

# Dexterous magnetic manipulation of conductive non-magnetic objects

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Dexterous magnetic manipulation of ferromagnetic objects is well established, with three to six degrees of freedom possible depending on object geometry<sup>1</sup>. There are objects for which non-contact dexterous manipulation is desirable that do not contain an appreciable amount of ferromagnetic material but do contain electrically conductive material. Time-varying magnetic fields generate eddy currents in conductive materials<sup>2–4</sup>, with resulting forces and torques due to the interaction of the eddy currents with the magnetic field. This phenomenon has previously been used to induce drag to reduce the motion of objects as they pass through a static field<sup>5–8</sup>, or to apply force on an object in a single direction using a dynamic field<sup>9–11</sup>, but has not been used to perform the type of dexterous manipulation of conductive objects that has been demonstrated with ferromagnetic objects. Here we show that manipulation, with six degrees of freedom, of conductive objects is possible by using multiple rotating magnetic dipole fields. Using dimensional analysis<sup>12</sup>, combined with multiphysics numerical simulations and experimental verification, we characterize the forces and torques generated on a conductive sphere in a rotating magnetic dipole field. With the resulting model, we perform dexterous manipulation in simulations and physical experiments.

Magnetic manipulation has the benefit of being contactless, which is particularly attractive when there is a risk of destructive collision between the manipulator and target. Such is the case with space debris<sup>13,14</sup>, a considerable problem facing humanity owing to the Kessler syndrome<sup>15</sup>. Most artificial space objects are fabricated primarily from aluminium<sup>16</sup>, a non-magnetic but conductive material on which forces and torques can be generated by inducing eddy currents. The most commonly proposed application of this phenomenon is detumbling satellites by applying a static magnetic field to a rotating target. There exist numerical solutions for induced forces and/or torques on spinning solid and thin-walled spheres in uniform and non-uniform magnetic fields<sup>5–7</sup>. An alternative method of detumbling satellites uses rotating Halbach arrays near the target<sup>10</sup>. Rotating Halbach arrays have also been proposed as a means of traversing the exterior of the International Space Station (modelled as an infinite flat plate) using forces induced by eddy currents<sup>9</sup>. This technique is similar to that used in eddy-current separation of non-magnetic materials<sup>11</sup>. Methods based on eddy currents are distinct from those based on diamagnetism<sup>17</sup> or ferrofluid environments<sup>18</sup>, neither of which are applicable to manipulation of objects at a distance.

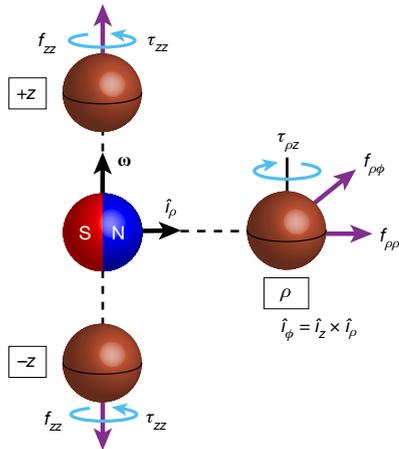
Here we show that dexterous manipulation of conductive objects is achievable using multiple static (in position) magnetic dipole-field sources capable of continuous dipole rotation about arbitrary axes. We demonstrate manipulation with six degrees of freedom (6-DOF manipulation) in numerical microgravity simulations and 3-DOF manipulation in experimental microgravity simulations. This manipulation does

not rely on dynamic motion of the conductive object itself; rather, the manipulation can be performed quasistatically. Both electromagnet and permanent-magnet devices have been developed to serve as field sources capable of generating continuously rotating magnetic dipole fields about arbitrary axes<sup>19,20</sup>. Rotating magnetic dipole fields have been used previously to remotely actuate ferromagnetic devices that transduce the resulting magnetic torque into some form of rotational motion, such as micromachines and magnetic capsule endoscopes<sup>1</sup>.

To make our problem tractable, we explicitly consider conductive spheres, which can serve as first-order approximations for other geometries. Furthermore, we characterize those spheres in three canonical positions relative to a rotating magnetic dipole, as depicted in Fig. 1. Using cylindrical coordinates, the  $z$ -axis aligns with the angular-velocity vector  $\boldsymbol{\omega}$  of the rotating dipole, with the dipole always orthogonal to that vector. We consider positions in the  $\pm z$  axial directions and the radial direction  $\rho$ . When using a magnetic dipole-field source capable of dipole rotation about arbitrary axes, any given position can be transformed into each of these canonical positions through the choice of the dipole rotation axis. The magnetic dipole can be abstracted as a point dipole  $\mathbf{m}$  (units  $\text{A m}^2$ ) at position  $\mathcal{P}_{\mathbf{m}}$ , which generates a magnetic field vector  $\mathbf{b}$  (units T) at each position  $\mathcal{P}_{\mathbf{b}}$  in space:

$$\mathbf{b} = \frac{\mu_0}{4\pi\|\mathbf{d}\|^3} \left( \frac{3\mathbf{d}\mathbf{d}^T}{\|\mathbf{d}\|^2} - I \right) \mathbf{m} \quad (1)$$

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**Fig. 1 | Induced forces and torques on a conductive sphere in three canonical positions relative to a rotating magnetic dipole.** The dipole is spinning with angular velocity  $\omega$ . Force and torque arrows are shown for all non-negligible components, with arrowheads depicting the actual directions corresponding to the  $\omega$  shown.

where  $\mathbf{d} = \mathcal{P}_b - \mathcal{P}_m$  is the relative displacement vector (units m),  $I$  is the identity matrix,  $\mu_0 = 4\pi \times 10^{-7} \text{ N A}^{-2}$  is the permeability of free space, and all vectors are expressed in a common frame of reference<sup>1</sup>.

We begin by characterizing the steady-state time-averaged forces and torques, in each of the canonical positions, as a function of the six independent variables enumerated in Table 1. These quantities collectively comprise four dimensions: N, m, s and A. The Buckingham  $\Pi$  theorem tells us that the underlying physics describing each of the two dependent variables, force and torque, can be characterized using just three dimensionless  $\Pi$  groups<sup>12</sup>, with  $\Pi_0$  expressed as a function of  $\Pi_1$  and  $\Pi_2$  (see Table 1 and Supplementary Information 1). The Buckingham  $\Pi$  theorem does not tell us anything about the form of these equations; that requires empirical characterization.

To derive functions that characterize eddy-current-induced forces and torques at  $\pm z$  and  $\rho$ , we conducted electromagnetic finite-element-analysis (FEA) simulations using Ansys Maxwell software across a range of parameters (see Fig. 2a and Supplementary Information 2). It is from this FEA that we determined the non-negligible force and torque components shown in Fig. 1. We confirmed the expected symmetry of the  $\pm z$  configurations, in which the force acts to push the sphere away from the rotating dipole, and the torque acts to rotate the sphere in the same direction as  $\omega$ . At the  $\rho$  configuration, one component of the force pushes the sphere away from the rotating dipole, another component pushes the sphere in the  $\hat{i}_\phi = \hat{i}_z \times \hat{i}_\rho$  direction, and the torque acts to rotate the sphere opposite to  $\omega$ .

When visualizing the resulting non-dimensional  $\Pi$  groups (see Fig. 2b and Supplementary Information 3), we observed that at relatively far distances ( $\Pi_2 > 1.5$ , approximately), the relationship between  $\log_{10}(\Pi_0)$  and  $\log_{10}(\Pi_2)$ , for a given  $\Pi_1$ , is accurately described by a linear model, with a slope of  $-6$  for torques and  $-7$  for forces (these values are analogous to what is expected from magnetic torques and forces imparted by a magnetic dipole on a soft-magnetic object), and with an intercept that is a function of  $\Pi_1$ . The final unified model is of the form

$$\Pi_0 = \frac{(c_d \Pi_1)^{c_1} \Pi_1^{c_2} 10^{c_3}}{\Pi_2^{c_4}} \quad (2)$$

The model coefficients  $c_1$  to  $c_4$ , determined through least-squares regression, are provided for ‘FEA’ in Supplementary Table 2

**Table 1 | Induced force and torque, and the six independent parameters that affect them**

Parameter	Units	$\Pi$ group
Force induced on sphere	$f$ N	$\Pi_0 = f r^4 \mu^{-1} m^{-2}$
Torque induced on sphere	$\tau$ N m	$\Pi_0 = \tau r^3 \mu^{-1} m^{-2}$
Sphere electrical conductivity	$\sigma$ $\text{N}^{-1} \text{m}^{-2} \text{s A}^2$	$\Pi_1 = \sigma \mu \omega r^2$
Distance from dipole to sphere	$d$ m	$\Pi_2 = d r^{-1}$
Sphere radius	$r$ m	
Dipole strength	$m$ $\text{A m}^2$	
Frequency of dipole rotation	$\omega$ $\text{s}^{-1}$ (Hz)	
Environment magnetic permeability	$\mu$ $\text{N A}^{-2}$	

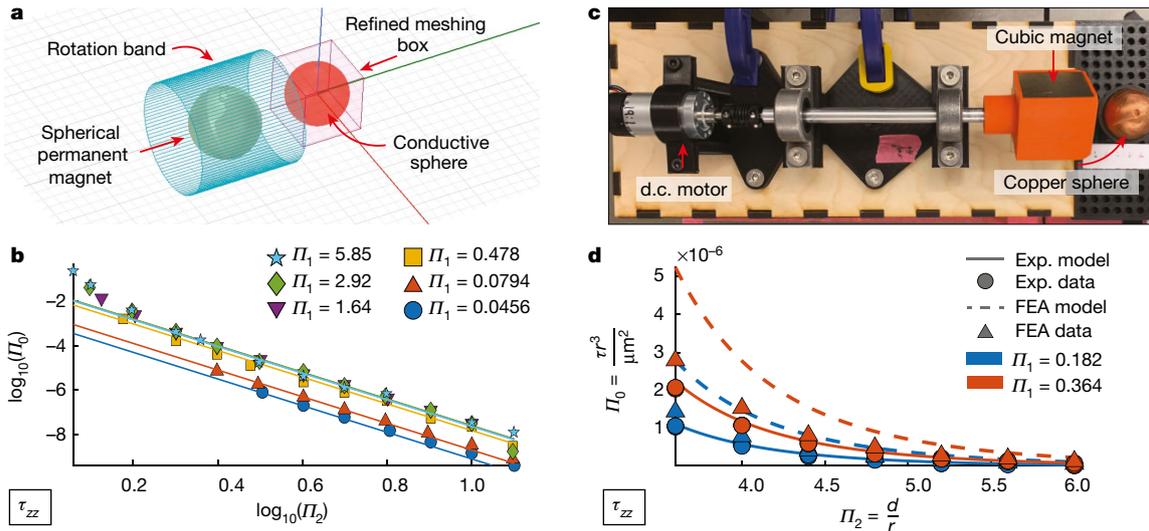
of Supplementary Information 3. This model, although empirically determined, is well behaved in the sense that  $\Pi_0 \rightarrow 0$  (that is,  $f \rightarrow 0$  or  $\tau \rightarrow 0$ ) as  $\Pi_1 \rightarrow 0$  (for example, as  $\omega \rightarrow 0$  or  $\sigma \rightarrow 0$ ) or as  $\Pi_2 \rightarrow \infty$  (for example, as  $d \rightarrow \infty$ ), as expected from first principles. At relatively close distances, this model underpredicts the data, making the model conservative.

Next, we experimentally verified the model described above with an experimental set-up comprising a cubic NdFeB permanent magnet rotated by a direct-current (d.c.) motor, a solid copper sphere mounted on a 6-DOF force-torque sensor, and a 3D-printed pegboard that enables the copper sphere to be placed in the three configurations of interest (see Fig. 2c and Supplementary Information 4). A sample of the resulting data with regression models is presented in Fig. 2d. Using the complete experimental data set, we fit the model of equation 2, with the resulting coefficients provided under ‘Experiments’ in Supplementary Table 2 of Supplementary Information 3.

As we compare the experimental and FEA results across configurations and force-torque components, we find good agreement in the overall trends. The FEA-based model tends to overpredict the experimental values of  $\Pi_0$  by a factor of 1.5–5.5. This discrepancy could be due to impurities in the copper sphere or from using a cubic permanent magnet. However, field distortions from a cubic magnet relative to a point-dipole model are typically less than 5% in our region of implementation<sup>21</sup>. It has also been previously noted that Ansys Maxwell tends to overpredict experimental results in similar situations<sup>10</sup>. Considering these factors, we suggest using the experiment-based model as a lower bound and the FEA-based model as an upper bound for  $\Pi_0$ . Extrapolating the model beyond the values of  $\Pi_1$  and  $\Pi_2$  considered should be done with caution.

We now describe a framework for using the force-torque model developed above to perform dexterous manipulation with magnetic-dipole sources surrounding the conductive object of interest. This can take the form of stationary or mobile permanent magnets or electromagnets. Here, we focus exclusively on the case of stationary electromagnets, in which both  $m$  and  $\omega$  can be controlled, but with their respective maximum values coupled due to the low-pass-filtering effect of induction. We treat  $m$  and the direction of  $\omega$  as the control variables and simply use a constant angular-velocity magnitude  $\omega$ . We assume  $n$  electromagnetic dipole-field sources, with the  $i$ th source located at position  $\mathcal{P}_{ei}$  and having an orientation described by a rotation matrix  ${}^w R_{ei}$  with respect to some world frame<sup>22</sup>. We assume a single conductive object located at position  $\mathcal{P}_c$  and having an orientation described by  ${}^w R_c$  and a displacement vector  $\mathbf{d}_i = \mathcal{P}_c - \mathcal{P}_{ei}$  with respect to each source.

