with permission from ref 298. Copyright 2014 Springer Nature.

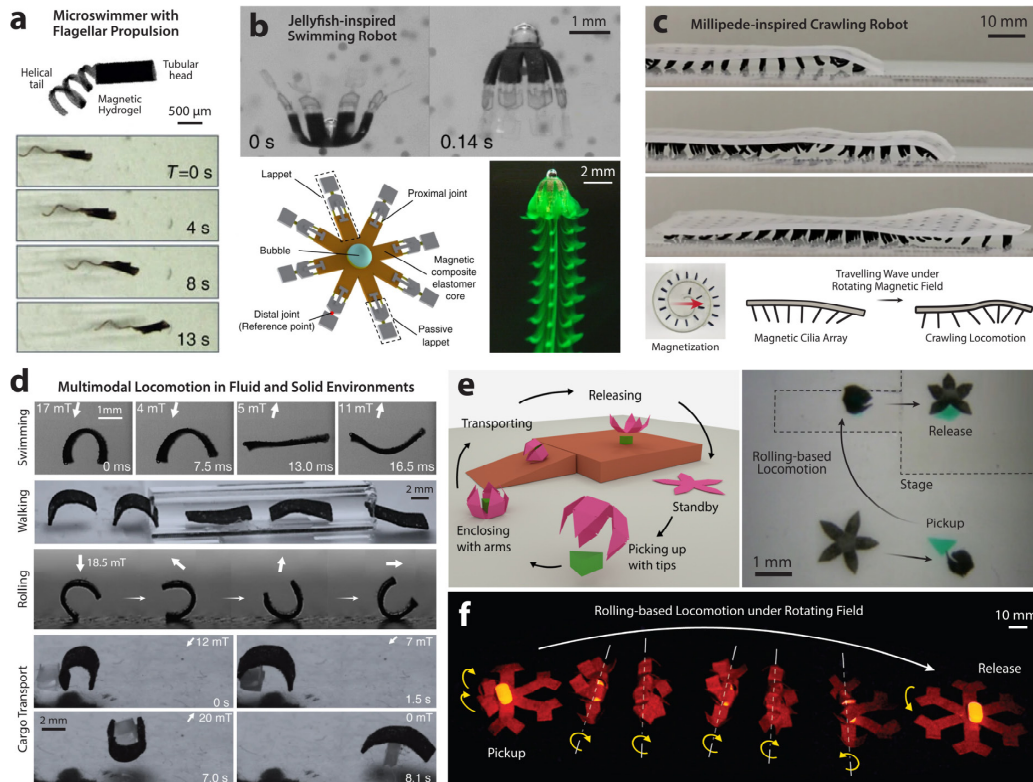
## 6. Applications of Magnetic Soft Materials and Robots

The recent progress in materials design, modeling, and fabrication techniques for magnetic soft materials and robots and the advances in the magnetic actuation platforms have collectively broadened their boundary of applications in different areas, which is in contrast with traditional magnetorheological elastomers whose applications have developed somewhat narrowly in the field of vibration isolation or absorption. In the following sections, we discuss the emerging applications of magnetic soft materials and robots by grouping them into a few categories depending on their purposes. First, we will discuss general soft-robotic concepts and devices based on magnetic soft materials, which are not necessarily in biomedical areas in terms of their target applications. Then, we will review those that have been more specifically proposed and demonstrated for biomedical applications in the literature.

### 6.1. General Applications

#### 6.1.1. Small-Scale Untethered Soft Robots

Magnetic actuation has been a fast and effective means of manipulating untethered small-scale magnetic soft robots. In fluidic environments, in which the viscous drag becomes more significant or dominant than the inertial force (i.e., with low Reynolds number) due to the size effects, swimming strategies have often been adopted based on those of living microorganisms.<sup>17</sup> Inspired by sperm cells, for example, which utilize traveling waves from the head toward the tail for propulsion, soft or flexible magnetic filaments have been used to create undulating motion under an oscillating magnetic field to produce thrust.<sup>310-313</sup> The helical propulsion of bacterial flagella has also been adopted to small-scale magnetic soft robots which are designed to mimic the screw-like motion to propel themselves under rotating magnetic fields (**Figure 20a**).<sup>200,201</sup> Millimeter-scale magnetic soft robots have also been designed to mimic the jellyfish and successfully demonstrated a life-like swimming motion under oscillating magnetic fields (**Figure 20b**).<sup>167</sup> Such bioinspired magnetic soft robots have been developed for locomotion in solid environments as well, including the millipede- or centipede-inspired soft-robotic crawlers that utilize traveling metachronal waves under rotating magnetic fields (**Figure 20c**).<sup>159,168,314</sup> Shape-programmable magnetic soft materials can be designed to exhibit different modes of deformations depending on the applied field strength and direction, and their shape-changing capabilities can be used to enable multiple modes of locomotion when combined with spatiotemporal control of the actuating magnetic fields. Magnetic soft robots of relatively simple geometry (e.g., a planar beam) with non-uniform magnetization patterns have demonstrated a series of multimodal locomotion and transition in fluid and/or solid environments (**Figure 20d**).<sup>164-166,315</sup> The advanced fabrication techniques based on 3D printing (see **Section 4.2.2**) have increased the level of complexity in the design of magnetic soft robots and provided them with flexible appendages, which help to achieve more sophisticated functions while interacting with other objects or environments at millimeter or centimeter scales (**Figure 20, e and f**).<sup>156,178,316</sup>



