

## Perspective

## Prospect of Spin-Orbitronic Devices and Their Applications

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## SUMMARY

Science, engineering, and medicine ultimately demand fast information processing with ultra-low power consumption. The recently developed spin-orbit torque (SOT)-induced magnetization switching paradigm has been fueling opportunities for spin-orbitronic devices, i.e., enabling SOT memory and logic devices at sub-nano second and sub-picojoule regimes. Importantly, spin-orbitronic devices are intrinsic of nonvolatility, anti-radiation, unlimited endurance, excellent stability, and CMOS compatibility, toward emerging applications, e.g., processing in-memory, neuromorphic computing, probabilistic computing, and 3D magnetic random access memory. Nevertheless, the cutting-edge SOT-based devices and application remain at a premature stage owing to the lack of scalable methodology on the field-free SOT switching. Moreover, spin-orbitronics poises as an interdisciplinary field to be driven by goals of both fundamental discoveries and application innovations, to open fascinating new paths for basic research and new line of technologies. In this perspective, the specific challenges and opportunities are summarized to exert momentum on both research and eventual applications of spin-orbitronic devices.

## INTRODUCTION

The advancement of new communication technologies prompts the society functions into the surge of the information era. Energy-efficient and intelligent information processing is one of the keystone research fields in science, engineering, and medicine arena. For more than half a century, the ferromagnets (FMs) have been used to store information since the advent of magnetic hard disk drive. Practically, the magnetic information stored in the form of magnetic orientations has to be presented and manipulated in an electrical way before its applicable implementation. Early magnetic information was written and read by the Oersted field and the induction electromotive force generated via solenoid coils, respectively, which was inferior in energy efficiency and device scalability. Thanks to the advance of nanotechnologies, on the one hand, the reading issues were resolved by using more efficient magnetoresistance-type read head based on the specific revolutionary effect of anisotropy magnetoresistance (AMR), giant magnetoresistance (GMR), and tunneling magnetoresistance (TMR), which opened up the research area of spintronics (McGuire and Potter, 1975; Baibich et al., 1988; Binasch et al., 1989; Djayaprawira et al., 2005). On the other hand, in addition to the electrical detection of magnetization, the experimental realization of current-driven magnetization switching by spin-transfer torque (STT) in a magnetic tunnel junction (MTJ, i.e., an FM/barrier/FM structure, such as CoFeB/MgO/CoFeB, the resistance that depends on the relative magnetic orientation of the two FMs) has fueled intensive interests in spintronic community since 1996 (Berger, 2008; Slonczewski, 1996; Brataas et al., 2012). Taking the merits of TMR reading and STT writing of the perpendicular magnetic anisotropy (PMA) FM free layer in an MTJ, the scalable commercial perpendicular MTJ-based STT-magnetic random access memory (MRAM) was successfully produced by Everspin Technologies in August 2016 (Slaughter et al., 2016) and pilot production was further started on 28-nm 1-Gb STT-MRAM chips in June 2019 (Aggarwal et al., 2019). The STT configuration is schematically shown in Figure 1A, where a spin-polarized electrons flux is generated owing to the interaction of electron spins and the magnetization when the current passes through (or is reflected by) the FM reference layer, and thereby transfers spin angular momentum to the local magnetization  $\mathbf{M}$  of the FM free layer via tunneling barrier layer. This spin angular momentum gives an additional torque  $\tau_{STT}$  acting on the precessional magnetization dynamics expressed by the Landau-Lifshitz-Gilbert-Slonczewski (LLGS) equation (Slonczewski, 1996; Brataas et al., 2012):