To use the model in equation 2, we recast forces and torques in the forms  $f = \Pi_0 r^{-4} \mu_0 m^2$  and  $\tau = \Pi_0 r^{-3} \mu_0 m^2$ , respectively. Each source is given a model frame, described by a relative rotation matrix  ${}^{ei} R_{mi}$ , defined such that its  $z$ -axis is parallel to  $\mathbf{d}_i$ . In the  $\pm z$  configurations,  $\omega$  is parallel or antiparallel to the model-frame  $z$ -axis, and in the  $\rho$  configuration  $\omega$  is any vector orthogonal to the  $z$ -axis, with the



**Fig. 2 | Typical numerical and experimental results for force-torque characterization.** For clarity, only a subset of the data for a single component  $\tau_{zz}$  is shown. **a**, Rendering of FEA simulation. **b**, FEA data with unified regression

ambiguity expressed as a rotation about the  $z$ -axis by some  $\gamma$  using a rotation matrix  $\text{Rot}_z(\gamma)$ . Each source then has three discrete actions ( $a \in \{1, 2, 3\}$ , respectively) that can be performed on the conductive object, where each action is a specific force-torque wrench with a controllable magnitude:

$$\begin{bmatrix} w_f \\ w_\tau \end{bmatrix} \in m^2 \begin{bmatrix} {}^w R_{mi} & 0 \\ 0 & {}^w R_{mi} \end{bmatrix} \left\{ \begin{array}{l} \tilde{f}_{zzi} \\ 0 \\ 0 \\ \tilde{\tau}_{zzi} \end{array} \right\}, \begin{bmatrix} \tilde{f}_{zzi} \\ 0 \\ 0 \\ -\tilde{\tau}_{zzi} \end{bmatrix} \left[ \begin{array}{cc} \text{Rot}_z(\gamma) & 0 \\ 0 & \text{Rot}_z(\gamma) \end{array} \right] \left\{ \begin{array}{l} 0 \\ -\tilde{f}_{\rho\phi i} \\ \tilde{f}_{\rho\phi i} \\ -\tilde{\tau}_{\rho z i} \\ 0 \\ 0 \end{array} \right\} \quad (3)$$

where  ${}^w R_{mi} = {}^w R_{ei} {}^{ei} R_{mi}$  and the tilde operator (-) indicates the respective force-torque value when  $m = 1$ .

With  $n$  sources, there are  $3n$  possible actions, with  $m$  and  $\gamma$  as the control variables in general. Analogous to magnetic manipulation of soft-magnetic objects, superposition does not apply here, so we implement these actions one at a time, for a brief duration of time. To get as close as possible to the desired wrench, we solve the following constrained optimization problem:

$$\begin{aligned} & \arg \min_{i,a,m,\gamma} \left\| \begin{bmatrix} w_{f_{des}} \\ w_{\tau_{des}} \end{bmatrix} - \begin{bmatrix} w_f \\ w_\tau \end{bmatrix} \right\|_Q^2 \\ & \text{subject to} \\ & i \in \{1, \dots, n\}, \quad a \in \{1, 2, 3\}, \quad m \in [0, m_{\max}], \\ & \gamma \in [-\pi, \pi] \end{aligned} \quad (4)$$

where the  $Q$ -norm enables relative weighting between force and torque (that is, relative penalties on position error versus orientation error). We efficiently find the optimal inputs using a parallelized, gradient-based solver.

We first validated our manipulation framework in a numerical simulation of microgravity in which six dipole-field sources surround and dexterously manipulate a copper sphere (see Supplementary

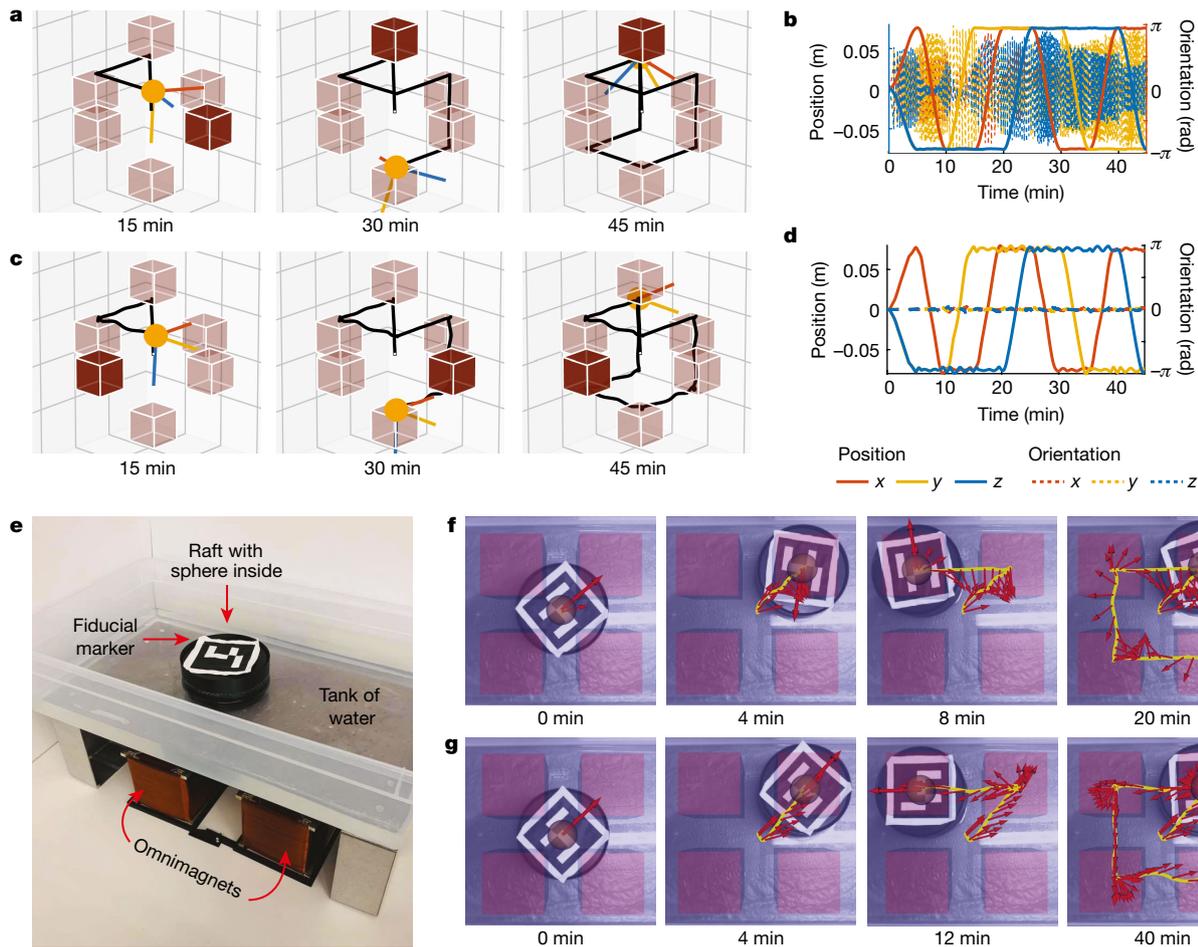
model. **c**, Top view of experimental set-up. **d**, Experimental data with unified regression model. Unified FEA regression model with new FEA data not included in the training set.

Information 6). We performed 3-DOF position control, with and without 3-DOF orientation control (see Fig. 3a–d). Experimental validation was then performed using Omnimagets<sup>19</sup>, which are designed to serve as approximate dipole-field sources, each comprising three co-located and mutually orthogonal electromagnets. A copper sphere floated in a raft in a container of water above four Omnimagets (see Fig. 3e and Supplementary Information 7), serving as an Earth-based microgravity simulator with 3-DOF mobility in a horizontal plane. We performed 2-DOF position control, with and without 1-DOF orientation control (see Fig. 3f, g).

With our proposed method, 6-DOF manipulation of conductive non-magnetic spheres is achievable. In contrast, 6-DOF manipulation of ferromagnetic objects is only possible for complex geometries<sup>23</sup>, with 5-DOF typical of most simple geometries and only 3-DOF achievable for soft-magnetic spheres<sup>1</sup>. The forces and torques generated using the proposed method are likely to be orders of magnitude smaller than those generated using ferromagnetism with comparable parameters, as indicated by the relatively slow manipulation demonstrations of Fig. 3, but they enable manipulation of objects that ferromagnetic methods do not (further discussion in Supplementary Information 8).

Manipulation with six DOF of ferromagnetic objects can be accomplished using eight static electromagnets<sup>24,25</sup>, or eight permanent magnets at fixed positions with each having the ability to rotate about an axis orthogonal to its dipole axis<sup>26</sup>. Our numerical simulations showed that six rotating-dipole sources is sufficient for 6-DOF manipulation of conductive spheres; however, this number should not be assumed to be necessary. Since all wrenches have a repulsive force component, when manipulating an unconstrained object, the sources must surround the object to some degree. Analysing the manipulability of different numbers and arrangements of sources is left as an open problem.

In terms of modelling, thus far we have only considered solid spheres. A natural next step would be to consider hollow spheres and other simple geometric objects (such as cuboids or cylinders), which is likely to require more complicated models. It is unclear whether the best approach will be to explicitly model these objects or whether the sphere model can be used in conjunction with learning-based approaches for control. Although we have shown that a simplified approach using canonical positions and actuating one dipole-field source at a time is sufficient to perform dexterous manipulation,



**Fig. 3 | Dexterous manipulation of a copper sphere in simulated microgravity.** See Supplementary Videos 1–4. **a, b**, Numerical simulation with 3-DOF position control along the edges of a cube (the black line is the path taken) and uncontrolled orientation using six dipole field sources (brown cubes, with the highlighted cube indicating the active source at the given instant; **a**), with the resulting 6-DOF pose (**b**). **c, d**, Numerical simulation with

6-DOF position and constant-orientation control (**c**), with the resulting 6-DOF pose (**d**). **e**, Experimental set-up with a copper sphere in a raft on water over four Omnimagnets. **f**, Experiments with 2-DOF position control along the edges of a square and uncontrolled orientation (the yellow line is the path taken, and red arrows depict the orientation). **g**, Experiments with 2-DOF position control and 1-DOF orientation control, with sharp turns at the corners.

it is probably suboptimal. A general wrench model for arbitrary sphere positions relative to the rotating dipole, and understanding the nonlinear nature of superposition, are both left as open problems.

**Online content**

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at <https://doi.org/10.1038/s41586-021-03966-6>.

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# Article

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## Data availability

All data generated and scripts for analyses during this study are included in the published article and can be found using the following link: <https://osf.io/uk3rx/>.

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**Author contributions** J.J.A. and T.H. proposed the research. All authors participated in the planning of the article. L.N.P. and J.J.A. performed the dimensional analysis and designed the experiments to characterize force-torque. L.N.P. and J.L.B.A. performed the numerical simulations to characterize force-torque. G.F.T. and T.H. designed the numerical microgravity manipulation simulator and control scheme, and integrated the controller into the

experimental manipulation system. L.N.P., G.F.T. and A.P. designed and performed the manipulation experiments. L.N.P., G.F.T. and J.J.A. drafted the manuscript. All other authors performed a critical revision.

**Competing interests** J.J.A. has patents and patents pending on electromagnet and permanent-magnet devices designed to generate rotating magnetic dipole fields. The other authors declare no competing interests.

## Additional information

**Supplementary information** The online version contains supplementary material available at <https://doi.org/10.1038/s41586-021-03966-6>.

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1           Dexterous Magnetic Manipulation of Conductive  
2           Non-magnetic Objects: Supplementary Information

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# 1 Dimensional Analysis

When using the Buckingham  $\Pi$  theorem to characterize induced force  $f$  (units N) in a given canonical position, we first enumerate the independent variables that may affect force: the radius of the conductive sphere  $r$  (units m); the magnitude of the dipole  $m = \|\mathbf{m}\|$  (units A·m<sup>2</sup>); the magnitude of the angular velocity of the dipole  $\omega = \|\boldsymbol{\omega}\|/(2\pi)$  (which we chose to represent in units Hz rather than units rad/s typical of  $\boldsymbol{\omega}$ ); the permeability of the environment  $\mu$  (units N·A<sup>-2</sup>); the distance from the dipole to the center of the conductive sphere  $d = \|\mathbf{d}\|$  (units m), and the conductivity of the sphere  $\sigma$  (units S·m<sup>-1</sup> = N<sup>-1</sup>·m<sup>-2</sup>·s·A<sup>2</sup>). Thus, there are seven parameters describing the problem (one dependent and six independent). These quantities collectively comprise four dimensions (m, N, s, A), as described in Table 1. The Buckingham  $\Pi$  theorem tells us that the number of parameters, 7, minus the number of dimensions, 4, equals the number of dimensionless  $\Pi$  groups, 3, that can be used to characterize the underlying physics of the system. Our choice of  $\Pi$  groups is provided in Table 1. These  $\Pi$  groups are not unique, but we can check that our proposed  $\Pi$  groups are valid by constructing two matrices. The first is a matrix  $A$  where each row corresponds to a dimension, each column corresponds to a parameter, and each element contains the power of the dimensions in the respective parameters. The second is a matrix  $B$  where the rows correspond to the parameters (ordered as in  $A$ ), each column corresponds to a  $\Pi$  group, and each element contains the power of the parameters in the respective  $\Pi$  groups. A valid set of  $\Pi$  groups is one in which  $B$  has full column rank and  $AB$  is a zero matrix:

$$A = \begin{matrix} & f & r & m & \omega & \mu & d & \sigma \\ \text{m} & 0 & 1 & 2 & 0 & 0 & 1 & -2 \\ \text{N} & 1 & 0 & 0 & 0 & 1 & 0 & -1 \\ \text{s} & 0 & 0 & 0 & -1 & 0 & 0 & 1 \\ \text{A} & 0 & 0 & 1 & 0 & -2 & 0 & 2 \end{matrix} \Bigg], \quad B = \begin{matrix} & \Pi_0 & \Pi_1 & \Pi_2 \\ f & 1 & 0 & 0 \\ r & 4 & 2 & -1 \\ m & -2 & 0 & 0 \\ \omega & 0 & 1 & 0 \\ \mu & -1 & 1 & 0 \\ d & 0 & 0 & 1 \\ \sigma & 0 & 1 & 0 \end{matrix} \Bigg] \quad (\text{S1})$$

The process used for induced force is repeated for induced torque  $\tau$  (units N·m), with changes only to

33 column 1 of  $A$  and column 1 of  $B$ :

$$\begin{array}{c}
 \text{m} \\
 \text{N} \\
 \text{s} \\
 \text{A}
 \end{array}
 A = \begin{array}{c}
 \tau \quad r \quad m \quad \omega \quad \mu \quad d \quad \sigma \\
 \left[ \begin{array}{ccccccc}
 1 & 1 & 2 & 0 & 0 & 1 & -2 \\
 1 & 0 & 0 & 0 & 1 & 0 & -1 \\
 0 & 0 & 0 & -1 & 0 & 0 & 1 \\
 0 & 0 & 1 & 0 & -2 & 0 & 2
 \end{array} \right]
 \end{array}
 , \quad
 B = \begin{array}{c}
 \tau \\
 r \\
 m \\
 \omega \\
 \mu \\
 d \\
 \sigma
 \end{array}
 \begin{array}{c}
 \Pi_0 \quad \Pi_1 \quad \Pi_2 \\
 \left[ \begin{array}{ccc}
 1 & 0 & 0 \\
 3 & 2 & -1 \\
 -2 & 0 & 0 \\
 0 & 1 & 0 \\
 -1 & 1 & 0 \\
 0 & 0 & 1 \\
 0 & 1 & 0
 \end{array} \right]
 \end{array}
 \quad (\text{S2})$$

34 In the case of a permanent magnet, the dipole strength will be a product of the volume of the magnet  
 35 and the average magnetization of the material. In the case of an electromagnet, the dipole strength will be  
 36 a function of applied electrical current, and can often be modeled as linear with respect to current [1]. In  
 37 both cases, the distance  $d$  is measured from the center of the magnet to the center of the conductive sphere.