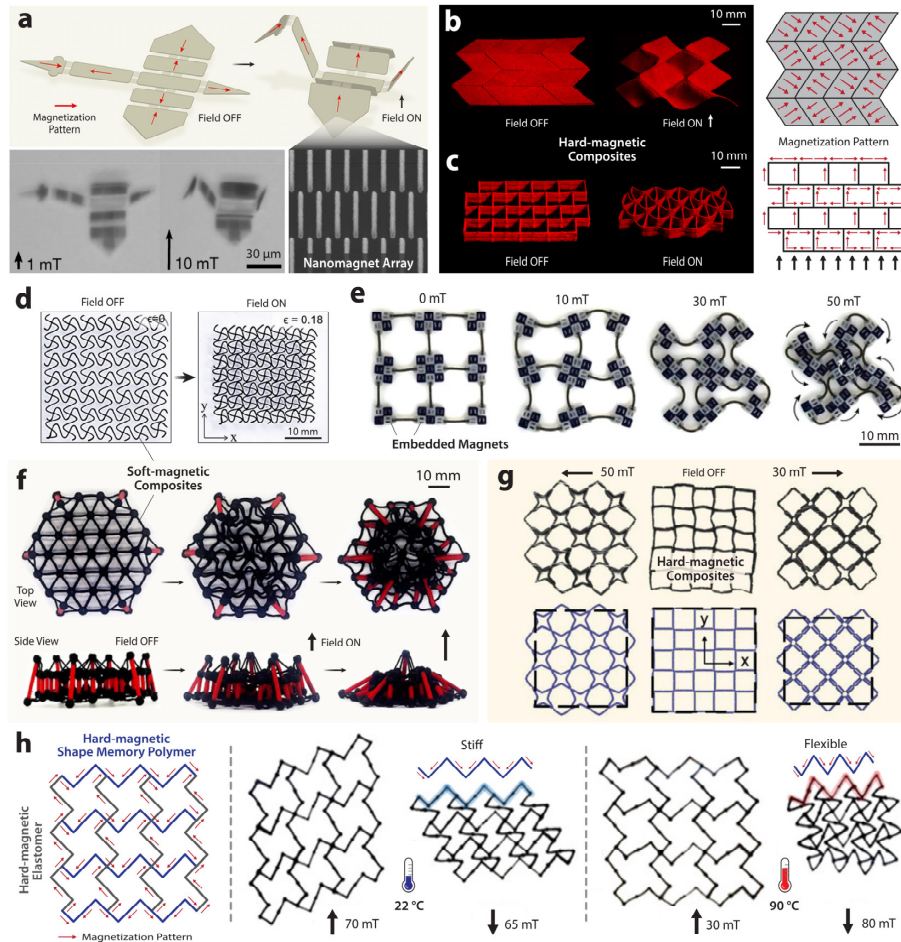
**Figure 20. Small-scale untethered soft robots based on magnetic soft materials.** (a) Microswimmer based on magnetic hydrogel mimicking the helical propulsion of bacterial flagella under rotating magnetic fields. (b) Bioinspired magnetic soft robots based on hard-magnetic soft composites mimicking the swimming motion of a jellyfish under alternating magnetic fields. (c) Millipede-inspired crawling robot with an array of hard-magnetic cilia with different magnetization directions to produce traveling waves under a rotating magnetic field for crawling locomotion. (d-f) Magnetic soft robots based on hard-magnetic composites exhibiting multimodal locomotion such as swimming, walking, and rolling in fluid/solid environments as well as cargo transport through spatiotemporal control of the actuating magnetic fields. Panel (a) reproduced with permission from ref 200 (Copyright 2016 Springer Nature); panel (b) from ref 167 (Copyright 2019 Springer Nature); panel (c) from ref 159 (Copyright 2020 Springer Nature); panel (d) from ref 166 (Copyright 2018 Springer Nature); panel (e) from ref 178 (Copyright 2019 American Association for the Advancement of Science); and panel (f) from ref 156 (Copyright 2018 Springer Nature).

### 6.1.2. Active Origami and Metamaterials

Earlier forms of magnetically controlled origami robots<sup>317</sup> have used small permanent magnets embedded in passive origami structures for magnetic manipulation and localization.<sup>21,22,46,318,319</sup> Using distributed magnetic torques and local rotations under an applied field, magnetic soft materials have been shown to enable magnetically controlled folding and unfolding of origami-type structures across different scales.<sup>80,156,216,320</sup> For example, a magnetically controlled microscopic crane has been designed and fabricated based on patterned nanomagnet arrays connected by flexible hinges (**Figure 21a**), which produces flapping movements under an alternating magnetic field.<sup>80</sup> The classic Miura-ori pattern has also been reproduced with magnetic soft materials<sup>156,319</sup> (**Figure 21b**), which is essentially a type of mechanical metamaterial that shrinks in both length and width directions, exhibiting a negative in-plane Poisson's ratio.<sup>321,322</sup> Various structures with negative Poisson's ratios (often referred to as auxetic metamaterials<sup>322</sup>) whose auxetic behaviors can be controlled magnetically have been realized, through either extrusion-based 3D printing<sup>156,173</sup> (**Figure 21c,d**), manual assembly<sup>194,212,215,323,324</sup>



(Figure 21e,g), or injection molding<sup>162</sup> (Figure 21f) approaches, highlighting the utility of shape-programmable magnetic soft materials in the design of active mechanical metamaterials. By integrating shape memory polymer components into magnetic soft composites via multimaterial 3D printing, mechanical metamaterials with temperature-dependent magnetic response have also been realized<sup>110</sup> (Figure 21h). Other types of magnetically controlled mechanical metamaterials, which utilize field-induced stiffening to exhibit field-dependent structural properties or behaviors in response to applied static or dynamic mechanical loads, have been demonstrated.<sup>163,325,326</sup> Active metamaterials made of magnetic soft materials have demonstrated potential for applications in unconventional soft robotics,<sup>156,162</sup> acoustic metastructures with tunable bandgap,<sup>324</sup> and vibration-resistant structures.<sup>326</sup>