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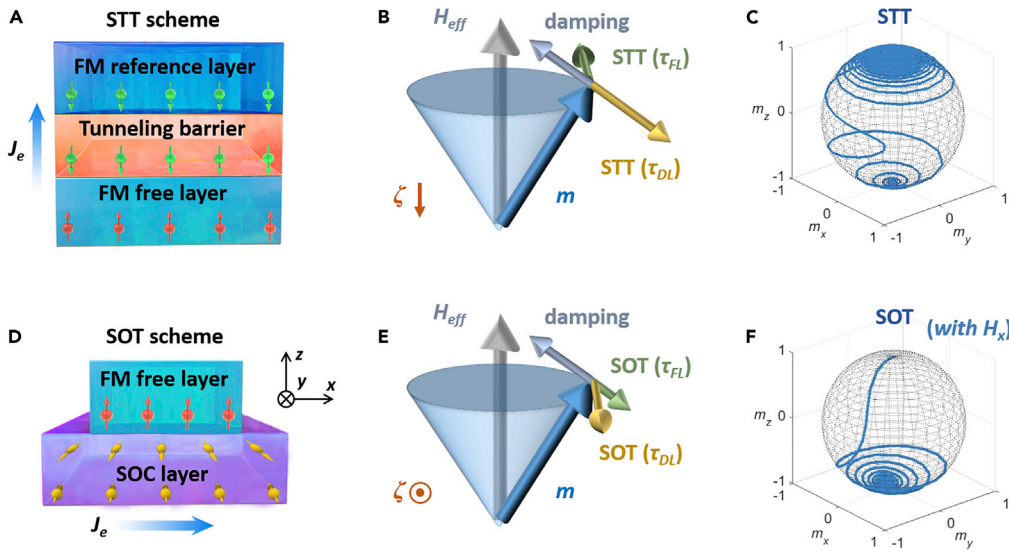
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<https://doi.org/10.1016/j.isci.2020.101614>





**Figure 1. Comparisons between STT and SOT Schemes**

Schematic (A–C) STT and (D–F) SOT-associated device configuration, damping and damping-like torque under effective magnetic field, and corresponding precession dynamic trajectories. Note that the damping-like SOT only drives the magnetic moment  $m$  toward an in-plane direction, hence an orthogonal external in-plane magnetic field  $H_x$  is generally required to break the symmetry and results in a deterministic SOT-induced magnetization switching.

$$\frac{dM}{dt} = -\gamma M \times H_{\text{eff}} + \frac{\alpha}{M_s} \left( M \times \frac{dM}{dt} \right) + \frac{\gamma}{\mu_0 M_s} \tau_{\text{STT}}, \quad (\text{Equation 1})$$

where  $\gamma$  is the gyromagnetic ratio;  $H_{\text{eff}}$  is the effective magnetic field determined by the external field, the anisotropy field, and the exchange fields;  $\alpha$  is the Gilbert damping constant; and  $M_s$  is the saturation magnetization of the FM free layer. Before the STT-induced switching, a sufficient thermal fluctuation is necessarily required, which deflects the magnetic moment from the static direction (e.g., the  $z$ -direction for a PMA type STT) with a small angle. As depicted in Figure 1B, the damping-like term of  $\tau_{\text{STT}}$  counter-interacts reversely to the damping torque that tends to align the magnetization toward the effective field direction, resulting in gradually widened precession radius before the magnetic moment finally switches to the other magnetization orientation. This results in a dilemma over the energy efficiency of STT-induced magnetization switching because the switching speed tends to be slow (about 1–10 ns, due to incubation precession as illustrated in Figure 1C) under a moderate current density; in contrast, a faster switching with less precession circles requires much larger current density (Kiselev et al., 2003). Furthermore, STT-MRAM suffers from the endurance issue since the ultra-thin tunneling barrier layer (typically 1–2 nm) between two FM layers is required to transmit large writing current at a high frequency.

Over the last decade, the experimental observation and progress of spin-orbit torques (SOTs) (Miron et al., 2011; Liu et al., 2012) induced magnetization switching has elaborated its potential to overcome the aforementioned technical hurdles that STT is encountering. Both the spin current generation and the magnetization switching mechanism of SOTs are different from the counterpart of STT scheme. Specifically, the generation of SOTs is originated from the fundamental spin-orbit coupling (SOC), a relativistic interaction of a moving particle with momentum  $p$  and spin vector  $\sigma$  in an electric field  $E$  potential. The Zeeman energy of the SOC can be expressed as (Manchon et al., 2015)

$$\hat{H}_{\text{SO}} \sim \mu_B (E \times p) \cdot \sigma / mc^2, \quad (\text{Equation 2})$$

where  $\mu_B$ ,  $m$ , and  $c$  are the Bohr magneton, the particle mass, and the speed of light, respectively. Depending on the origin of  $E$ , two main types of SOC effects have been observed in the solid state, i.e., the Dresselhaus SOC with  $E$  originates from the bulk inversion asymmetry (BIA) such as the asymmetry in crystal structures or strain induced deformations, whereas the Rashba SOC with  $E$  stems from the structural inversion asymmetry (SIA) such as the lack of spatial inversion symmetry at the interfaces or surfaces. Both Dresselhaus and Rashba SOC lock the spin to the momentum, and the spin-momentum locking