38 Although the magnetic permeability of the environment,  $\mu$ , is an independent variable in general, in  
 39 practice it will always be the permeability of free space,  $\mu = \mu_0$ . If we were to consider special cases in  
 40 which the interstitial space is filled with a magnetic material such as a ferrofluid [2], forces imparted by the  
 41 environment would likely dominate the eddy-current-induced forces of interest here.

42 The Buckingham  $\Pi$  theorem tells us that the maximum number of dimensionless terms that will be  
 43 required to characterize the physics of our problem, but it does not necessarily tell us the minimum number.  
 44 In some cases, dimensionless  $\Pi$  groups can be further combined to form new dimensionless groups. We  
 45 hypothesized that it may be possible to express the dimensionless quantity  $\Pi_0/\Pi_1$  as a function of a single  
 46 dimensionless independent variable  $\Pi_2$ .

47 This hypothesis was derived from the hypothesis that both  $f$  and  $\tau$  would be linear with respect to  $\omega$ .  
 48 However, during the numerical studies described in Supplementary Information 2, we determined that this  
 49 hypothesis was not correct.

## 50 2 Numerical Characterization of Force and Torque

51 In this section we describe how to setup the finite-element-analysis (FEA) program Ansys Electronics  
52 Desktop 2019 R2 Maxwell, in order to simulate the eddy-current-induced forces and torques on conductive  
53 copper and aluminum spheres due to a rotating magnetic dipole. The order described below is in the same  
54 order as they would appear in the “Project Manager”. Once the setup is performed for each configuration,  
55 force-torque data can be obtained by performing “Analysis All”. A total of 642 FEA simulations were  
56 performed for all parameters outlined in Table S1. Using these FEA simulations we determined the non-  
57 negligible force and torque components shown in Fig. 1.

58 **Solution Type:** In order to perform transient analysis with a rotating dipole source, one has to go to  
59 “Maxwell 3D”, select “Solution Type” and choose “Transient”.

60 **3D Components:** Using Coordinate System = Global, we modeled the magnetic dipole source as a spheri-  
61 cal NdFeB grade-N48 rare-earth magnet. When building the spherical magnet, it has the following model  
62 properties: Command = Create Sphere, Coordinate System = Global, Center Position = [0, 0, 0] (all model  
63 coordinates are provided in units of millimeters). The center of the sphere should be located at the center  
64 of the Global coordinate system. The material property for the spherical magnetic dipole has the following  
65 material properties: Relative Permeability  $\mu_m/\mu_0 = 1.04$ , Bulk Conductivity  $\sigma = 714286$  S/m, Magnetic  
66 Coercivity  $H_{cm} = 1055931$  A/m (in Ansys this is entered as a negative value), Core Loss = None, Com-  
67 position = Solid, Mass Density =  $7550$  kg/m<sup>3</sup>, Young’s Modulus = Undefined, Poisson’s ratio = Undefined,  
68 and Thermal Modifier = None. The radius of the magnet was determined to achieve the desired dipole  
69 strength  $m$ , which is equal to the product of the remanent magnetization  $M_r$  and the volume of the sphere.  
70 The magnetization model used is depicted in Fig. S1. From this model, we see that we can compute  
71  $M_r = H_{cm}\mu_m/\mu_0$ . Also note that the default magnetization in Ansys is in the  $x$  direction.

72 To enable the dipole-source rotation, a regular polyhedron was created surrounding the magnet with the  
73 following model properties: Coordinate = Global, Center Position = [0, -45, 0], Start Position [0, 0, 0], Axis  
74 = Y, Height = 90, and Number of Segments = 100.

75 To model the conductive sphere, a new coordinate system was created, which enables all relative  
76 sphere components to move together and enables output force-torque values to be referenced relative to  
77 the conductive-sphere frame. The model for the conductive sphere has the following properties: Command

Copper: $\sigma = 5.8 \times 10^7$ S/m						Aluminum: $\sigma = 3.8 \times 10^7$ S/m					
$m$ (A·m <sup>2</sup> )	$r$ (mm)	$\omega$ (Hz)	$d$ (mm)	$\Pi_1$ —	$\Pi_2$ —	$m$ (A·m <sup>2</sup> )	$r$ (mm)	$\omega$ (Hz)	$d$ (mm)	$\Pi_1$ —	$\Pi_2$ —
104	25	1	80	0.0456	3.20	208	40	1	100	0.0794	2.50
		2.5	100	0.114	4.00			2	125	0.153	3.12
		5	125	0.228	5.00			4	160	0.306	4.00
		10	160	0.456	6.40			6	200	0.458	5.00
		20	200	0.911	8.00			8	250	0.611	6.25
		30	250	1.37	10.0			10	315	0.764	7.88
		40	315	1.82	12.6			12	400	0.917	10.0
		50		2.28				14	500	1.07	12.5
		60		2.73				16		1.23	
		70		3.19				18		1.38	
80		3.64		20		1.52					
90		4.10									
100		4.56									
312	150	1	200	1.64	1.33	208	100	1	150	0.478	1.50
		2	230	3.28	1.53			2	200	0.955	2.00
		3	300	4.92	2.00			4	250	1.91	2.50
		4	375	6.56	2.50			6	300	2.87	3.00
		5	475	8.20	3.17			8	400	3.82	4.00
		6	600	9.94	4.00			10	500	4.77	5.00
		7	750	11.5	5.00			12	630	5.73	6.30
		8	950	13.1	6.33			14	800	6.69	8.00
		9	1200	14.8	8.00			16	1000	7.64	10.0
		10	1500	16.4				18	1250	8.60	12.5
				20		9.55					
104	200	1	250	2.92	1.25	312	350	1	400	5.85	1.14
		1.5	315	4.37	1.57			1.25	440	7.31	1.25
		2	400	5.83	2.00			1.5	550	8.77	1.57
		2.5	500	7.29	2.50			1.75	700	10.2	2.00
		3	630	8.75	3.15			2	880	11.7	2.51
		3.5	800	10.2	4.00			2.25	1100	13.2	3.14
		4	1000	11.7	5.00			2.5	1400	14.6	4.00
		4.5	1250	13.1	6.25			2.75	1750	16.1	5.00
		5	1600	14.6	8.00			3	2200	17.5	6.29
		5.5	2000	16.0	10.0			3.25	2780	19.0	7.94
6	2500	17.5	12.50	3.5	3500	20.5	10.00				
					4400		12.6				

Table S1: **Summary of FEA parameters for force and torque characterization.** For each combination of  $\sigma$ ,  $m$ , and  $r$ , a set of  $\omega$  were tested, and at each  $\omega$  a set of  $d$  were tested. This resulted in a variety of  $\Pi_1$  values, and at each  $\Pi_1$  value a variety of  $\Pi_2$  values. These same values were used for both the  $z$  and  $\rho$  configurations.

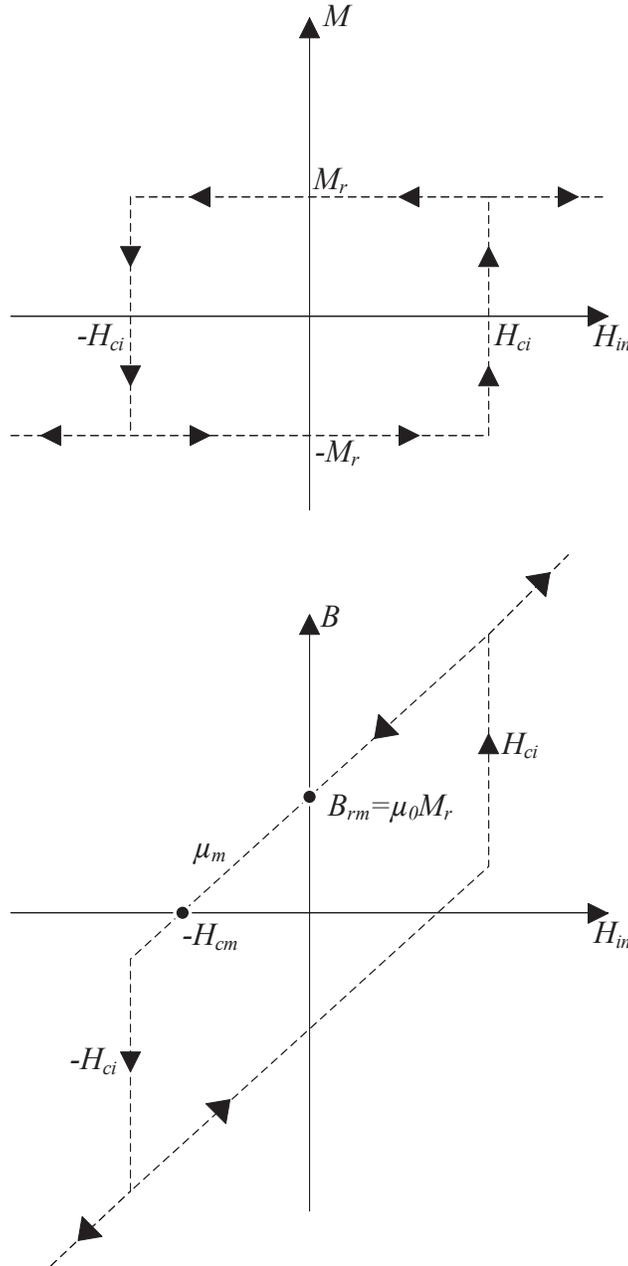


Figure S1: **Magnetization model for permanent magnets used in Ansys Maxwell.**  $H_{in}$  is the internal field in the material (units  $\text{A}\cdot\text{m}^{-1}$ ),  $H_{ci}$  is the coersive internal field in the material (units  $\text{A}\cdot\text{m}^{-1}$ ),  $H_{cm}$  is the magnetic coersivity (units  $\text{A}\cdot\text{m}^{-1}$ ),  $M$  is the magnetization (units  $\text{A}\cdot\text{m}^{-1}$ ),  $M_r$  is the remanent magnetization (units  $\text{A}\cdot\text{m}^{-1}$ ),  $B$  is the flux density (units T),  $B_r$  is the remanent flux density (units T), and  $\mu_0$  is the permeability of free space (units  $\text{N}\cdot\text{A}^{-2} = \text{T}\cdot\text{m}\cdot\text{A}^{-1}$ ).

78 = Create Sphere, Coordinate System = Sphere, Center Position = [0, 0, 0], and the desired radius. A con-  
79 ductive aluminum sphere has the following material properties: Relative Permeability = 1.000021, Bulk  
80 Conductivity = 38000000 S/m, Magnetic Coercivity = 0, Core Loss = None, Composition = Solid, Mass  
81 Density = 2689 kg/m<sup>3</sup>, Young Modulus = 69000000000, Poisson's Ratio = 0.31, and Thermal Modifier =  
82 None. A conductive copper sphere has the following material properties: Relative Permeability = 1, Bulk  
83 Conductivity = 58000000 S/m, Magnetic Coercivity = 0, Core Loss = 0, Composition = Solid, Mass Density  
84 = 8933 kg/m<sup>3</sup>, Young's Modulus = 120000000000, Poisson's Ratio = 0.38, Thermal Modifier = None.

85 A cubic box was created to surround the conductive sphere for refined meshing. The model has the  
86 following model properties: Command = Create Box, Coordinate System = Sphere, with position and  
87 dimension of the box set such that the box was centered on the conductive sphere and had a side length that  
88 is 1% larger than the diameter of the sphere. It has material property = air.

89 **Model:** Dipole rotation is implemented by right selecting the polyhedron model and assigning a Band.  
90 This generates a "MotionSetup" option under Model, which one can use to configure the following motion  
91 parameters: Motion Type = Rotation, Coordinate System = Global, Axis = Y, Direction = Positive, Initial  
92 Position = 0 deg, Has Rotation Limit = unchecked, and Non Cylindrical = unchecked. Under the "Me-  
93 chanical" tab one can update the angular velocity to the desired frequency of rotation. This automatically  
94 generates a CylindricalGap mesh and the axis of the rotation vector must be along the same axis as the  
95 length of the polyhedron.

96 **Parameters:** Output parameters are produced by right selecting the conductive sphere and creating param-  
97 eters for force, torque in  $x$ , torque in  $y$ , and torque in  $z$ , with respect to the conductive sphere coordinate  
98 system. A single force parameter will automatically produce outputs for all  $x, y, z$  directions. Depending on  
99 the relative placement of the conductive sphere to the dipole rotation axis, one can transform the Cartesian  
100 coordinates to our proposed cylindrical coordinate system.

101 **Mesh operations:** When assigning Mesh parameters, one must first right select the object and then select  
102 "Assign Mesh Operation". All mesh configurations have the following mesh properties: Type = Length  
103 Based, Region = Inside Selection, Enable = checked, Restrict Length = checked, and Restricted Max Elems  
104 = checked. Max Length and Max Elems are different for each object.

105 The mesh for the spherical permanent magnet is the mesh for the polyhedron. The polyhedron has Max  
106 Length = 5 mm and Max Elements = 5000.

107 For the conductive sphere and its cubic box, the Max Length and Max Elems are scaled proportionally  
108 to the smallest sphere radius of 25 mm for consistent mesh properties across all conductive spheres. For  
109 the conductive sphere the Max Length =  $r/5$  mm (where  $r$  is in units mm) and Max Elems =  $4000r$ . The  
110 mesh for the cubic box of air is an additional mesh operation for the conductive sphere and has Max length  
111 =  $r/5$  mm and Max Elems =  $50000r$ .

112 **Analysis setup:** The Analysis setup consists of Stop Time and Time Step for each FEA and are listed here  
113 with respect to  $\omega = 1$  Hz and Time Step = 1 ms. For conductive spheres with radii 25 mm and 40 mm the  
114 Stop Time = 2.5 s, for radii 100 mm and 150 mm the Stop Time = 4 s, and for radii 200 mm and 350 mm the  
115 Stop Time = 5 s. Larger spheres had longer Stop Time in order to allow the FEA to reach steady state. For  
116 all other values of  $\omega$ , the Analysis Setup parameters were scaled proportional to each frequency in order to  
117 maintain the same number of data points and number of dipole rotations. For examples, for a conductive  
118 sphere with 25 mm radius, at  $\omega = 2$  Hz, values would be updated to Stop Time = 1.5 s and Time Step =  
119 0.5 ms.

120 **Results:** Under “Results”, create two transients reports of rectangular plots for force and torque output on  
121 the conductive sphere. Data is saved for each time step of the FEA.