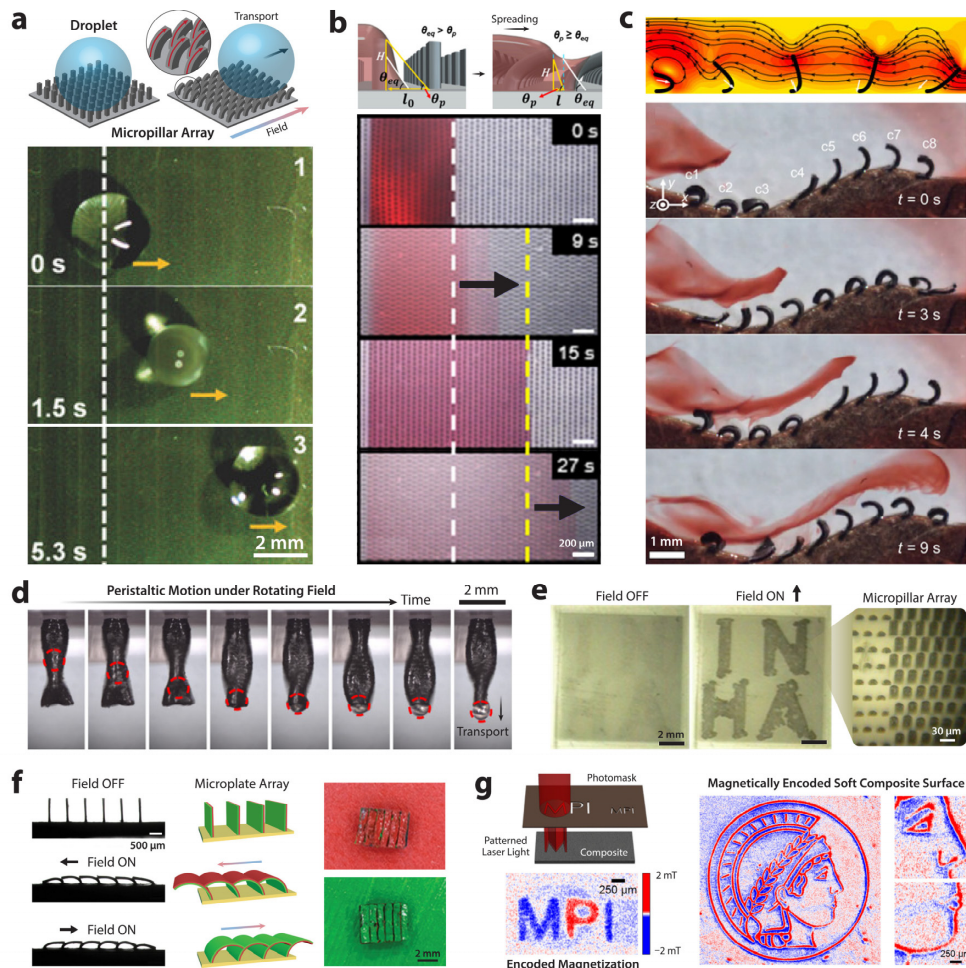


**Figure 21. Applications of magnetic soft materials for magnetically reconfigurable active origami and metamaterials.** (a) Rigid panels with patterned nanomagnet arrays connected by microfabricated hinges morphing into a microscopic crane upon the application of an external magnetic field. (b) Miura-ori fold made of a hard-magnetic soft composite encoded with alternating oblique patterns of magnetic polarities. Auxetic structures with negative Poisson's ratios based on 3D-printed (c) hard-magnetic (torque-driven) and (d) soft-magnetic (force-driven) composites exhibiting shrinkage in both length and width under applied magnetic fields. (e) Torque-driven auxetic behavior of a manually assembled structure based on embedded magnets connected by flexible members. (f) Tensegrity structure based on injection-molded soft-magnetic soft composites exhibiting force-driven auxetic behavior under an applied magnetic field. (g) 2D lattice structure based on manually assembled hard-magnetic composites connected by asymmetrically bendable joints exhibiting different torque-driven auxetic behavior depending on the applied field direction for magnetically tunable acoustic properties. (h) 3D-printed 2D lattice structure based on hard-magnetic elastomer and shape memory polymer exhibiting temperature-dependent torque-driven auxetic behavior. Panel (a) is reproduced with permission from refs 80 and 20 (Copyright 2019 Springer

Nature); panels (b) and (c) from ref 156 (Copyright 2018 Springer Nature); panel (d) from ref 173 (Copyright 2019 Wiley); panel (e) from ref 212 (Copyright 2019 American Association for the Advancement of Science); panel (f) from ref 162 (Copyright 2020 American Association for the Advancement of Science); panel (g) from ref 324 (Copyright 2021 Wiley); and panel (h) from ref 110 (Copyright 2021 American Chemical Society).

### 6.1.3. Programmable and Reconfigurable Surfaces

Arrays of micropillars or microplates based on magnetic soft materials have been used to create magnetically reconfigurable surfaces for different purposes. Through the superhydrophobic nature of micropillar arrays made of magnetic soft materials, for example, it has been shown that small liquid droplets or particles can be transported and manipulated on the arrays by controlling the applied magnetic field (**Figure 22a**).<sup>157,193,327,328</sup> Similarly, magnetically reconfigurable surfaces based on micropillar or microplate arrays have been used for fluid transport (spreading, pumping, mixing) through magnetically induced topographical and wettability changes (**Figure 22b**)<sup>198,199,329</sup> or using dynamic metachronal waves created by magnetic cilia under rotating fields (**Figure 22c**).<sup>158-160,330,331</sup> Fluid transport has also been demonstrated with circular tubes made of magnetic soft materials that are designed to mimic the peristaltic motion under traveling or rotating magnetic fields (**Figure 22d**)<sup>194,332</sup> or using a miniaturized centrifugal pump based on magnetic soft composites.<sup>333</sup>



**Figure 22. Applications of magnetic soft materials for programmable and reconfigurable surfaces.** Hard-magnetic micropillar arrays **(a)** transporting liquid droplets and **(b)** spreading liquids using magnetically controlled deformation of the pillars. **(c)** Hard-magnetic cilia transporting fluids through traveling metachronal waves under rotating magnetic fields. **(d)** Peristaltic pump based on microassembled hard-magnetic composites for transporting particles or liquids under rotating magnetic fields. **(e)** Hard-magnetic micropillar array with encrypted patterns that can be revealed under an applied magnetic field. **(f)** Hard-magnetic microplate array with each side of the plate colored differently to realize magnetically controlled active camouflage. **(g)** Hard-magnetic soft composite based on materials with low Curie point (e.g.,  $\text{CrO}_2$ ) and laser-assisted heating for spatially selective remagnetization (left). A magnetic soft composite surface encoded with a complex magnetization pattern through contact transfer of the magnetization profile from a magnetic master under global heating of the composite while in contact with the master surface (right). Panel **(a)** is reproduced with permission from ref 193 (Copyright 2018 Wiley); panel **(b)** from ref 198 (Copyright 2020 American Chemical Society); panel **(c)** from refs 158 and 330 (Copyrights 2020 American Association for the Advancement of Science and 2011 Cambridge University Press); panel **(d)** from ref 194 (Copyright 2021 American Association for the Advancement of Science); panel **(e)** from ref 198 (Copyright 2020 American Chemical Society); panel **(f)** from ref 199 (Copyright 2019 Wiley); and panel **(g)** from ref 215 (Copyright 2020 American Association for the Advancement of Science).

Other potential applications of reconfigurable surfaces based on magnetic pillar arrays have been proposed as well. As an example, creation of arrays of micropillars with different responses or reactivity to an applied field to enable selective deformation of the pillars, it has been shown that the micropillar arrays can be encoded or encrypted with designed patterns that are visible only under an applied magnetic field (**Figure 22e**).<sup>157,198</sup> Actively reconfigurable surfaces based on magnetic microplate arrays have also been applied to active camouflage by coloring each side of the arrayed microplates differently (**Figure 22f**).<sup>199</sup> Similarly, application of hydrophilic coating to one side and superhydrophobic coating to the other side of the arrayed microplates, it has also been shown that such a Janus-type microplate array can be used to create reconfigurable surfaces with magnetically switchable wettability.<sup>199</sup>