converts an in-plane charge current to a spin accumulation with non-equilibrium density at the surface or interface. Considering the Rashba SOC, the accumulated spin density is given by (Manchon et al., 2015)

$$\mathbf{S} = \alpha_R m (\mathbf{z} \times \mathbf{j}_e) / e\hbar, \quad (\text{Equation 3})$$

where  $\alpha_R$  is the Rashba parameter,  $\mathbf{z}$  is the out-of-plane unit vector,  $\mathbf{j}_e$  is the charge current density, and  $\hbar$  is the reduced Planck's constant, which is known as the Rashba-Edelstein effect (or the Edelstein effect, sometimes also called the inverse spin galvanic effect, iSGE, which describes the generation of a nonequilibrium spin density by a charge current) (Edelstein, 1990). Another typical scheme of charge-to-spin conversion the resulted from SOC is the spin Hall effect (SHE), a transport phenomenon that depicts that a charge current generates transverse spin currents and the spin polarization vectors of which are orthogonal to both charge and spin current directions. The SHE is ascribed to two plausible mechanisms, namely, the extrinsic (electrons scattering against spin-orbit coupled impurities, i.e., Mott scattering) and/or the electron trajectories deflection driven by the intrinsic SOC (Berry phase) (Sinova et al., 2015). The magnitude of SHE spin current density is given by

$$\mathbf{j}_S = \mathbf{j}_e \theta_{SH} \hbar / 2e, \quad (\text{Equation 4})$$

where  $\theta_{SH}$  denotes the spin hall angle, a coefficient that quantifies the strength of SHE. It is worth noting that the generated spin polarization vector points to the same direction regardless of whether it is derived from the Rashba-Edelstein effect and/or the SHE; even currently it is still ambiguous to rigorously differentiate and parse these two contributions to the charge-to-spin conversion (Fan et al., 2014a; Manchon et al., 2019; Yang et al., 2016). In fact, owing to the strong SOC with larger momentum  $\mathbf{p}$ , the heavy metal (HM) is extensively utilized in the experimental implementation systems of HM (Ta, Pt, W, etc.)/FM bilayers. To summarize, as illustrated in Figure 1D, the +/-x-direction in-plane charge current ( $\mathbf{j}_{e,x}$ ) in a strong SOC layer will generate a considerable interfacial spin current, i.e., a z-direction spin current  $\mathbf{j}_S^y$  with the spin polarization vector along -/+y, which brings SOTs onto its neighboring FM layer.

The generated SOTs acting on the precessional magnetization dynamics can be described by a similar form with Equation (1) as

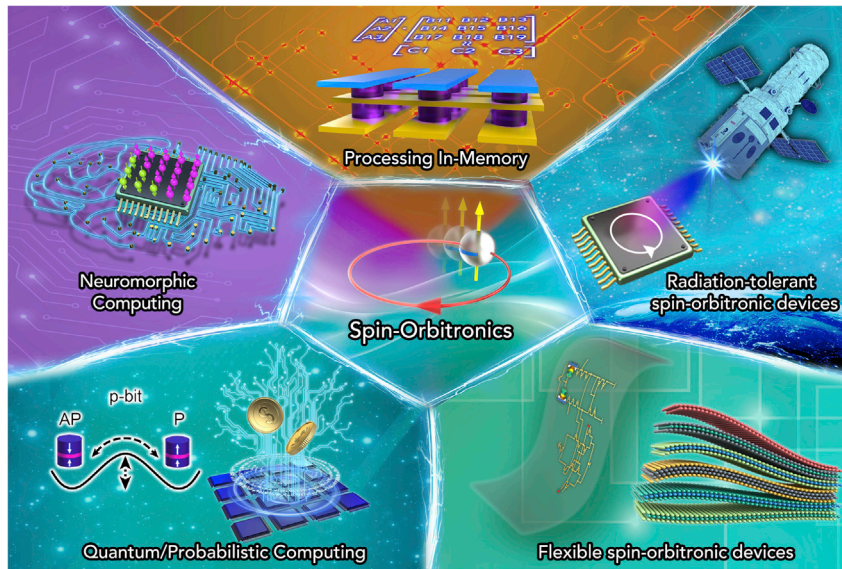
$$\frac{d\mathbf{M}}{dt} = -\gamma \mathbf{M} \times \mathbf{H}_{\text{eff}} + \frac{\alpha}{M_s} \left( \mathbf{M} \times \frac{d\mathbf{M}}{dt} \right) + \frac{\gamma}{\mu_0 M_s} \boldsymbol{\tau}_{\text{SOT}}, \quad (\text{Equation 5})$$