122 **Eddy-current configuration:** To include the effects of eddy current on the conductive sphere, go to Maxwell  
123 3D, select Excitations, select Set Eddy Effects, and check the box for the conductive sphere.

124 **Model Parameters for Analysis:** Once the setup is complete, one can perform “Analysis All” in order to  
125 start the FEA. While iterating through all parameters outlined in Table S1, FEAs were automated through  
126 the use of a Python script using ANSYS Maxwell “Automation”. The steady-state data was obtained by  
127 averaging the last dipole rotation.

### 128 3 Model Derivation

129 When visualizing the resulting non-dimensional  $\Pi$  groups for the FEA data (see column 1 of Figs. S2  
 130 and S3), we observed that at relatively far distances ( $\Pi_2 > 1.5$ , approximately), the relationship between  
 131  $\log_{10}(\Pi_0)$  and  $\log_{10}(\Pi_2)$ , for a given  $\Pi_1$ , can be accurately described by a linear model of the form

$$\log_{10}(\Pi_0) = \xi \log_{10}(\Pi_2) + \psi \quad (\text{S3})$$

132 where  $\xi$  is a slope and  $\psi$  is an intercept term in the log-log scale. We performed least-squares regression,  
 133 using MATLAB’s 2020a Curve Fitting Toolbox, on each of the data sets corresponding to a specific value  
 134 of  $\Pi_1$ , including all data with  $\Pi_2 > 1.5$ . We observed that the resulting slopes were very close to  $\xi = -6$   
 135 for both torques, and  $\xi = -7$  for all three forces. Since these values are analogous to what is expected from  
 136 magnetic torque and force imparted by a magnetic dipole on a soft-magnetic object—due to field strength  
 137 and thus magnetization decaying as  $\propto d^{-3}$ , torque being the product of magnetization and field strength  
 138 (i.e.,  $\propto d^{-3}d^{-3} = d^{-6}$ ), and force being the product of magnetization and the spatial derivative of the field  
 139 (i.e.,  $\propto d^{-3}d^{-4} = d^{-7}$ ) [1]—we fixed those values and then redid the least-squares regression, using the  
 140 following settings: “StartPoint” set to  $[-1]$  and “Upper” bound set to  $[0]$ .

141 We then determined that the intercept term could be described as a function of  $\Pi_1$  with four free param-  
 142 eters,  $c_0$ – $c_3$  (see column 2 of Figs. S2 and S3):

$$\psi = \log_{10}(c_0 \Pi_1) c_1 \Pi_1^{c_2} + c_3 \quad (\text{S4})$$

143 This regression used “StartPoint” set to  $[0.5, 1, -1, -1]$  and “Lower” bound set to  $[0, 0, -\text{inf}, -\text{inf}]$ .  
 144 We let  $\xi = c_4$  to create a consistent naming convention. Finally, after substituting Eq. S4 into Eq. S3  
 145 and taking the inverse logarithm of both sides of Eq. S3 we obtained the unified model given as Eq. 2.  
 146 From this modeling, the coefficients for the FEA-based unified model derived from each of the non-zero  
 147 forces and torques are provided under “Finite-element-analysis (FEA)” in Table S2. When calculating the  
 148 error between the FEA-based model and the FEA data points, across all configurations and force-torque  
 149 components, the median error is  $+0.04\%$  and the interquartile range is  $[-3\%, +2\%]$ .



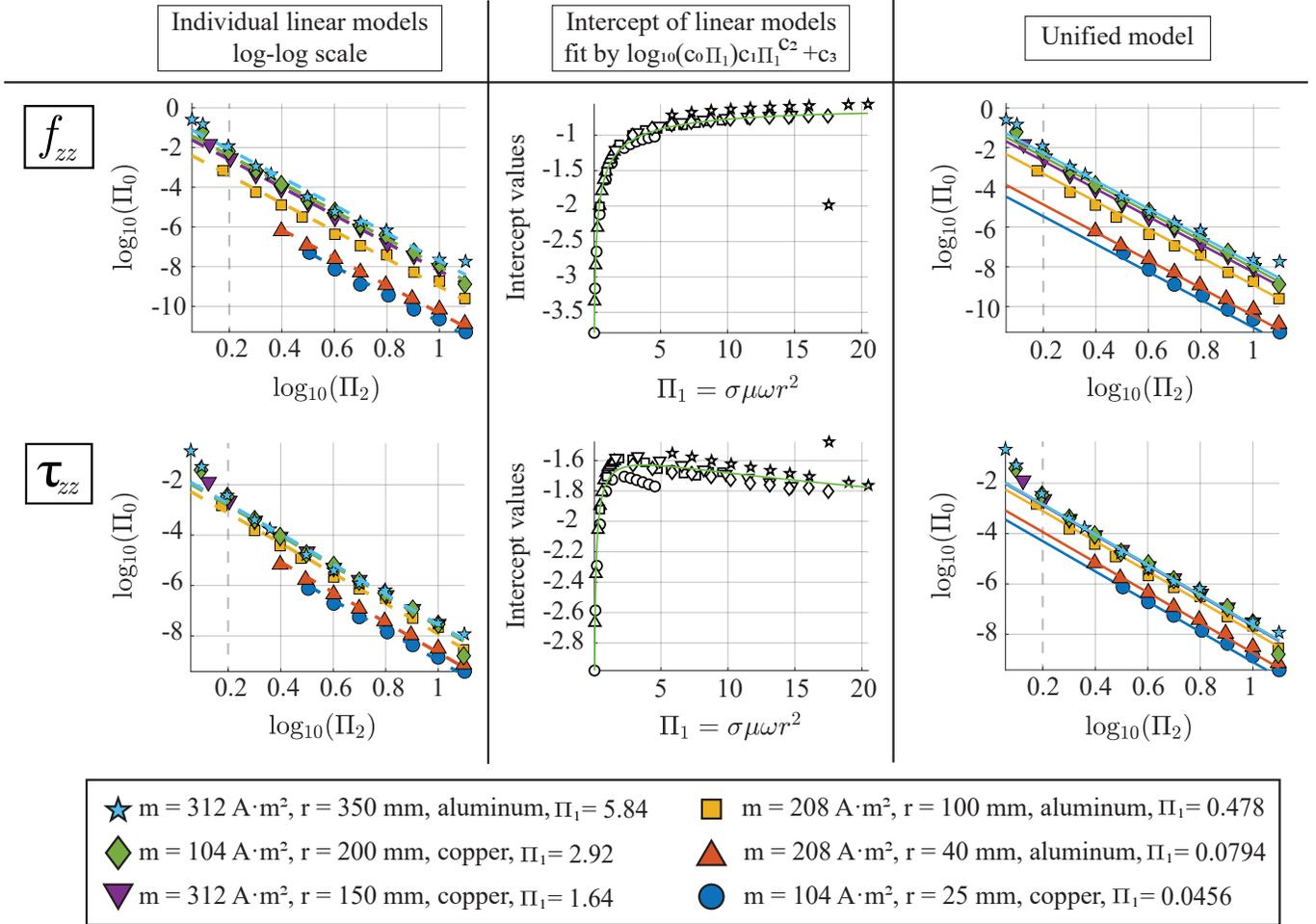


Figure S3: **Far-field model fitting for FEA results in the  $z$  configuration.** (Left) Linear models are fit to  $\log_{10}(\Pi_0)$  vs.  $\log_{10}(\Pi_2)$  for individual  $\Pi_1$  values, with a slope of -7 for forces and -6 for torques, using only results  $\log_{10}(\Pi_2) > 0.2$ . For clarity, only the lowest  $\omega$  value from each set of  $m$ ,  $r$ , and  $\sigma$  are shown. (Center) The resulting intercept values are fit with the model  $\log_{10}(c_0\Pi_1)c_1\Pi_1^{c_2} + c_3$ , using the complete set of  $\Pi_1$  values. (Right) The final unified far-field model projected on the original data.

Finite-element-analysis (FEA)						
$f, \tau$	Coefficients					Adj. $R^2$
	$c_0$	$c_1$	$c_2$	$c_3$	$c_4$	
$f_{zz}$	430	2.95	-0.101	-9.26	7	0.969
$\tau_{zz}$	6840	3.00	-0.0986	-13.2	6	0.974
$f_{\rho\rho}$	266	2.60	-0.101	-7.65	7	0.981
$f_{\rho\phi}$	6040	3.45	-0.102	-14.3	7	0.963
$\tau_{\rho z}$	8100	3.60	-0.0985	-15.7	6	0.928
Experimental						
$f, \tau$	Coefficients					Adj. $R^2$
	$c_0$	$c_1$	$c_2$	$c_3$	$c_4$	
$f_{zz}$	467	2.81	-0.0969	-9.75	7	0.996
$\tau_{zz}$	6900	3.35	-0.0990	-14.9	6	0.999
$f_{\rho\rho}$	282	3.20	-0.0980	-9.41	7	0.919
$f_{\rho\phi}$	5870	3.49	-0.0973	-14.6	7	0.997
$\tau_{\rho z}$	8000	3.40	-0.0928	-15.0	6	0.999

Table S2: **Model coefficients derived from FEA and experiments.** Note,  $c_4$  was fixed based on pilot studies. Only data with  $\Pi_2 > 1.5$  were used to derive the model and to compute the adjusted  $R^2$  values.

150 For all FEA simulations, the magnetic permeability of the environment,  $\mu$ , was constant and equal to  
151 the permeability of free space,  $\mu_0 = 4\pi \times 10^{-7} \text{ N}\cdot\text{A}^{-2}$ . In theory, if  $\Pi_1$  and  $\Pi_2$  were kept constant while  
152  $\mu$  was varied, then the dimensional analysis would expect the same values for  $\Pi_0$ . The results, however,  
153 are more complex because increasing  $\mu$  effectively turns the environment from free space into a kind of  
154 ferrofluid. That ferrofluid environment would experience magnetic forces that would be imparted on the  
155 conductive sphere, and the resulting forces of the FEA simulation would be the summation of those forces  
156 and the eddy-current-induced forces of interest here. Consequently, we do not recommend attempting to  
157 apply our model to environments other than those with  $\mu \approx \mu_0$ .

## 158 4 Experimental Verification of Force and Torque

159 Experimental verification was performed using the setup shown in Fig. 2c. It comprised a DC motor with a  
160 1200 count incremental optical encoder (#4751, Pololu) and a 19:1 gear reduction rotating a 51 mm cubic  
161 NdFeB grade-N42 permanent magnet (BY0Y0Y0, K&J Magnetics) with dipole strength of  $138 \text{ A}\cdot\text{m}^2$ , and  
162 a solid 25-mm-radius copper sphere mounted on top of a nonmagnetic 6-DOF force-torque sensor (Nano17  
163 Titanium, ATI Industrial Automation). The copper sphere and force-torque sensor were placed on a non-  
164 magnetic and nonconductive 3D-printed peg board with 10 mm spaced holes, which enabled the sphere to  
165 be placed along the desired  $z$  or  $\rho$  axes consistently. The pegboard was placed on a separate table from the  
166 motor to mitigate vibrations from the motor being picked up by the force-torque sensor. The center of the  
167 sphere and the center of the magnet were in the same horizontal plane.

168 The force-torque sensor was calibrated for SI-8-0.05, in which  $F_x$  and  $F_y$  have a  $\pm 8 \text{ N}$  range with  
169  $1.466 \text{ mN}$  resolution,  $F_z$  has a  $\pm 14.1 \text{ N}$  range with  $8.241 \text{ mN}$  resolution, and  $T_x$ ,  $T_y$ , and  $T_z$  have a  $\pm 50 \text{ N}\cdot\text{mm}$   
170 range with  $6.868 \text{ mN}\cdot\text{mm}$  resolution. Data was recorded using the sensor's ATIDAQFT.net program with  
171 the sampling rate set to  $1000 \text{ Hz}$ .

172 In the motor-magnet system, the magnet was fitted inside a 3D-printed housing, which was rigidly  
173 connected to a long aluminum shaft (supported by two pillow-block bearings), which was connected to the  
174 motor via a flexible shaft coupling. The closest face of the motor was  $268 \text{ mm}$  away from the center of  
175 the magnet, which mitigated interaction between the magnet and the motor and also mitigated influence of  
176 the motor's magnetic field on the copper sphere. Both the copper sphere and motor systems were raised  
177  $170 \text{ mm}$  above the surface of each respective table to mitigate interactions between any ferrous or conductive  
178 material within the tables. The motor system was tightly clamped to the table to help minimize shaking due  
179 to the magnet rotating at high speeds.

180 For the  $\rho$  configuration, the copper sphere was placed at distances (between the center of the sphere and  
181 the center of the magnet) in the range  $90\text{--}150 \text{ mm}$ , whereas the  $z$  configuration considered distances in the  
182 range  $70\text{--}150 \text{ mm}$  (see Tables S3 and S4).

183 For each configuration (i.e., position and frequency), force-torque sensor data were collected, each  
184 comprising  $25 \text{ s}$  of data. Approximately the first  $8 \text{ s}$  of data was with the magnet static; this was used  
185 to remove any DC bias from the sensor. Next, the magnet was rotated at the desired frequency for the

186 remaining time period. The force-torque sensor experienced the effect of magnet rotation as an application  
187 of force and torque on the mounted copper sphere. In post-processing, a discrete-time implementation of a  
188 unit-DC-gain first-order low-pass filter with a time constant of 2 s was applied to the data. After the filter's  
189 output had reached steady-state (i.e., after at least 10 s), the average force and torque values across 1 s were  
190 used to represent that data run. The methodology described above formed a single block of data. Such a  
191 block was repeated four more times, giving a total of five runs at each configuration.

192 The largest forces and torques were produced when the dipole source was rotating at 8 Hz and when  
193 the copper sphere was at the shortest distance. In the  $\pm z$  configuration the shortest distance is 70 mm with  
194 the largest force equaling 0.0773 N in the  $z$  direction and the largest torque equaling 0.0141 N·m in the  $z$   
195 direction. In the  $\rho$  configuration the shortest distance is at 90 mm with the largest force equaling 0.1419 N  
196 in the  $\phi$  direction and the largest torque equaling -0.0063 N·m in the  $z$  direction.

197 All experimental data points are shown in Figs. S4 and S5. Note that at the largest distances (i.e.,  
198 largest  $\Pi_2$  values) and smallest rotation frequencies (i.e., smallest  $\Pi_1$  values) the forces measured are near  
199 the sensing resolution of the sensor, leading to a poor signal-to-noise ratio. Using the same procedure  
200 outlined in Supplementary Information 3, all experimental data points were used to derive the experimental-  
201 based model and corresponding adjusted  $R^2$  values provided under “Experimental” in Table S2. Using  
202 MATLAB's Curve Fitting Toolbox, the regression used “StartPoint” set to the FEA-based coefficients,  
203 “Lower” bound set to [0, 0, -inf, -inf], and “Upper” bound set to [inf, inf, 0, inf]. When calculating the  
204 error between the experimental-based model and the experimental points, across all configurations and  
205 force-torque components, the median error is +0.03% and the interquartile range is [-1%, +2%].