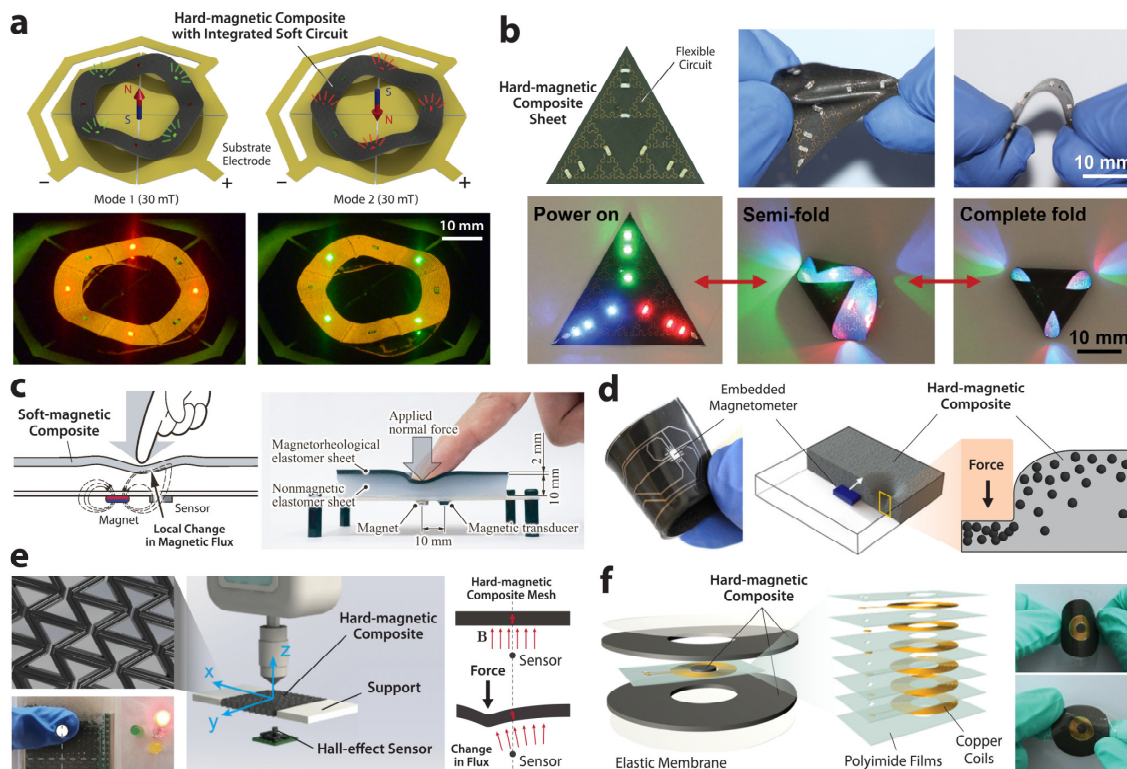
Instead of using reconfigurable micropillar arrays, it has also been shown that the surface of a magnetic soft composite sheet can be encoded with intricate magnetization patterns, which can be seen only under a magneto-optical sensor (**Figure 22g**),<sup>215</sup> using magnetic particles with low Curie temperature (e.g.,  $\text{CrO}_2$ ) along with the laser-assisted reprogramming technique discussed in **Section 4.3** to selectively demagnetize and remagnetize the embedded particles.

#### 6.1.4. Soft and Flexible Electronic Devices

Previously, magnetically guided self-assembling structures based on flexible planar substrates containing patches of magnetic soft composites and electronic components were shown to form 3D flexible electronic devices.<sup>211</sup> More recently, magnetic soft materials have been used to demonstrate magnetically reconfigurable soft/flexible electronic devices by integrating electronic components and circuitry into 3D-printed structures or molded sheets based on hard-magnetic soft composites with nonuniform magnetization patterns. Such soft devices exhibit different electronic functions that correspond to their deformed states under applied magnetic fields<sup>156</sup> (**Figure 23a**), where such a concept of functionally reconfigurable electronic devices was previously demonstrated by means of passive buckling of patterned flexible circuits upon the release of prestretched elastomer substrates,<sup>334</sup> or reconfigure themselves into different states through programmed shape changes to control light beams emitted from the attached LEDs<sup>335</sup> (**Figure 23b**). Magnetic soft composites with an integrated miniature magnetic sensor and circuitry have been proposed as a tactile sensor, which utilizes the



change in the measured magnetic flux density due to the change in the position and orientation of the embedded hard- or soft-magnetic filler particles under local deformations (**Figure 23c-e**).<sup>174,336-339</sup> Similarly, it has been shown that tactile or pressure sensors can be designed based on micropillar or microstructural arrays of hard-magnetic soft composites, either on top of a miniature magnetic sensor<sup>78,340</sup> or with a flexible coil between them,<sup>341</sup> to measure the change in magnetic flux during bending of the magnetized pillars upon the applied pressure. Magnetic soft materials have also been used to build a flexible vibration sensor by integrating pickup coils to measure the rate of change in the magnetic flux during the vibration of a substrate or an object onto which the sensor is mounted (**Figure 23f**).<sup>342</sup>



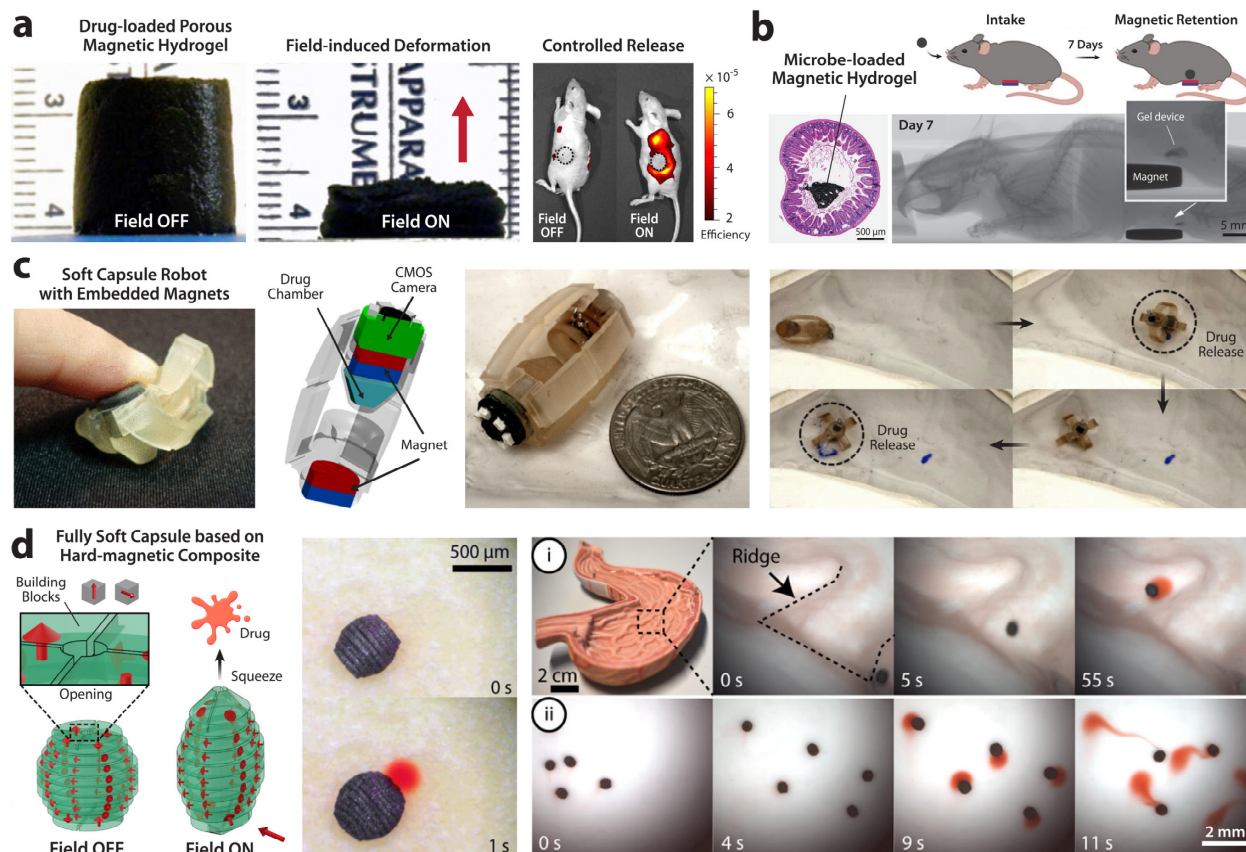
**Figure 23. Applications of magnetic soft materials for soft and flexible electronic devices.** (a) Magnetically reconfigurable soft electronic device based on 3D-printed hard-magnetic composite (**Figure 9b**) with an integrated soft circuit to exhibit different functions corresponding to its shapes under the applied fields. (b) Hard-magnetic composite with electroplated flexible (serpentine) circuits. Tactile sensors based on (c) soft-magnetic and (d) hard-magnetic composite sheets and (e) 3D-printed hard-magnetic composite mesh with integrated hall-effect sensors to measure the change in the magnetic flux density due to the change in the position and orientation of the embedded hard- or soft-magnetic filler particles under local deformations. (f) Flexible vibration sensor based on hard-magnetic composites with integrated flexible coils. Panel (a) is reproduced with permission from ref 156 (Copyright 2018 Springer Nature); panel (b) from ref 335 (Copyright 2021 Wiley); panel (c) from ref 336 (Copyright 2018 MDPI); panel (d) from ref 337 (Copyright 2019 Wiley); panel (e) from ref 174 (Copyright 2021 Elsevier); and panel (f) from ref 342 (Copyright 2020 Wiley).