and both the  $\boldsymbol{\tau}_{\text{SOT}}$  here and the  $\boldsymbol{\tau}_{\text{STT}}$  in Equation (1) consist of a field-like term  $\boldsymbol{\tau}_{\text{FL}} \sim \mathbf{m} \times \boldsymbol{\zeta}$  that makes  $\mathbf{m}$  to precess around  $\boldsymbol{\zeta}$  and a damping-like term  $\boldsymbol{\tau}_{\text{DL}} \sim \mathbf{m} \times (\boldsymbol{\zeta} \times \mathbf{m})$  (Brataas et al., 2012; Manchon et al., 2019; Li et al., 2019; Zhang et al., 2017) that tends to align  $\mathbf{m}$  along  $\boldsymbol{\zeta}$ , where  $\boldsymbol{\zeta}$  is a unit vector determined by the incoming spin polarization. Particularly,  $\boldsymbol{\zeta}$  points z direction in the PMA STT configuration as depicted in Figure 1A; however,  $\boldsymbol{\zeta}$  aligns to y in the case of SOTs, as shown in Figure 1D. Hence, in contrast to the STT which damping-like term  $\boldsymbol{\tau}_{\text{DL}}$  competes with the damping torque collinearly and thereby undergoes considerable precessions, the  $\boldsymbol{\tau}_{\text{DL}}$  of SOT points perpendicular to the damping torque, as shown in Figure 1E, leading to much faster magnetization switching (Figure 1F) without the need of thermal fluctuation. The nonvolatile spin-orbitronic devices based on such SOC-originated transient magnetization dynamics are then capable of sub-nano second writing operations (which is comparable with the operation speed of a static random access memory, SRAM) with sub-picojoule energy consumption per bit (Garello et al., 2019b). Furthermore, the endurance and stability of the spin-orbitronic devices are much better than the spintronic devices based on STT-MTJ, owing to the separation of the relatively large in-plane writing current and the harmless small out-of-plane tunneling reading current in a three-terminal SOT-MTJ.

Upon a decade of fundamental research efforts, the spin-orbitronic devices based on SOT technologies are undergoing rapid development from laboratory investigations to engineering practice. In this perspective, first, the emerging applications of spin-orbitronic devices are specifically introduced. Then, we summarize the latest advancements in SOT research and highlight the main challenges for practical devices development. Finally, new opportunities for future spin-orbitronic devices in the new decade are discussed in detail.

## EMERGING SPIN-ORBITRONIC DEVICES APPLICATIONS

The STT-based spintronic devices have already demonstrated their commercial value as recently announced mass production of the eMRAM to replace the existing NOR Flash embedded memories (Sato et al., 2018a). Owing to the consolidated superior performance, SOT-based spin-orbitronic devices



**Figure 2. Schematics of Representative Emerging Spin-Orbitronic Device Applications**

are naturally expected to complement and extend nonvolatile memory applications as SOT-MRAM. In addition, as human society steps into the era of big data, artificial intelligence, quantum computing, and internet of things, there are also promising opportunities for the nonvolatile spin-orbitronic devices with ultrafast dynamics controllability, excellent energy efficiency, almost unlimited endurance, outstanding stability, radiation resistance, and validated CMOS-compatibility to be explored in related emerging applications as exemplified in Figure 2.