$\sigma$ (S/m)	$m$ (A·m <sup>2</sup> )	$r$ (m)	$\omega$ (Hz)	$d$ (mm)	$\Pi_1$ —	$\Pi_2$ —
Copper $5.8 \times 10^7$	138	25	4	70	0.182	2.8
			5	80	0.228	3.2
			6	90	0.273	3.6
			7	100	0.319	4.0
			8	110	0.365	4.4
				120		4.8
				130		5.2
				140		5.6
				150		6.0

Table S3: **Summary of experimental parameters for force and torque characterization in the  $z$  configuration.** Keeping  $\sigma$ ,  $m$ , and  $r$  fixed, a set of  $\omega$  were tested, and at each  $\omega$  a set of  $d$  were tested. This resulted in five  $\Pi_1$  values, and at each  $\Pi_1$  value nine  $\Pi_2$  values.

$\sigma$ (S/m)	$m$ (A·m <sup>2</sup> )	$r$ (m)	$\omega$ (Hz)	$d$ (mm)	$\Pi_1$ —	$\Pi_2$ —
Copper $5.8 \times 10^7$	138	25	4	90	0.182	3.6
			5	100	0.228	4.0
			6	110	0.273	4.4
			7	120	0.319	4.8
			8	130	0.365	5.2
				140		5.6
				150		6.0

Table S4: **Summary of experimental parameters for force and torque characterization for the  $\rho$  configuration.** Keeping  $\sigma$ ,  $m$ , and  $r$  fixed, a set of  $\omega$  were tested, and at each  $\omega$  a set of  $d$  were tested. This resulted in five  $\Pi_1$  values, and at each  $\Pi_1$  value seven  $\Pi_2$  values.

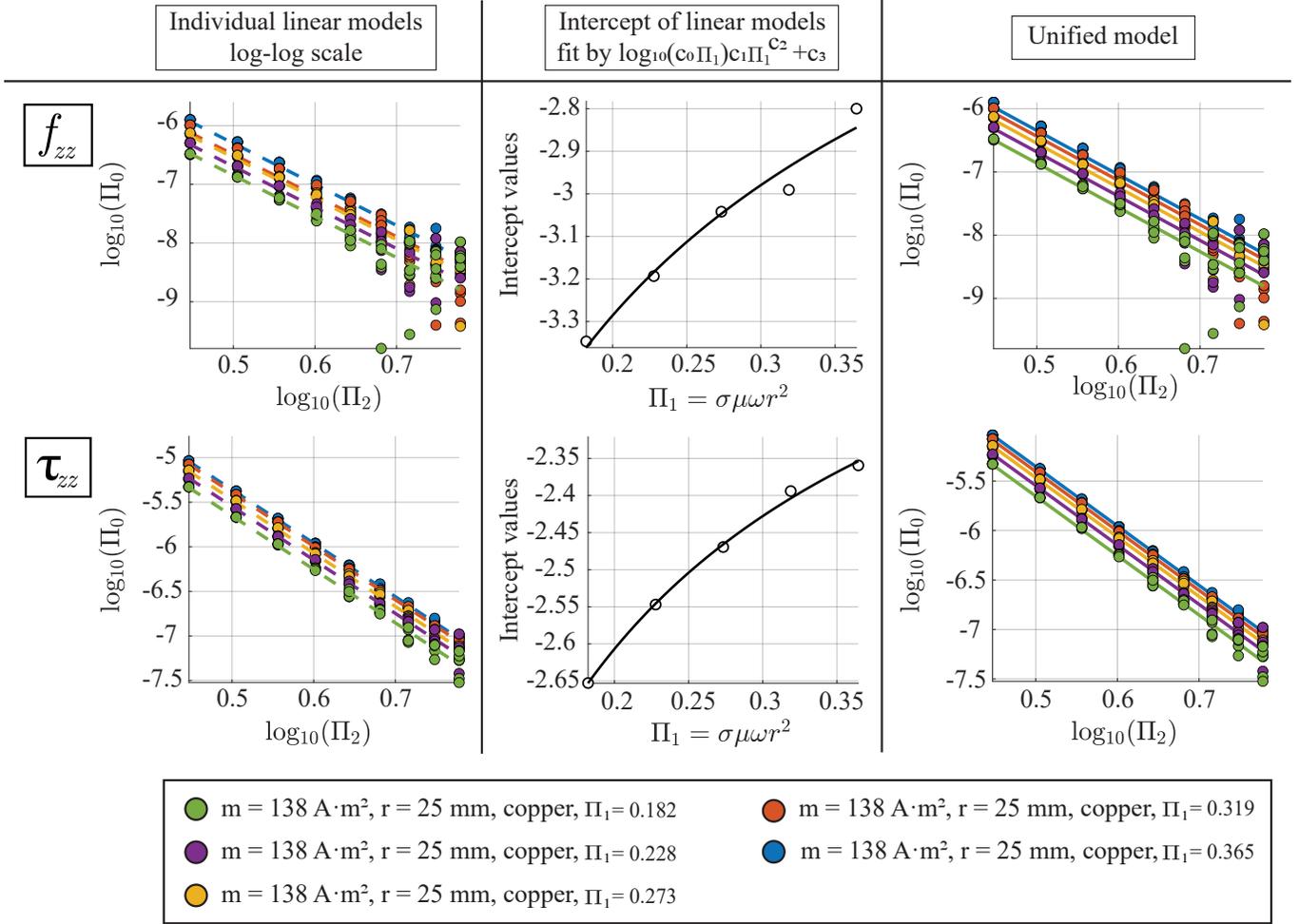


Figure S4: **Far-field model fitting for experimental results in the  $z$  configuration.** (Left) Linear models are fit to  $\log_{10}(\Pi_0)$  vs.  $\log_{10}(\Pi_2)$  for individual  $\Pi_1$  values, with a slope of -7 for forces and -6 for torques. For clarity, only the lowest  $\omega$  value from each set of  $m$ ,  $r$ , and  $\sigma$  are shown. (Center) The resulting intercept values are fit with the model  $\log_{10}(c_0\Pi_1)c_1\Pi_1^{c_2} + c_3$ , using the complete set of  $\Pi_1$  values. (Right) The final unified far-field model projected on the original data.

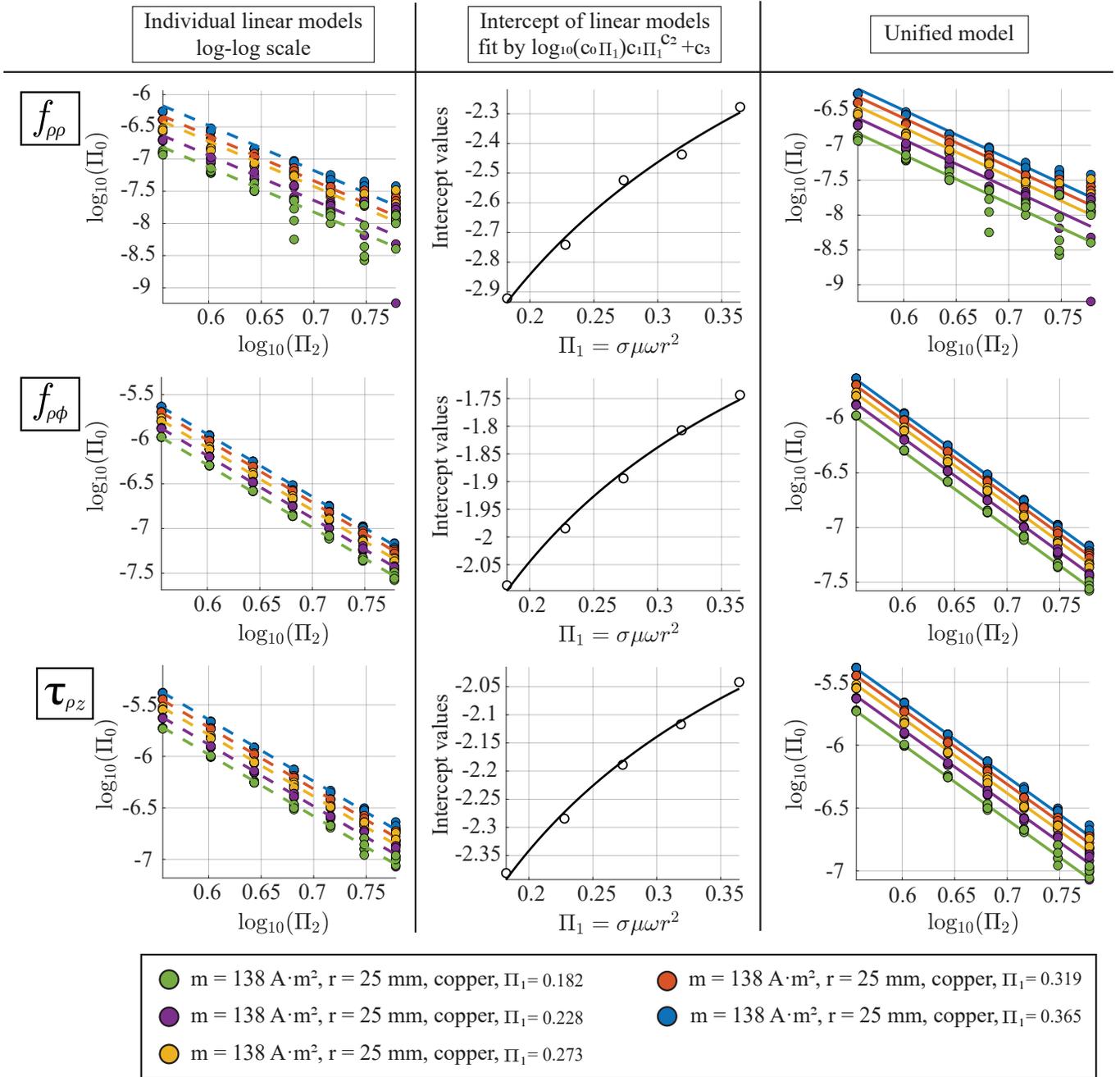


Figure S5: **Far-field model fitting for experimental results in the  $\rho$  configuration.** (Left) Linear models are fit to  $\log_{10}(\Pi_0)$  vs.  $\log_{10}(\Pi_2)$  for individual  $\Pi_1$  values, with a slope of -7 for forces and -6 for torques. For clarity, only the lowest  $\omega$  value from each set of  $m$ ,  $r$ , and  $\sigma$  are shown. (Center) The resulting intercept values are fit with the model  $\log_{10}(c_0\Pi_1)c_1\Pi_1^{c_2} + c_3$ , using the complete set of  $\Pi_1$  values. (Right) The final unified far-field model projected on the original data.

## 206 **5 Comparison of Numerical and Experimental Results**

207 Figure S6 shows a comparison of four items: (1) the experimental data, as described in Supplementary  
208 Information 4; (2) the model fit to the experimental data, as described in Supplementary Information 4;  
209 (3) the model fit to the FEA data set from Supplementary Information 2, as described in Supplementary  
210 Information 3; and (4) new FEA data at the same  $\Pi_1$  and  $\Pi_2$  values of the experimental data, which were  
211 not part of the model's training set, although they still fall within the range of  $\Pi_1$  and  $\Pi_2$  values used to  
212 fit the model. The experimental data points and experimental-based model are in good agreement with  
213 each other. The FEA-based model shows agreement with the new FEA data for the  $\rho$  configuration, and  
214 overpredicts the new FEA data for the  $z$ -axis configurations. Such variances between individual data and  
215 the model is not unexpected, given the wide range of  $\Pi_1$  and  $\Pi_2$  values used for model fitting, as well as  
216 the variance in  $\Pi_0$  observed in Figs. S2 and S3. This variance will result in the FEA-based model over-  
217 and under-predicting FEA data for different system configurations. When comparing the FEA-based model  
218 and experiment-based models across all configurations and force-torque components, we see that the FEA-  
219 based model tends to over predict the experimental values of  $\Pi_0$  by a factor of 1.5–5.5. We also see that the  
220 FEA data tends to overpredict the experimental data in this experimental range, but by a lesser extent in the  
221  $z$ -axis configurations.