## 6.2. Biomedical Applications

### 6.2.1. Targeted Delivery of Therapeutics

Magnetic microrobots have displayed great potential for localized delivery of therapeutics usually in the form of rigid carriers for drugs, cells, or genes.<sup>205,208,343-346</sup> As the cargo capacity of a single

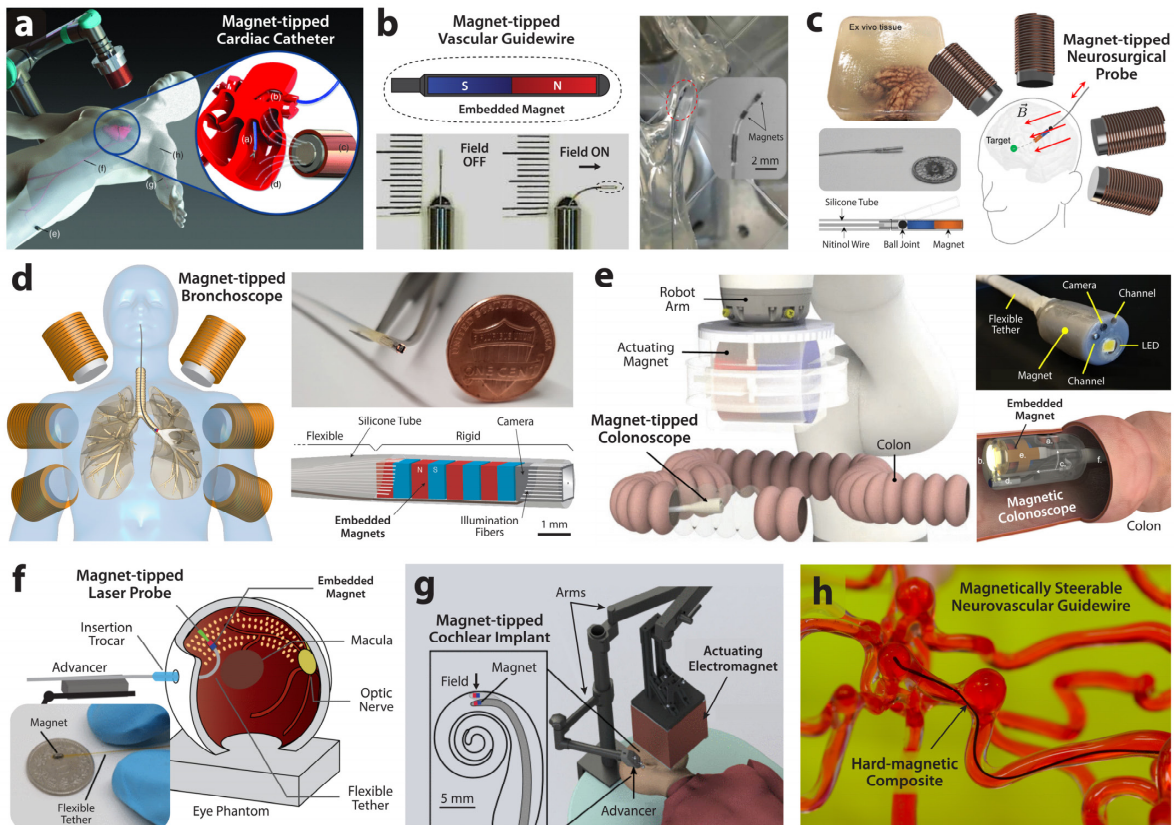
microrobot is limited, multiple robots are often employed as a swarm to improve the delivery performance.<sup>347</sup> At millimeter scales, shape-programmable magnetic soft robots have also been proposed for targeted drug or cell delivery. As an example, magnetically active porous hydrogels have been demonstrated as carriers for therapeutic agents, which can be released on demand as the scaffold deforms upon the application of magnetic fields (**Figure 24a**).<sup>60,93</sup> Magnetic hydrogels have also been used as carriers for diagnostic microbes for targeted transport and retention in gastrointestinal tract (**Figure 24b**).<sup>131</sup> Magnetically controlled capsule devices based on a flexible body with embedded magnets (**Figure 24c**) have demonstrated their capabilities for imaging, biopsy, and therapeutic delivery under magnetic control.<sup>23-25,348</sup> Magnetic capsule robots composed of fully soft materials have recently been demonstrated and are capable of rolling-based locomotion on rough surfaces (e.g., stomach wall) and release of the drugs by squeezing themselves under applied magnetic fields (**Figure 24d**).<sup>194</sup> The magnetically controlled release of therapeutic agents upon the deformation of the soft carriers has proven more effective and controllable than passive release based on molecular diffusion or cell migration.<sup>60,94</sup>



**Figure 24.** Applications of magnetic soft materials and robots for targeted delivery of therapeutics. (a) Macroporous magnetic hydrogel for on-demand drug or cell delivery based on field-induced deformation. (b) Microbe-loaded magnetic hydrogel device for magnetically controlled transport and retention in the gastrointestinal tract. (c) Magnetic soft capsule robot with embedded magnets for targeted drug delivery and endoscopic imaging. (d) Magnetic soft capsules based on microassembled hard-magnetic composites (**Figure 14d**) that roll under weak rotating magnetic fields and squeeze themselves under a strong field to release liquid drugs. Panel (a) is reproduced with permission from ref 60 (Copyright 2011 National Academy of Sciences); (b) from ref 131 (Copyright 2021 Wiley); (c) from ref 23 (Copyright 2012 IEEE); and (d) from ref 194 (Copyright 2021 American Association for the Advancement of Science).