### Processing in Memory

With the current von Neumann architecture, the conventional computation and storage are separately operated in the processor (i.e., a central processing unit, CPU) and the memory (i.e., static/dynamic random access memories, SRAM/DRAM), respectively. Data have to be transported frequently between the volatile CPU, SRAM, and DRAM and finally be stored in a nonvolatile hard disk drive, where there are deteriorating speed gaps between CPU and memory hierarchy units. In many cases, the data movement consumes even more time and energy than the computation. These “memory wall” or “von Neumann bottleneck” problems present to be a paramount hurdle to futuristic data processing computation, especially for the growing data-centric tasks, such as image and voice recognitions (Zidan et al., 2018). The concept of processing in-memory (or in-memory processing/computing) with stateful resistance-resistance (*R-R*) logics is then proposed to tackle the above issues by designing systems that implement computing within the memory (Ielmini and Wong, 2018). Typically, the nonvolatile memories with time- and energy-efficient processing capabilities are thereby extensively pursued. The candidates include memristor-based resistive switching RAM (RRAM) (Jo et al., 2010), phase change memory (PCM) (Kuzum et al., 2012), ferroelectric RAM (FeRAM) or tunnel junction (FTJ) (Mikolajick et al., 2001; Chanthbouala et al., 2012), and STT-as well as SOT-MRAMs (He et al., 2018). The RRAM and the PCM are usually regarded as potential candidates for in-memory processing owing to their large on/off ratio (resistance ratio between the high and the low resistance states, generally >1,000%) and feasibility of fabricating large crossbar arrays; however, their switching variability (including circle-to-circle or device-to-device variabilities) and resistance instability issues, together with their ambiguous underlying physics, have to be addressed before being utilized for large-scale practical applications.

The SOT-MRAM demonstrates more competitive operation speed, resistance consistency, and energy efficiency performance, in particular the superior endurance characteristics. Remarkably, the endurance of an SOT-MTJ has been experimentally verified up to  $10^{12}$  and can be as high as  $10^{16}$  in theory (Baumgartner et al., 2017), making it specifically capable of processing applications, which requires much more rewriting operations than a generic data storage RAM. However, as one of the most promising building blocks for in-memory processing, spin-orbitronic SOT-MTJ devices are still facing major challenges to be completely

explored and utilized, such as the moderate on/off ratio and the three-terminal architecture nature. Briefly, the TMR value is defined as  $(R_{ap} - R_p)/R_p$ , where  $R_{ap}$  and  $R_p$  are the respective resistance when the magnetization of the free FM layer is antiparallel or parallel to the reference FM layer (Djayaprawira et al., 2005). Although 604% TMR was achieved in an in-plane MTJ (Ikeda et al., 2008), the typical TMR values for perpendicular CoFeB/MgO/CoFeB junctions are usually falling into a range of 100%–200%. Besides, the cell architecture and algorithm challenges in connecting the three-terminal SOT-MTJs have to be addressed with a similar form as conventional memristor crossbar arrays, which consist of multiple two-terminal memristive intersections between orthogonal row and column electrodes and thereby can realize parallel in-memory processing following the universal Kirchoff's law and Ohm's law. Considering this, novel designs of in-memory logic gates based on three-terminal SOT-MTJs (Wang et al., 2018d; Shreya et al., 2020; Zhang et al., 2020b), as well as attempts of two-terminal SOT-MRAM cells (Sato et al., 2018b; Wang et al., 2018a), have been demonstrated recently. As a concluding remark, the robust processing-in memory circuit with low standby power, re-configurable flexibility, and highly parallel computing characteristics are desired with unleashing spin-orbitronic memory and logic devices potential.

### Neuromorphic Computing

Similar to in-memory processing, the neuromorphic computing is another non-von-Neumann processing approach, which aims specifically at solving artificial intelligence tasks with much better efficiency. Inspired by the working principle of human brain, a neuromorphic computing process involves the learning (or training) and the inference sections, and various working models including artificial/spiking/recurrent neuron networks (ANN/SNN/RNN) with respective algorithms have been proposed and established (Xia and Yang, 2019). The present developed learning processes are typically categorized into the supervised learning with large amount of labeled training samples, as well as the highly pursued unsupervised learning by clustering data without label (Wang et al., 2018c). Regardless of the above algorithm and circuits issues, from the device point of view, the primary artificial synapses and neurons are prerequisite components in building up a neuromorphic computing system generally.