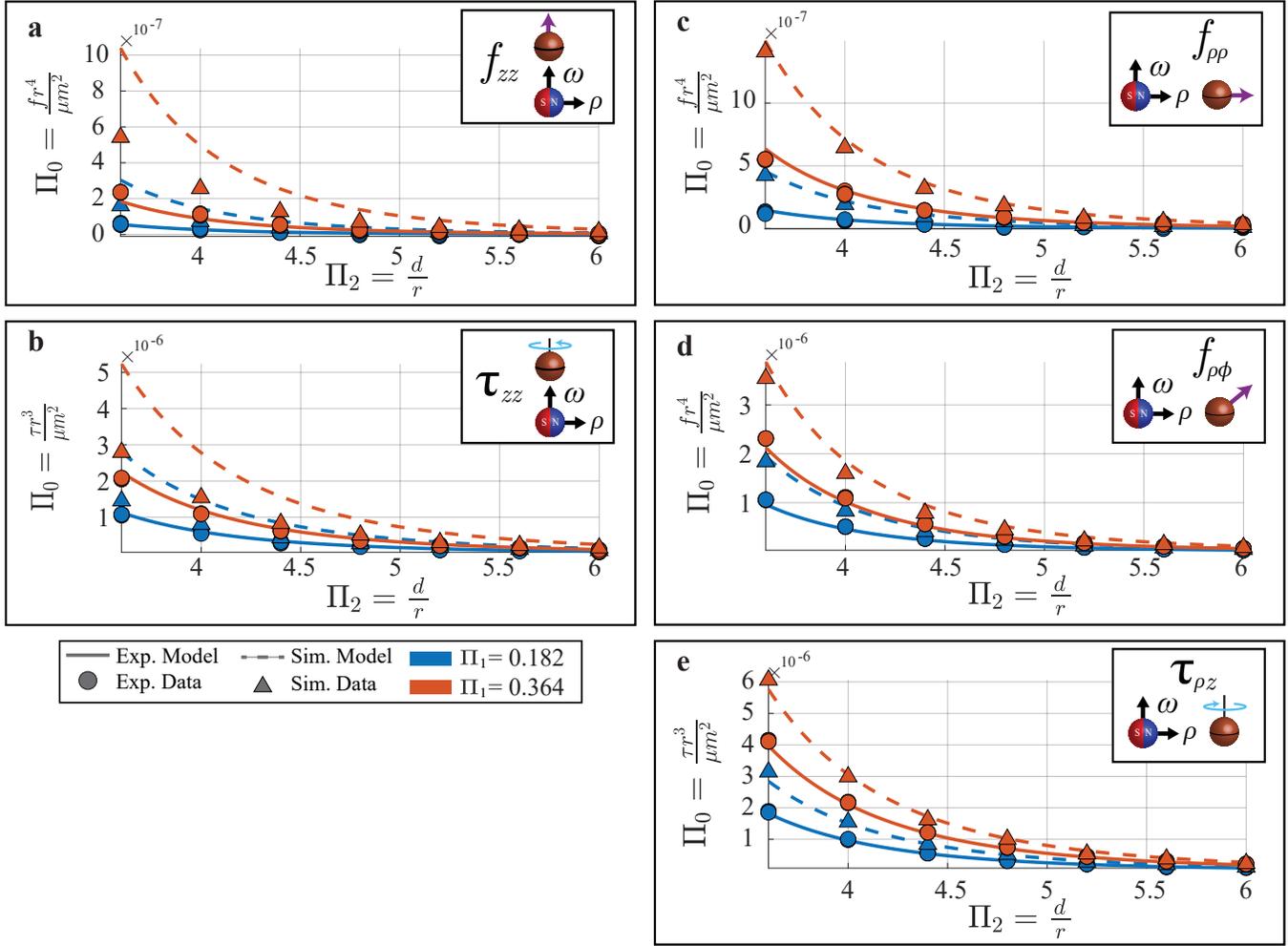


Figure S6: Experimental results for all force and torque characterization with subset of experimental data, experiment-based models, FEA-based models, and new FEA data not included in the training set. For clarity only a subset of experimental data is shown (minimum and maximum frequencies tested, corresponding to  $\Pi_1 = 0.182$  and  $\Pi_1 = 0.364$ , respectively). **a**,  $z$ -axis configuration,  $f_{zz}$ . **b**,  $z$ -axis configuration,  $\tau_{zz}$ . **c**,  $\rho$  configuration,  $f_{\rho\rho}$ . **d**,  $\rho$  configuration,  $f_{\rho\phi}$ . **e**,  $\rho$  configuration,  $\tau_{\rho z}$ .

## 222 6 Manipulation Numerical Simulations

223 We constructed a computer-simulated environment to run 3D-pose (i.e., 6-DOF) object-manipulation exper-  
 224 iments. This simulator enabled us to simulate an environment without gravity and gives the added benefit  
 225 of letting us observe the state directly. We chose a somewhat-arbitrary sampling rate of 1 Hz based on the  
 226 system’s relatively slow velocities and accelerations, so we can assume the object is relatively stationary  
 227 with respect to the magnets over this time interval. Recall that our force-torque model was developed with  
 228 stationary objects. We use standard rigid-body object dynamics to simulate the motion of the conductive  
 229 object at 500 Hz (representing continuous-time, approximately) [3, 4]. We define  ${}^c\mathbf{V}$  and  ${}^c\boldsymbol{\omega}$  as the ve-  
 230 locity and angular velocity, respectively, of the object with respect to the world frame, expressed in the  
 231 conductive-object frame. We denote the skew-symmetric cross-product matrix derived from vector  $\mathbf{v}$  as  
 232  $\mathbf{v}^\times$  (such that for two vectors  $\mathbf{v}_1$  and  $\mathbf{v}_2$ ,  $\mathbf{v}_1^\times \mathbf{v}_2 = \mathbf{v}_1 \times \mathbf{v}_2$ ). We denote the combined moment of inertia  
 233 and mass matrix as  $\mathcal{I}$ ; in our case of a spherical object this reduces to a diagonal matrix, but the equations  
 234 below and our approach hold for the general case.

235 We now develop the continuous-time dynamic equations. The conductive object’s 6-DOF pose is rep-  
 236 resented by the transformation matrix  ${}^w\mathbf{T}_c$ . The time derivative of the object’s pose is described by

$${}^w\dot{\mathbf{T}}_c = {}^w\mathbf{T}_c \begin{bmatrix} {}^c\boldsymbol{\omega}^\times & {}^c\mathbf{V} \\ \mathbf{0} & 0 \end{bmatrix} \quad (\text{S5})$$

237 The continuous-time dynamics are governed by

$$\begin{bmatrix} {}^c\dot{\boldsymbol{\omega}} \\ {}^c\dot{\mathbf{V}} \end{bmatrix} = \mathcal{I}^{-1} \begin{bmatrix} -{}^c\boldsymbol{\omega}^\times & -{}^c\mathbf{V}^\times \\ \mathbf{0} & -{}^c\boldsymbol{\omega}^\times \end{bmatrix} \mathcal{I} \begin{bmatrix} {}^c\boldsymbol{\omega} \\ {}^c\mathbf{V} \end{bmatrix} + \mathcal{I}^{-1} \begin{bmatrix} {}^c\boldsymbol{\tau} \\ {}^c\mathbf{f} \end{bmatrix} \quad (\text{S6})$$

238 This can be interpreted as the object’s acceleration due to the gyroscopic and Coriolis forces summed with  
 239 the object’s acceleration due to external forces and torques acting on the object (i.e., our magnetic control  
 240 input).

241 In order to numerically integrate these continuous-time dynamics, we must approximate them with the  
 242 associated discrete-time equations for a small time-step  $dt$ . In the following equations we use  ${}^c\mathbf{V}[t]$  to index

243  $\mathbf{V}$  at time  $t$  written with respect to the conductive-object frame.

$${}^w\mathbf{T}_c[t + dt] = {}^w\mathbf{T}_c[t] + {}^w\dot{\mathbf{T}}_c[t]dt \quad (\text{S7})$$

$$\begin{bmatrix} {}^c\boldsymbol{\omega} \\ {}^c\mathbf{V} \end{bmatrix} [t + dt] = \begin{bmatrix} {}^c\boldsymbol{\omega} \\ {}^c\mathbf{V} \end{bmatrix} [t] + \begin{bmatrix} {}^c\dot{\boldsymbol{\omega}} \\ {}^c\dot{\mathbf{V}} \end{bmatrix} [t]dt \quad (\text{S8})$$

245 where the input accelerations are computed from Eq. S6.

246 We constructed our trajectories by specifying a series of waypoint poses and associated target times to  
 247 reach each waypoint. These points were then used to build time-parameterized cubic polynomials between  
 248 the waypoints as a target trajectory. The waypoint poses were given as positions and Euler angles so we  
 249 can construct six independent polynomials. The desired positions and Euler angles were then converted to  
 250 a desired transformation matrix for use in our controller. Formally, the cubic polynomials are defined as

$$\begin{bmatrix} \mathbf{x} \\ \dot{\mathbf{x}} \end{bmatrix} [t] = \begin{bmatrix} \mathbf{p}_3 t^3 + \mathbf{p}_2 t^2 + \mathbf{p}_1 t + \mathbf{p}_0 \\ 3\mathbf{p}_3 t^2 + 2\mathbf{p}_2 t + \mathbf{p}_1 \end{bmatrix} \quad (\text{S9})$$

251 where  $\mathbf{p}_3$ ,  $\mathbf{p}_2$ ,  $\mathbf{p}_1$ , and  $\mathbf{p}_0$  are column vectors of length six representing the 3D pose of the conductive object.  
 252 The constructed trajectory contains desired transformation matrices and velocity targets for each timestep.

253 We tuned a proportional-derivative (PD) controller to produce the error-based forces and torques to track  
 254 the desired trajectory in the simulation. Orientation errors were computed as the minimum rotation between  
 255 current and desired orientations using the axis-angle representation. The PD controller produced the desired  
 256 forces and torques to feed into our optimization from Eq. 4equation.0.4. We tuned the control gains to  
 257 operate well in both the numerical simulations and the physical experiments described in Supplemental  
 258 Information 7. The proportional gains were  $5 \times 10^{-3}$  N/m and  $1 \times 10^{-5}$  N·m/rad for position and angle,  
 259 respectively, and the derivative gains were  $5 \times 10^{-3}$  N·s/m and  $1 \times 10^{-5}$  N·m·s/rad for velocity and angular  
 260 velocity, respectively.

261 Given a desired force-torque wrench, we leveraged our eddy-current-induced force-torque model and  
 262 attempted to match the desired wrench as closely as possible, which we formalize in Eq. 4equation.0.4.  
 263 We rotated the magnetic dipole at  $\omega = 15$  Hz in all simulations. Our force-torque model supports a single  
 264 electromagnet dipole source actuating in one of three discrete actions. Thus, to solve this optimization,

265 we instantiated a separate continuous optimization problem for each discrete electromagnet-action combi-  
 266 nation. For each such combination, we used the Adam optimizer [5] (although other solvers would also  
 267 work) to find the best combination of continuous decision variables to minimize the weighted squared error  
 268 between desired and achievable force-torque.

269 Given our decision to use an unconstrained optimizer, we created box constraints on each bounded  
 270 control variable  $\alpha$  using the continuously differentiable sigmoid function

$$\alpha(\beta) = \frac{\alpha_{\max} - \alpha_{\min}}{1 + e^{-\beta}} + \alpha_{\min} \quad (\text{S10})$$

271 where  $\beta$  can take on any real number. For  $\alpha = m$ , we use  $\alpha_{\min} = 0$  and  $\alpha_{\max} = m_{\max} = 40 \text{ A}\cdot\text{m}^2$ . For  
 272  $\alpha = \theta$ , we use  $\alpha_{\min} = -\pi \text{ rad}$  and  $\alpha_{\max} = \pi \text{ rad}$ .

273 To select the best discrete choice, we take the argument that minimizes the results over all of the inde-  
 274 pendent continuous optimizations associated with the  $3n$  possible electromagnet-action combinations.

275 The weighting, encoded by  $Q$ , between different degrees of freedom in our cost function can be used to  
 276 tune the optimization to prioritize specific dimensions. This weighting captures the units' various scaling,  
 277 the inertia in various axes resisting motion, the difference in scale between different waypoint dimensions,  
 278 and the aggressiveness of the controller in different dimensions. We found that a weight of 1 in all force  
 279 dimensions and a weight of 200 in all torque dimensions (with all off-diagonal elements set to 0) resulted  
 280 in a reasonable (although somewhat arbitrary) balance between position and orientation error.

281 The results of a typical 6-DOF manipulation simulation is shown in Figs. 3a–3d, as well as Supplemen-  
 282 tal Videos 1 and 2. In this simulation, the initial position of the conductive sphere is aligned with the origin,  
 283 and is commanded to move first to one corner of a cube and then along the edges of that cube, displaying  
 284 controlled motion in each direction. The target time to reach each waypoint was set to 5 minutes of sim-  
 285 ulated time, which we found to provide a reasonable trade-off between completion time and performance,  
 286 although we make no claims of optimality. Over many trials, we found that the performance was fairly  
 287 insensitive to the start and goal poses, provided they were sufficiently surrounded by the magnetic-dipole  
 288 sources and given an adequate amount of time. Simulations were conducted first with 3-DOF position con-  
 289 trol in which orientation was uncontrolled (with object tumbling resulting), and then with full 6-DOF pose  
 290 control with orientation controlled to maintain a fixed orientation. The exact waypoints for the simulations

291 are provided in Table S5.

Time (s)	x (mm)	y (mm)	z (mm)
300	75	-75	-75
600	-75	-75	-75
900	-75	75	-75
1200	75	75	-75
1500	75	75	75
1800	-75	75	75
2100	-75	-75	75
2400	75	-75	75
2700	75	-75	-75

Table S5: **Waypoints from manipulation simulations.** The waypoints are used with Eq. S9 to construct trajectories used for manipulation simulations.

## 292 **7 Manipulation Experiments**

293 Accurate Earth-based microgravity simulation is challenging. The characteristics of a true microgravity  
294 simulation are that it enable 6-DOF motion, that it be gravity-free or gravity-compensated, and that it  
295 be drag-free. A variety of Earth-based test environments are commonly used [6, 7]: the KC-135 “vomit  
296 comet” reduced-gravity aircraft; an air-bearing test facility; passive and active manipulator and gimbal  
297 combinations to counter gravity; and neutral buoyancy (e.g., a water tank). Each of these techniques has  
298 drawbacks. KC-135 provides a true microgravity simulation, but its cost and availability make its use  
299 prohibitive for academic research, and its short duration (20–30 s) make it of limited use for experiments  
300 with long time scales. Air-bearing test facilities only enable 3-DOF mobility in a horizontal plane (i.e.,  
301 2-DOF position, 1-DOF orientation). Both passive and active gravity compensation implicitly assume that  
302 the forces and torques being intentionally generated on the object are large compared to any unmodeled  
303 forces and torques and/or force-torque sensor noise. Neutral buoyancy in water adds significant drag that  
304 would not be present in space.

305 For our manipulation experiments, we chose to use a raft floating on the surface of water (see Fig. 3e).  
306 This solution is effectively a hybrid of the air-bearing technique and the neutral-buoyancy technique, and in-  
307 herits the limitations of both. The tank of water was suspended above four identical omnidirectional electro-  
308 magnets referred to as Omnimagnets, which have been previously described [8], as the dipole sources. Each  
309 Omnimagnet comprises three mutually orthogonal nested coils with a spherical ferromagnetic core in the  
310 center, and was designed such that its field could be accurately modeled by the point-dipole equation even at  
311 relatively close distances. The coils were connected to individual current-drive amplifiers (AMC16A8, Ad-  
312 vanced Motion Control), with current and voltage limits of 8 A and 80 V, respectively. All of the amplifiers  
313 were connected in a parallel configuration to one power supply (PS16L80, Advanced Motion Control) with  
314 current and voltage limits of 10 A and 80 V, respectively. This limits the maximum dipole strength that can  
315 be achieved in every direction to  $40 \text{ A}\cdot\text{m}^2$ . The dipole’s strength and rotation frequency both have a direct  
316 relation to the induced force and torque. The dipole strength is linearly related to the current in the coils.  
317 Each coil’s inductance limits how rapidly the current can be changed, and therefore limits the maximum  
318 frequency of the dipole rotation for a given dipole strength. We found this maximum frequency empirically  
319 by mounting a 25-mm-radius copper sphere on an ATI Nano17 Titanium force-torque sensor and collecting

320 data at two representative locations near an Omnimagnet. Using the maximum dipole strength of  $40 \text{ A}\cdot\text{m}^2$ ,  
321 frequencies between 1 Hz and 20 Hz were tested, with the peak force and torque observed at 15 Hz. Thus,  
322 we use a constant magnetic dipole rotation of  $\omega = 15 \text{ Hz}$  in all manipulation experiments.