## 6.2.2. Minimally Invasive Procedures

Magnetically steerable tethered devices in the form of magnet-tipped catheters or guidewires have been used for minimally invasive cardiac or vascular interventional procedures (**Figure 25a,b**),<sup>254-257</sup> utilizing the remotely controlled steering of the device based on the magnetic torque or force generated by the embedded magnet under externally applied actuating fields. The advances in hard-magnetic materials and manipulation platforms have facilitated the application of magnetically steerable devices in different types of minimally invasive surgery, which include stereotactic neurosurgical procedures for biopsy or deep brain stimulation (**Figure 25c**),<sup>349,350</sup> endoscopy for lung airway<sup>30</sup> or colon lumen<sup>248,249</sup> inspections (**Figure 25d,e**), eye surgery for treating retinal diseases or cataracts (**Figure 25f**),<sup>351-353</sup> robotic insertion of cochlear-implants (**Figure 25g**),<sup>309,354</sup> and endovascular navigation.<sup>31,288,355-357</sup> While the majority of magnetically steerable tethered devices utilize one or a few small magnets embedded in the distal portion, it has recently been shown that hard-magnetic soft composites can be used to realize sub-millimeter-scale magnetic soft continuum robots with omnidirectional steering and navigational capabilities (**Figure 25h**) for neuroendovascular applications.<sup>31,250,358</sup> When compared with the “magnet-tipped” design for conventional magnetically controlled intravascular devices, the “soft continuum” design based on soft composites with distributed magnetic particles can facilitate the miniaturization of the device while obviating the potential risks of embolization due to mechanical failure of the finite-sized magnet attached at the end of the device.<sup>31,288</sup>



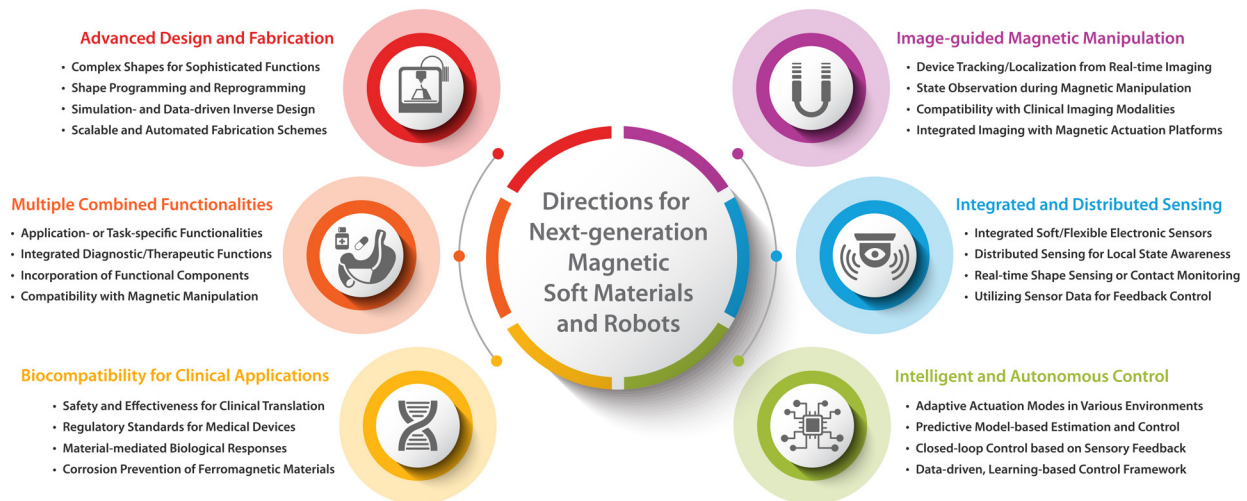
**Figure 25.** Applications of magnetic soft materials and robots for minimally invasive interventions. (a) Magnet-tipped catheters for cardiac applications, (b) magnet-tipped guidewires for endovascular navigation, (c) magnet-tipped flexible



needles for minimally invasive neurosurgical applications. Magnetically steerable endoscopes for **(d)** lung airway (i.e., bronchoscope) and **(e)** colon lumen (i.e., colonoscope) inspections based on flexible tethered devices with embedded finite-sized magnets. **(f)** Magnetically steerable laser probe for ophthalmic surgical applications to treat retinal diseases. **(g)** Magnet-tipped cochlear implants for magnetically controlled robotic insertion. **(h)** Magnetically steerable guidewires based on hard-magnetic soft composites for navigation in the complex neurovasculature. Panel **(a)** is reproduced with permission from ref 303 (Copyright 2018 IEEE); panel **(b)** from refs 254 and 355 (Copyrights 2006 Springer Nature and 2018 MDPI); panel **(c)** from ref 350 (Copyright 2021 IEEE); panel **(d)** from ref 30 (Copyright 2018 World Scientific Publishing); panel **(e)** from refs 248,249,359 (Copyrights 2019 IEEE, 2019 American Association for the Advancement of Science, and 2020 Springer Nature); panel **(f)** from ref 352 (Copyright 2019 IEEE); panel **(g)** from ref 309 (Copyright 2020 IEEE); and panel **(h)** from ref 31 (Copyright 2019 American Association for the Advancement of Science).

## 7. Considerations for Future Developments

Despite the recent progress in magnetic soft materials and robots and their demonstrated potential for future therapies, much work needs to be done to address remaining challenges in the design, fabrication, sensing, and control of magnetic soft robots. In the following section, we highlight underexplored areas of research in the field of magnetic soft materials and robots and suggest directions for future developments (**Figure 26**). We also discuss from clinical translation perspectives the biocompatibility of magnetic soft materials for their medical applications.



**Figure 26.** Future developments and research directions for next-generation magnetic soft materials and robots.

### 7.1. Advanced Design and Fabrication

As discussed in **Section 4.2**, the advances in fabrication techniques have increased the level of complexity in the design of magnetic soft materials and robots, enabling complex shape changes programmed by means of intricate magnetization patterns. Even for a single magnetic object that is not designed to morph into programmed shapes, the magnetization profile can play an important role in terms of enabling more sophisticated manipulation by increasing the number of controllable DOFs. As discussed earlier in **Section 5.1**, a uniformly magnetized object with axial symmetry has at most five controllable DOFs in free space, as the symmetry around the magnetization direction reduces one rotational DOF, and so do typical untethered magnetic objects such as magnetic capsule robots. Aimed at enabling more dexterous manipulation of magnetic objects, it has been shown that

the controllable DOFs of an untethered magnetic object can be increased to six by creating a complex magnetization pattern achieved from assembling a few pieces of composites with nonuniform magnetization into a single object.<sup>251,360</sup> In terms of fabrication, the magnetic 3D printing techniques discussed in **Section 4.2.2** can be used to build objects with such intricate magnetization patterns more easily.

When it comes to design, however, finding the required magnetization patterns to achieve the desired shape changes or functions can be nontrivial in many cases, especially when the geometry becomes complicated. For simple geometries such as beams or rods, numerical solutions of their governing equations based on the force and moment balances<sup>165,253</sup> can be used to find the optimal magnetization profile to program the desired shape.<sup>165</sup> For high-dimensional geometries with complex programmed shape changes, however, there is no unified framework for design, which has often relied on heuristic approaches based on trial and error. While finite element simulations based on the continuum mechanical models (see **Section 3.3**) can be used to find the equilibrium state when the object geometry and magnetization profile are given and the actuating magnetic field and boundary conditions are specified, solving the inverse problem is challenging. However, given that large quantities of data can be easily generated from finite element simulations for the forward problems, machine learning approaches can be used to solve the inverse-design problems by utilizing the collected data set for training learning networks, which have shown promising results in designing functional composite materials.<sup>358,361-363</sup> In doing so, the limitations of the existing fabrication methods discussed in **Section 4.2** will need to be considered, given that they are not without limitations in terms of their achievable level of complexity in the programmed magnetization pattern and the fabricated object geometry. In other words, advanced fabrication techniques to realize the optimized design should be developed in parallel to be able to leverage such learning-based design frameworks for next-generation magnetic soft materials and robots. As mentioned in **Section 4.2.3**, developing a scalable and automated fabrication method to realize 3D magnetization patterns in 3D structures will thus be an important area of future exploration.