In particular, an artificial synapse requires multilevel differentiated nonvolatile states, e.g., a memristive device, to store synaptic weights via implementing the analog of a variable resistor. Although spin-orbitronic devices show better performance indexes over other memristor candidates, however, the characteristic binary resistance nature of generic MTJ makes it difficult to proceed implementing as a multilevel synapse rather than a stochastic binary synapse (Grollier et al., 2020). One representative solution is to utilize the current-induced domain wall motion within the FM free layer (Sengupta et al., 2015a; Lequeux et al., 2016; Yue et al., 2019; Yang et al., 2019c; Siddiqui et al., 2019; Azam et al., 2020; Zhang et al., 2019b), for instance, by tuning the pinning potential of FM domain wall motions, SOT-induced multilevel magnetization switching as well as the typical synaptic functionality of spike-timing dependent plasticity (STDP) have been experimentally demonstrated (Cao et al., 2019). Other strategies include the fine-magnetic domain switching in antiferromagnetic (AFM) (Wadley et al., 2016; Olejnik et al., 2017; Shi et al., 2020) or AFM/FM (Liu et al., 2020b; Zhou et al., 2020; Yun et al., 2020) heterostructures where multiple  $\sim 100$  nm-sized binary FM domains fixed by the polycrystalline AFM could reverse independently under the applying current (Fukami et al., 2016; Kurenkov et al., 2017; Borders et al., 2016) and the SOT-induced skyrmion (a topological magnetic state) motions where the number of skyrmions within the signal reading area is proposed to represent the analog synaptic weight (Song et al., 2020a). In addition to the above efforts that try to form holistic multilevel magnetization by combining in-plane distributed binary magnetic solitons, which are difficult to achieve scalable multilevel spin-orbitronic synapses, the methodologies of innovating multilevel magnetization with out-of-plane multilevel mechanisms might be more practical and warrant more reliable solutions (Hong et al., 2018; Hu et al., 2020; Sheng et al., 2018b).

In parallel to synapses development, an artificial neuron receives and outputs stimulus signals from/to its multiple surrounding artificial synapses and adjusts their synaptic weights synchronously. As to the conventional ANN systems, the role of artificial neurons could even be replaced by setting nonlinear activation functions, whereas the SNN for unsupervised learning requires artificial neurons with leaky integrate-and-fire (LIF) (Stoliar et al., 2017; Chen et al., 2018d) behaviors that response occurs only at the integrated stimulus above a certain threshold. Electrically controlled spin-orbitronic devices with a clear critical magnetization switching current are therefore capable of mimicking such artificial neurons in principle (Diep et al., 2014; Sengupta et al., 2015b; Kurenkov et al., 2019), but the magnetization states of such nonvolatile neurons may have to be initialized after each fire. The volatile spin-torque nano-oscillator

(STNO) (Torrejon et al., 2017; Farkhani et al., 2019; Liang et al., 2020), a specific type of STT-MTJ that oscillates spontaneously with a low d.c. current-tunable precession amplitude and finite magnetization relaxation, has recently been experimentally demonstrated as an efficient artificial neuron for speech recognition owing to its stability, low noise, and high nonlinearity of frequency and amplitude. As the spin-orbitronic version of STNO, spin hall nano-oscillators (SHNOs) had been also developed to implement as neurons (Sato et al., 2019; Zahedinejad et al., 2020); however, as depicted in Figure 1E, the relationship between the magnetic damping and the SOT-induced in-plane damping-like torque in a PMA-FM is not as symmetrical as the case of STT shown in Figure 1B; hence, challenges and new opportunities coexist in proposing such an artificial neuron based on the PMA SHNO (Fulara et al., 2019) in the absence of an in-plane magnetic field. Moreover, the demonstration of new bio-inspired neurons should also provide new opportunities beyond current neuromorphic computing principles, for example, to realize the logic gate of exclusive OR (XOR) in a single spin-orbitronic device, which can imitate the newly found linearly nonseparable input-output behaviors of layer 2/3 pyramidal neurons in human brain and thereby offers novel intelligent functionalities (Gidon et al., 2020). Besides, further algorithms and interconnection innovations are also desired for future practical large-scale neuron networks based on spin-orbitronic synapses and neurons.