323 To calculate the necessary current to generate the required dipole, we used the linear approximation [9]:

$$\mathbf{m} = \alpha \mathbf{I} \quad (\text{S11})$$

324 where  $\mathbf{m}$  is the dipole moment (units  $\text{A}\cdot\text{m}^2$ ),  $\mathbf{I}$  is the column vector of the corresponding coil currents  
325 (units A), and  $\alpha = 7.00 \text{ m}^2$  is a coefficient that was found via calibration by recording magnetic-field  
326 measurements well beyond the minimum bounding sphere of the Omnimagnet and fitting the data to the  
327 point-dipole model of Eq. 1equation.0.1.

328 The centers of the Omnimagnets were placed on the corners of a 200 mm square in a horizontal plane,  
329 fixed using a 3D-printed jig. A camera (Grasshopper3, FLIR) operating at 20 Hz was rigidly mounted  
330 centered above the tank. A 20-mm-radius copper sphere was placed in the center of a 3D-printed cylindrical  
331 flat-bottom raft, which floated on the surface of the water, such that the center of the copper sphere was  
332 150 mm above the plane of the Omnimagnets. An ArUco marker used for camera-based tracking was  
333 placed on top of the raft [10], which enabled pose estimates at 20 Hz. A univariate spline in each DOF  
334 was fit to the 1000 most recent pose detections (i.e., the past 50 s) [11], and these splines were used to get  
335 smoothed velocity estimates.

336 Five trials were performed for each of the two distinct experiments. In both experiments, the raft (i.e.,  
337 the copper sphere) was commanded to move along a 150 mm square with 2-DOF position control. In one  
338 experiment, the orientation was not controlled, with the raft being allowed to freely rotate about the vertical  
339 axis. In the other experiment, the rotation about the vertical axis was also controlled, for a total of 3-DOF  
340 control over the raft's pose. The surface of the water resisted motion in the remaining 3-DOF. The PD  
341 controller gains used were the same as those used in the numerical manipulation simulations of Supple-  
342 mentary Information 6. The exact waypoints for the physical experiments are provided in Table S6. The  
343 method to convert the waypoints to a full trajectory is the same as described in Supplementary Information  
344 6. The  $\mathbf{Q}$  matrix used in the optimization was the same used in the numerical simulations of Supple-  
345 mentary Information 6, but we also set uncontrolled dimensions to zero. For 2-DOF position control,

Time (s)	x (mm)	y (mm)	angle (rad)
2-DOF Position Control			
240	75	75	NA
480	-75	75	NA
720	-75	-75	NA
960	75	-75	NA
1200	75	75	NA
3-DOF Pose Control			
240	75	75	$\frac{\pi}{4}$
480	75	75	$\pi$
720	-75	75	$\pi$
960	-75	75	$\frac{3\pi}{2}$
1200	-75	-75	$\frac{3\pi}{2}$
1440	-75	-75	$2\pi$
1680	75	-75	$2\pi$
1920	75	-75	$\frac{5\pi}{2}$
2160	75	75	$\frac{5\pi}{2}$
2400	75	75	$3\pi$

Table S6: **Waypoints from manipulation experiments.** The waypoints are used with Eq. S9 to construct trajectories for manipulation experiments.

346  $Q = \text{diag}(1, 1, 0, 0, 0, 0)$ , and for 3-DOF pose control,  $Q = \text{diag}(1, 1, 0, 0, 0, 200)$ , where  $\text{diag}(i, j, \dots)$   
347 is the square diagonal matrix with  $i, j, \dots$  as its ordered diagonal elements. Figure S7 shows the complete  
348 trajectory results for these experiments. One representative trial from each experiment was presented in  
349 Figs. 3f and 3g; in Fig. S8 we provide the complete position and orientation results as a function of time for  
350 these trials.

351 The trajectory-following accuracy and precision across the five trials in each experiment are quantita-  
352 tively summarized in Fig. S9. To quantify the accuracy at each time  $t$ , we compute the position and velocity  
353 errors using the 2-norm, and we compute the magnitudes of the orientation and angular-velocity errors.  
354 These combined results across time can be seen in Fig. S9. To quantify the precision (i.e., repeatability  
355 across trials) of each experiment, we first take the covariance of the  $x$ - $y$  position across all trials at each  
356 time  $t$ . These covariances can be seen in Fig. S7 where we draw a 95% confidence ellipse at each time  $t$ ,  
357 computed using the principal components of each covariance matrix. In addition, we take the determinant  
358 of these covariance matrices to get the generalized positional variance at each time  $t$ ; to get this generalized  
359 positional variance back to the original measurement unit of interest, we take the square root. These values  
360 can then be treated as a scalar measure of precision over time. We similarly compute the square root of

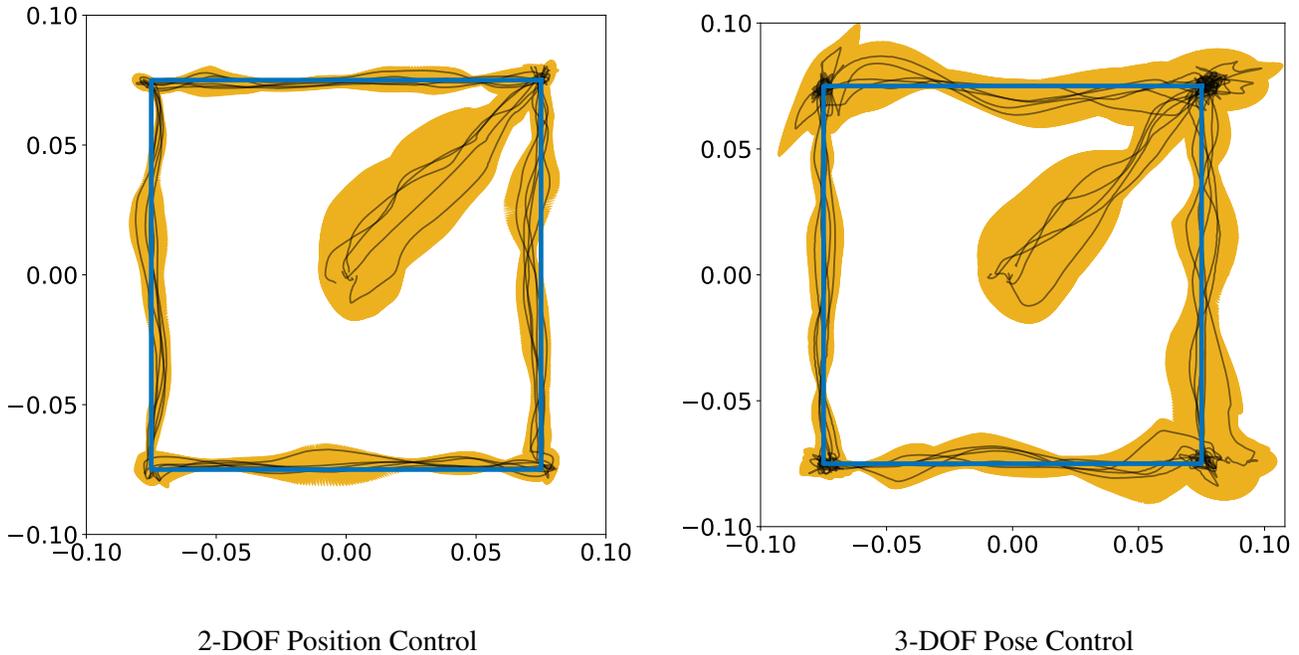


Figure S7: **Position trajectories across five trials of each manipulation experiment.** The blue square is the desired trajectory and black curves show the actual trajectories for individual trials. The yellow shaded region depicts 95% confidence ellipse.

361 generalized velocity variance. Because orientation and angular velocity are both 1-DOF variables in our  
 362 experiment, we can directly utilize the standard deviations of orientation and angular velocity at each time  
 363  $t$ . These combined results across time can be seen in Fig. S9.

364 In the future, neutral buoyancy seems to be the most promising technique to transition manipulation  
 365 experiments to full 6-DOF.

366 It would require that we create a neutrally-buoyant object fully enclosing a conductive object at its cen-  
 367 ter. This would be challenging, but not impossible. Any imperfection in the neutral buoyancy would need  
 368 to be significantly less than the magnitude of the eddy-current-induced forces generated on the conductive  
 369 object. If we imagine an air-filled bubble-like structure with a copper sphere of radius  $r$  at its center, the  
 370 bubble-like structure would need to have a radius of approximately  $2.1r$ . For an aluminum sphere, this value  
 371 would need to be approximately  $1.4r$ . The dipole-field sources themselves would not need to be submerged  
 372 in water. Object tracking would similarly become more challenging requiring multiple markers/cameras to  
 373 account for occlusions.

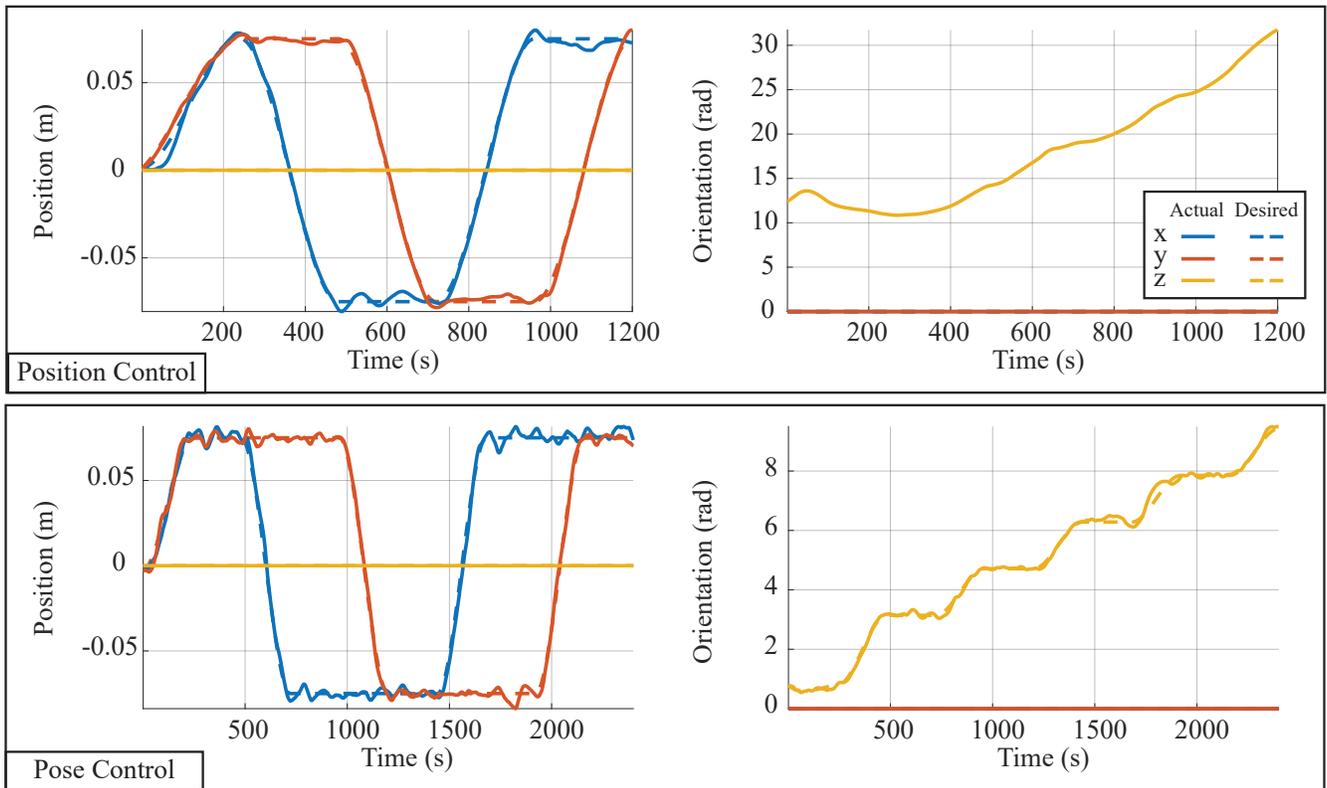


Figure S8: **Position and orientation values versus time for the 2-DOF position-control experiment and 3-DOF pose-control experiments shown in Figs. 3f and 3g, respectively.** The z axis represents the vertical axis.