## 7.2. Multiple Combined Functionalities

As shown in many examples discussed in **Section 6.2**, biomedical applications of magnetic soft materials and robots require additional functionalities for therapeutic or diagnostic purposes in addition to magnetic actuation and control for device manipulation and deployment. In some cases, some of the device functions can be directly achieved through the programmed shape changes of the device under magnetic actuation, as was the case with the soft capsule robots that can release drugs through squeezing action while deforming under an externally applied field (**Figure 24d**).<sup>194</sup> In many other cases, however, the magnetically driven transformation alone may not be sufficient to perform sophisticated diagnostic or therapeutic tasks. For example, a biopsy requires high enough forces to extract cells or tissues for sampling, which can be challenging for soft-bodied robots to generate or exert on the targeted tissue. One possible approach could be to incorporate magnetically controlled microneedles<sup>296</sup> or thermally activated microgrippers<sup>24</sup> inside the soft robot that can be delivered and released on demand at the targeted site to perform the biopsy task and safely retrieved.<sup>2</sup>

When compared with discrete systems based on one or a few finite-sized magnets incorporated into the robot's deformable body (**Figure 1a**), continuous systems based on soft composites with dispersed magnetic particles (**Figure 1b**) could offer greater flexibility in the design and fabrication of magnetic soft robots with multiple combined functionalities. In the field of intravascular or

endoluminal soft-robotic devices, for example, the magnetically steerable soft continuum robots for endovascular navigation (**Figure 25h**) have demonstrated an additional capability of steerable laser delivery by incorporating an optical fiber as a functional core inside the composite polymer jacket.<sup>31</sup> Since the actuating magnetic field does not affect the transmission of laser light through the optical fiber core, such devices could potentially be used for laser-assisted endovascular therapy such as laser atherectomy for removing plaque from blood vessels to treat obstructive vascular diseases. When the functional core is in the form of a fiber-optic shape sensor based on fiber Bragg grating (FBG) arrays,<sup>364</sup> real-time shape sensing and device tracking or localization could be realized for magnetically steerable soft continuum robots to enable feedback control.

### 7.3. Biocompatibility for Clinical Applications

While great potential of magnetic soft materials and robots for biomedical applications has been demonstrated in many proof-of-concept studies, as discussed in **Section 6.2**, much work is needed to ensure their safety and effectiveness for successful clinical translation. In the context of the regulatory process for medical devices, different levels of biocompatibility are required for the device materials depending on the level of interaction with the human body, considering the type and duration of contact with biological materials (e.g., tissues, cells, blood), following relevant standards such as the ISO 10993 series<sup>365-368</sup> and the related Food and Drug Administration (FDA) guidance<sup>369</sup> for 510(k) premarket notification or premarket approval (PMA) processes depending on the device classification for FDA regulatory pathways.

As mentioned earlier, iron oxide nanoparticles are considered biocompatible<sup>82-84</sup> and hence have been most commonly used for biomedical applications such as magnetic hyperthermia for cancer treatment. While common host polymers for magnetic soft materials and robots based on silicone or polyurethane elastomers and hydrogels are generally known to be biocompatible with no acute cytotoxicity,<sup>138,370-374</sup> ferromagnetic materials including iron and iron-based alloys can be cytotoxic due to their corrosive nature.<sup>375-377</sup> It has been shown from cell viability testing that, for relatively short-term (i.e., 24 hours) exposure to aqueous environments, magnetic soft composites based on silicone elastomers containing bare (uncoated) neodymium-iron-boron (NdFeB) microparticles are biocompatible,<sup>378</sup> which can be attributed to the fact that the particles are contained within the polymer matrix. For hydrogel-based composites, in which the uncoated NdFeB microparticles are directly exposed to the aqueous environment of the hydrogel matrix, it has been shown that 90% of cells can remain alive in a similar testing condition with short-term exposure (24 hours).<sup>137</sup> However, the particles will eventually become corroded residing in the aqueous environment for extended periods of time because the silicone elastomers are permeable to gas and water vapor, and the corrosion products can cause cytotoxic effects. For this reason, the anticorrosion coatings for magnetic particles (see **Section 2.3.1.2**) will be required for biomedical applications with long-term exposure to physiological environments such as tissue scaffolds or implantable devices. It has recently been reported that composites based on poly(vinyl alcohol) hydrogels and silica-coated NdFeB particles did not result in cytotoxic effects even when in contact with mammalian cells or living bacteria for several days.<sup>131</sup> Although uncoated samarium cobalt (SmCo) alloys have been reported to show a greater tendency for corrosion and cytotoxicity, when compared with uncoated NdFeB alloys, it has been shown that different types of anticorrosion coatings can be applied to make the material nontoxic.<sup>379,380</sup>

For clinical applications that involve contact of the device with circulating blood, such as the magnetically guided intravascular devices, hemocompatibility should also be evaluated to ensure that the device materials cause no adverse responses such as thrombosis, coagulation, hemolysis, and complement activation during their intended uses. For example, thrombosis on the robot can impede robotic functionality (e.g., increasing the mechanical rigidity) and may lead to distal tissue ischemia, while complement activation may not only render the robot nonfunctional but also cause systemic impacts due to the subsequent inflammatory response.<sup>381</sup> Material-mediated complement activation is a complex process that depends on multiple factors such as the physical and chemical properties of the material and the surface area and surface architecture of the device.<sup>369,382</sup> Further studies will be required to evaluate such material-mediated biological and physiological responses to evaluate both short-term and long-term systemic responses and thereby to ensure the safety of magnetic soft materials and robots for their applications to blood-contacting medical devices.

#### 7.4. Image-Guided Magnetic Manipulation

For magnetic capsule robots or magnet-tipped tethered devices for medical applications, whose size can range from a few millimeters to centimeters in terms of the device diameter, localization and tracking of the device have been obtained from internal or external sensing (e.g., embedded Hall-effect sensors and inertial measurement units<sup>247,249,383</sup> or externally arranged Hall-effect sensor arrays<sup>25,299,384-386</sup>) or real-time imaging (e.g., internal imaging using endoscopy cameras;<sup>30,359</sup> external imaging through optical or stereocameras,<sup>242,243,300,301</sup> x-ray fluoroscopy,<sup>249,387</sup> magnetic resonance imaging,<sup>287</sup> or ultrasound<sup>305</sup>). The state observation from device tracking and localization through real-time sensing or visual feedback through imaging allows for the implementation of closed-loop feedback control or learning-based, data-driven control<sup>386</sup> for intelligent magnetic manipulation. For small-scale magnetic soft robots, however, device tracking and localization for closed-loop control and advanced manipulation through internal or external sensing can be challenging due to their constrained size, and the state observation would rely mostly on the visual feedback from real-time external imaging.