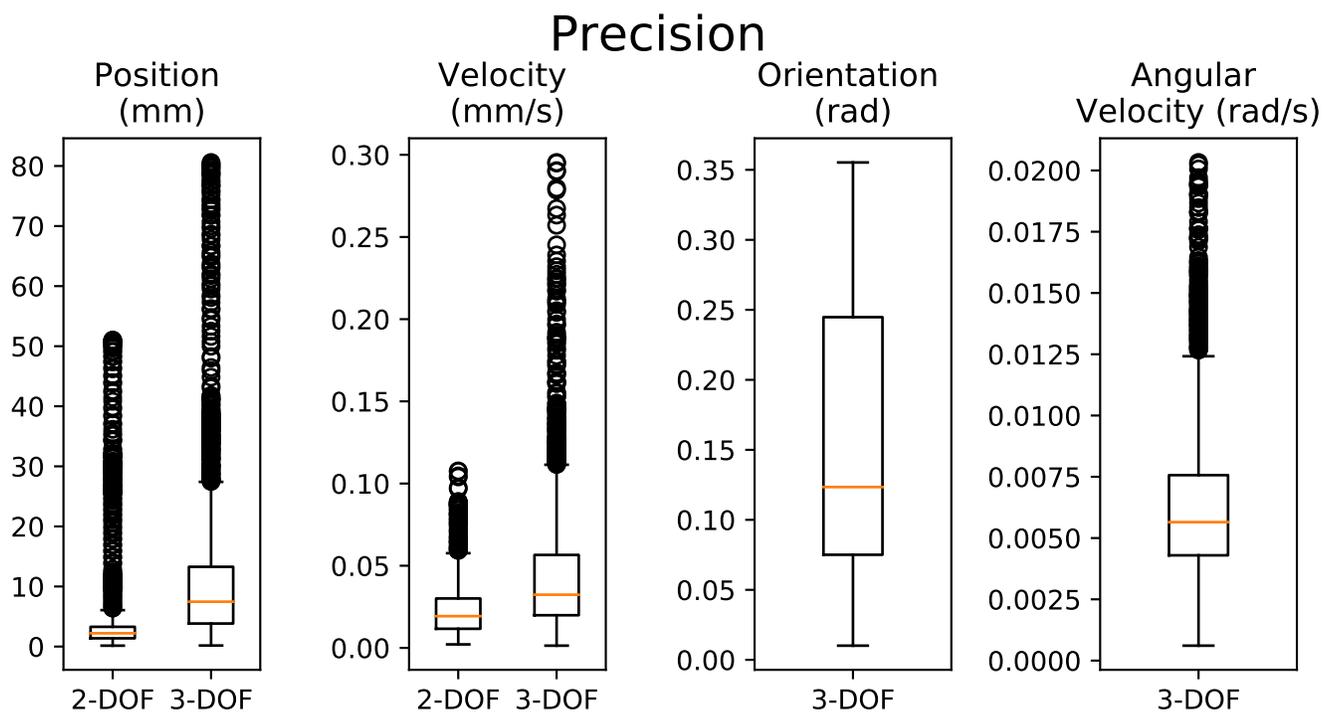
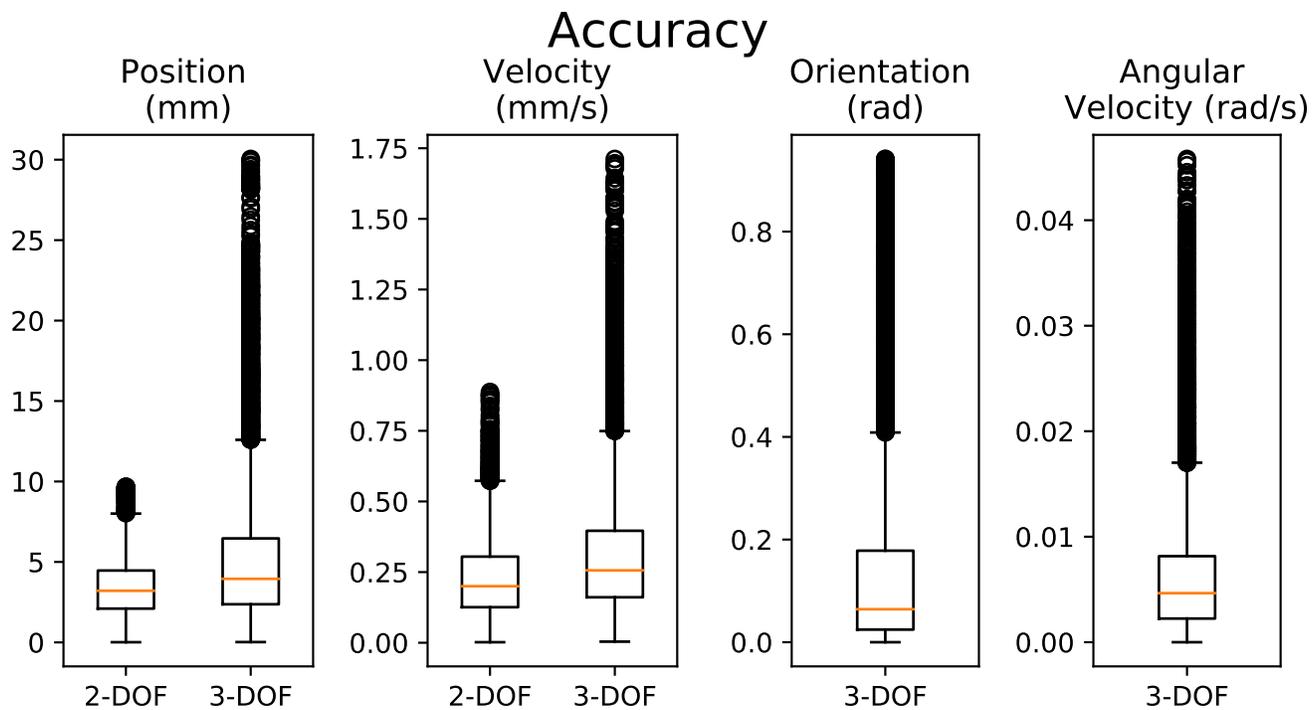


Figure S9: **Quantitative results across five trials of each manipulation experiment.** “2-DOF” refers to the position-control experiment (in which orientation was uncontrolled) and “3-DOF” refers to the pose-control experiment. Definition of box-plot elements: red center line, median; box limits, upper and lower quartiles; whiskers,  $1.5 \times$  interquartile range; circles, outliers.

## 374 8 Discussion

375 It is worth noting that the force components that tend to push the conductive sphere away from the rotating  
376 dipole increase asymptotically (i.e., with diminishing return) with an increase in  $\Pi_1$  (e.g., an increase in  $\omega$ ),  
377 at least over the range of  $\Pi_1$  values considered here; see column 2 of Figs. S2 and S3. This would suggest an  
378 actuation policy that is to spin the magnetic dipole as fast as possible. However, the other force component  
379 and both torque components increase to a maximum value at relatively low value of  $\Pi_1$ , and then decrease  
380 with further increases in  $\Pi_1$ . This would suggest that distinct optimal dipole rotation frequencies exist to  
381 generate each of those components.

382 However, it may also be possible to find a dipole rotation frequency that is near optimal for all force-  
383 torque components. Considering all five force-torque components holistically, it would seem that designing  
384 a system to achieve  $1 \leq \Pi_1 \leq 5$  (i.e.,  $\Pi_1 \approx 3$ , with results insensitive to small changes in  $\Pi_1$  around  
385 this value) may be close to optimal. If we consider the form of  $\Pi_1$ , it would suggest a near-optimal dipole  
386 rotation frequency for a given piece of conductive material of the form

$$\omega \approx \frac{3}{\sigma \mu_0 r^2} \text{ Hz} \quad (\text{S12})$$

387 It is interesting to note that this value depends on the conductivity and size of the object, but not on the  
388 distance or strength of the dipole-field source.

389 In the manipulation experiments of Fig. 3, we manipulated a copper sphere ( $\sigma = 5.8 \times 10^7$  S/m) with  
390 a radius  $r = 0.020$  m. This would suggest a near-optimal rotation frequency would have been 103 Hz.  
391 This value does not account for the practical amplifier and power-supply limitations of our field-generation  
392 system (since the magnitude of the dipole strength,  $m$ , appears in  $\Pi_0$ ). In our manipulation experiments,  
393 we used a value of  $\omega = 15$  Hz, which corresponds to  $\Pi_1 = 0.44$ .

394 There are estimated to be 34,000 objects in orbit greater than 10 cm, 900,000 objects less than 10 cm  
395 and greater than 1 cm, and 128 million objects less than 1 cm and greater than 1 mm [12]. Let us consider  
396 pieces of aluminum (approximated as spheres, with  $\sigma = 3.8 \times 10^7$  S/m), since aluminum is the most  
397 common material found in space debris [13]. Equation S12 enables us to determine the near-optimal dipole  
398 rotation frequency as a function of the size of the object, which is depicted in Fig. S10 for the range  
399 of sizes that are prevalent in space debris. For reference, brushless DC motors with speeds as high as

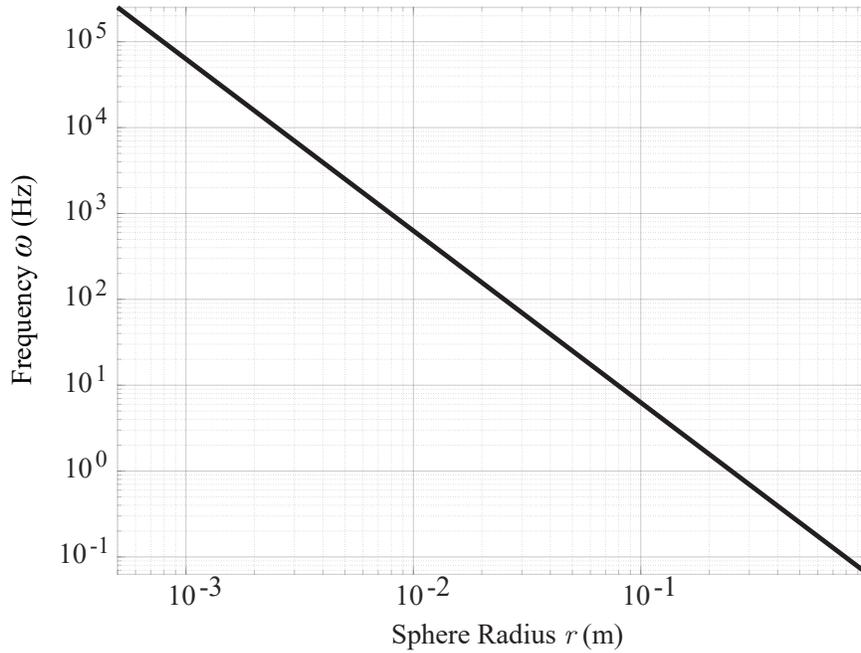


Figure S10: **Near-optimal frequency of magnetic-dipole rotation vs. aluminum-sphere radius.**

400 120,000 rpm (2,000 Hz) can be purchased from Maxon, although there would be practical challenges in  
 401 spinning a magnet so rapidly.

402 Using these optimal values, we can approximate the forces and the resulting accelerations that can be  
 403 imparted on aluminum pieces of various sizes by calculating the ratio of the eddy-current-induced forces  
 404 to the mass of the object (using a density of  $2,710 \text{ kg/m}^3$ ). Let us consider the same cubic NdFeB perma-  
 405 nent magnet used in our experiments, which has a side length of 51 mm and magnetic dipole strength of  
 406  $m = 138 \text{ A}\cdot\text{m}^2$ , as our dipole-field source. Such a magnet could be positioned and rotated by a robotic ma-  
 407 nipulator. Of course, it is easy to conceive of larger/stronger dipole-field sources, but since  $m$  effects force  
 408 quadratically and  $m$  is linear with respect to the magnet's volume, it will be easy to extrapolate these results  
 409 to a magnet of a different size via a magnet volume ratio. When the cubic magnet rotates rapidly about  
 410 arbitrary axes, it will conservatively sweep out a volume equal to its minimum bounding sphere, which has  
 411 a radius of  $\sqrt{0.75(51)^2} = 44 \text{ mm}$ . For a given piece of aluminum, we are only interested in permanent-  
 412 magnet positions in which the magnet's minimum bounding sphere does not collide with the aluminum  
 413 object. If this includes position for which  $\Pi_2 < 1.5$ , we should expect the results to be conservative (i.e.,  
 414 underpredict the actual forces). In Fig. S11, we show the expected  $\Pi_0$  values, forces, and accelerations for  
 415 each of the non-zero force components for three different sizes (i.e., diameters) of aluminum sphere (called  
 416 out in [12] and discussed above) as a function of the distance between the surface of the aluminum sphere

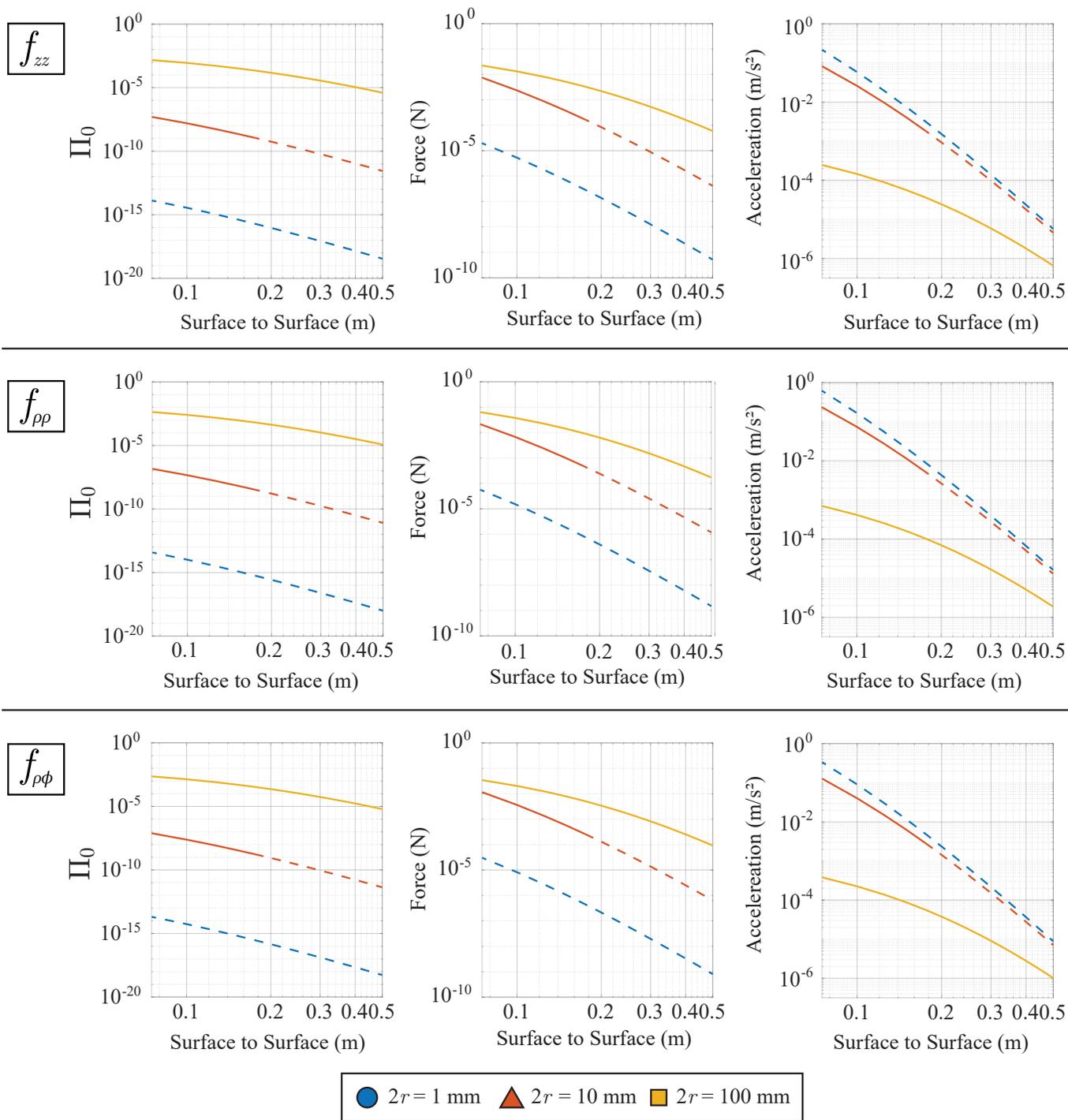


Figure S11: **Near-optimal forcing in each canonical direction—provided as  $\Pi_0$ , force, and acceleration—as a function of the surface-to-surface distance between the aluminum sphere and the minimum bounding sphere of the rotating cubic permanent magnet, for three different aluminum spheres.** Portions of the curves with dashed lines are extrapolations beyond the  $\Pi_2$  values used to develop our model.

417 and the surface of the cubic magnet's minimum bounding sphere (i.e.,  $d - r = 0.044$  m), using the  $\omega$  values  
418 from Fig. S10.

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