When it comes to clinical applications of magnetic soft robots, such as for minimally invasive interventions, x-ray fluoroscopy could offer reliable real-time imaging for state observation of the device being manipulated inside the human body, because a device with distributed magnetic particles will be naturally visible under x-ray due to the presence of radiopaque magnetic particles. Another important point is that externally applied magnetic fields do not cause interference on x-ray imaging, which is why the commercialized magnetic manipulation systems (**Figures 17c** and **19c**) have been used along with a C-arm fluoroscope for real-time x-ray imaging. However, the fact that x-ray fluoroscopy provides only planar 2D projection imaging at a time implies that an integrated imaging and actuation platform will be needed to facilitate flexible and dexterous manipulation of magnetic soft robots in 3D environments. The C-arm fluoroscopy system has been evolving into essentially a multi-DOF robotic platform capable of automated rotation and angulation with flexible maneuverability for complex image-guided interventions. In this regard, we envision that next-generation magnetic manipulation platforms will have an integrated robotic imaging system that can be synchronized with magnetic actuation. However, the previously developed or existing magnetic manipulation systems are mostly based on either a pair of large permanent magnets (**Figures 17a**) or a set of multiaxial electromagnets (**Figures 19a-d**), for which the C-arm angulation and rotation is greatly limited due to the confined space between the magnets or electromagnetic coils.<sup>254</sup> When



compared with these relatively bulky systems, compact platforms based on a serial robot arm manipulator with a single actuating magnet at the end of its end-effector (**Figures 17a** and **19f**) could allow wider C-arm rotation angles for better state observation and hence suggest a cost-efficient alternative to the existing magnetic actuation and manipulation systems for clinical applications.

### **7.5. Integrated and Distributed Sensing**

Recent advances in soft electronic sensors and circuits based on semiconducting or conductive soft materials with percolating networks of conductive phases suggest potential for integration with magnetic soft robots for distributed sensing capabilities in the form of stretchable electronic skin<sup>7,111,388,389</sup> or integrated soft and flexible circuits in the soft-bodied robots<sup>390,391</sup>. The use of multi-material 3D printing would facilitate seamless integration of the sensing and actuating components, where the addition of the sensing elements should ideally not affect or sacrifice the actuation performance due to the additional mechanical resistance that needs to be overcome by magnetic torques or forces during actuation. In this light, highly compliant, stretchable conductive polymers or hydrogels based on poly(3,4-ethylenedioxythiophene) poly(styrene sulfonate) (PEDOT:PSS)<sup>392-394</sup> can be potentially useful for integration as sensing elements in small-scale magnetic soft robots, because of their lightness as well as good electrical performance. The sensory skin with distributed sensing elements can also be used to collect environmental signals such as temperature or pressure for monitoring and diagnosis purposes. In addition, given the absence of well-defined kinematics for soft-bodied robots, whose elastic deformation can involve virtually infinite DOFs, the advances in integrated or distributed sensing modalities will be conducive to developing better control strategies for magnetic soft robots. For example, the integrated or distributed sensing capabilities would allow for measuring mechanical strains for shape sensing or locating applied stresses for contact monitoring,<sup>395-397</sup> where the sensory feedback can provide local state awareness of the robot during the actuation or operation to realize autonomous or semiautonomous control of magnetic soft robots. Magnetic actuation coupled with such integrated and distributed sensing capabilities will further enable more effective control of the robot's dynamic interactions with the environment.

### **7.6. Intelligent and Autonomous Control**

For magnetic soft devices and robots with complex and continuous shape changes that involve a large number of DOFs, it can be even more difficult to use traditional control methods based on sensory feedback. Alternatively, a quantitative predictive model can be constructed from finite element simulations in the continuum mechanical framework and used for open-loop control of magnetic soft robots, particularly for quasi-static problems with negligible dynamic or inertial effects in relatively unrestricted environments with well-defined boundary conditions. However, when dynamic tasks are of concern or when operating in unstructured or constrained environments, learning-based control will offer an advantage over the model-based approach, provided that a sufficient amount of data can be generated and collected experimentally. It has recently been shown that a probabilistic learning approach can be applied to gait control of untethered small-scale magnetic soft robots to optimize locomotion performance with a relatively small amount of training data obtained from physical experiments.<sup>398</sup> Although not much work has been done in this direction thus far, this will be an important and promising area for future exploration toward the intelligent and autonomous control of magnetic soft robots. Collective efforts will be needed to develop more robust and effective control strategies for magnetic soft robots to turn their complex morphological properties into dexterous manipulation and sophisticated functions.

## 8. Concluding Remarks

There is rather long and checkered history of utilizing magnetism for medical applications,<sup>399</sup> including the magnetically guided tethered devices for vascular exploration and treatment.<sup>255,400-407</sup> Unfortunately, most of them have “faded into oblivion”<sup>408,409</sup> with no successful adoption. Fueled by recent advances in the development of materials design and fabrication techniques for magnetic soft materials, we are moving away from attaching small pieces of iron or magnets to such devices toward building actively reconfigurable soft-bodied robots capable of complex shape changes to enable more advanced and sophisticated functions. Over the past few years, we have seen many exciting advances and examples in the field of magnetic soft materials and robots that suggest great potential for many important applications including biomedical areas. While many of the advantages of magnetic soft materials and robots for biomedical applications are considered unique, there are still a number of challenges that remain to be overcome to make them widely adopted as practical tools for real-world applications, as discussed above. To avoid sharing the fate of their predecessors, magnetic soft materials and robots must go beyond materials development and proof-of-principle demonstrations through both fundamental and applied research focused on realizing the required level of complexity and performance in their functions for practical applications. To this end, a close collaboration among researchers in academia and industry with different expertise across diverse fields will be needed, given the multidisciplinary nature of this emerging field at the intersection of materials science, chemistry, physics, mechanics, robotics, and biomedicine.

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### Author Contributions

X.Z. and Y.K. conceived the topic and proposed the structure of this review. Y.K. carried out data curation and analysis, formulated the theories in the review, produced the figures, and wrote the manuscript in consultation with X.Z.

### Notes

The authors declare the following competing financial interest(s): Yoonho Kim and Xuanhe Zhao are inventors on patents and patent applications from Massachusetts Institute of Technology that describe fundamental principles and fabrication techniques for 3D-printed magnetic soft actuators and magnetically steerable soft continuum robots.

## Biographies

Yoonho Kim is a Ph.D. candidate in the Department of Mechanical Engineering at Massachusetts Institute of Technology (MIT). He earned his B.S. degree in mechanical and aerospace engineering from Seoul National University in 2013 and S.M. degree in mechanical engineering from MIT in 2016. His research focuses on the advanced fabrication, design, and mechanics of functional soft materials and applying them to medical robotics toward next-generation soft robots for biomedical applications. He is a recipient of 2019 Materials Research Society Graduate Student Gold Award and 2020-2021 MIT School of Engineering MathWorks Fellowship and is a Graduate Finalist of 2020 Collegiate Inventors Competition.

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