### Probabilistic Computing

Connecting the classical digital computing based on deterministic bits of 0 or 1 and the quantum computing based on quantum bits (q-bits) with coherent superpositions of 0 and 1, there is an intermediate approach of probabilistic computing that relies on sampling probabilistic bits (p-bits) with spontaneously fluctuated states of either 0 or 1 (Chowdhury et al., 2019). In the current new era of noisy intermediate-scale quantum (NISQ) technology, a period that the noise in quantum gates limits the size of quantum circuits (Preskill, 2018), which is far from the eventually accurate, fully fault-tolerant quantum technologies in the future, the probabilistic computing with interconnected p-bits can be practically useful in a host of quantum computing applications, such as solving satisfaction, optimization (e.g., the traveling salesman problem, the integer factorization, and the invertible logics), and sampling problems (Sutton et al., 2017; Grollier et al., 2020). The hardware construction of p-bit can be exactly realized by utilizing the low-barrier nanomagnet (LBNM), a single domain magnet or superparamagnetic particle whose magnetization reverses randomly when the barrier between opposite magnetic states is comparable with the thermal energy ( $H_K M_s V/2 \approx k_B T$ , where the five quantities are the anisotropy field, the saturation magnetization, the volume, the Boltzmann constant, and the absolute temperature, respectively) (Camsari et al., 2017). MTJ with an LBNM as its free layer has been demonstrated as a high-speed p-bit, the time average state (resistance) of which can be modulated by an electric current via STT or SOTs (Borders et al., 2019; Debashis et al., 2020), and the hardware Boltzmann machines with stochastic neuron networks consisting of such asynchronously tunable correlated p-bits are thereby capable of searching the vast phase space of hard problems by utilizing the modified adiabatic quantum computing algorithms. Unlike the existing delicate q-bits that generally work at ultralow temperature for quantum computing, such LBNM-based p-bits work at room temperature and can be convincingly modified from the market-ready MTJ technology. Nevertheless, the performance reproducibility of LBNMs should be enhanced and further investigations on zero-field SOT-induced modulation of a PMA LBNM are also expected with the involvement of multidisciplinary fields.

In a broad sense, spintronic probabilistic devices are not limited to the fluctuated LBNMs. The stochastic behaviors can also be found in non-deterministic current-induced magnetization switching processes (Grimaldi et al., 2020), enabling to be exploited for probabilistic computing. Particularly, since thermal activation plays an important role in the STT-induced switching dynamics, the magnetization is not amenable to be switched at a low current regime and the switching probability increases with growing current density and pulse duration. Interestingly, the STT-based stochastic synapses and neurons performing with short and low current pulses are then proposed to reduce the energy consumption of a neuron network (Sengupta et al., 2016; Ignatov et al., 2017; Vincent et al., 2015). The SOT-induced switching of a PMA-FM possesses unique stochasticity, where the switching probability of a specific switching sense (i.e., a down  $\rightarrow$  up or an up  $\rightarrow$  down magnetization switching for a fixed  $j_x$ ) depends on the direction and the magnitude of external in-plane magnetic field applying along the current channel. In the absence of external magnetic field, in principle, there should be a perfectly 50%:50% chance for a PMA-FM (regardless of the initial magnetization state) to switch toward either the down or the up magnetization state, which makes single domain PMA SOT device a natural binary true random number generator (TRNG) (Kim et al., 2015; Liu et al., 2018; Chen et al., 2018a). Besides, the physical unclonable functions (PUFs) (Gao et al., 2020) can also be

proposed by a matrix of PMA spin-orbitronic devices with the above non-deterministic zero-field SOT switching properties (Finocchio et al., 2019), which provides additional advantages over other PUF technologies in non-volatility, reconfigurability, and scalability toward the new type of keystone for maturing probabilistic computing. Further out on the roadmap with certain achieved milestones, the promise of probabilistic computing is intriguing, while it is apparently still at its infancy stage. The ultimate goal is to aim to realize probabilistic computing with reliable spin-orbitronic devices-based hardware realization from algorithms to predictive circuit models.

### Avionics and Internet of Things

In the short term, rather than challenging the stand-alone memories such as Flash and DRAM, which possess the steady productions and complete supporting software, the emerging spin-orbitronic devices are gaining momentum and finding their priorities in the embedded nonvolatile memory market, such as emerging applications in the fields of avionics and internet of things (IoT), which are requiring processing and memory at the edge of advanced networks as well as at the endpoints. Particularly, the devices used in the aerospace are required to be radiation resistant to cosmic rays. Since MTJs are equipped with intrinsic magnetic immunity to radiation effect (Kobayashi et al., 2014; Hughes et al., 2012; Ren et al., 2012; Park et al., 2019), MRAMs have already been used in satellites early in March 2008 (Greenemeier, 2008). Moreover, featured with almost unlimited endurance, spin-orbitronic devices are particular favorable to be applied in avionics, e.g., a spacecraft, which may travel more than tens of years in the universe.

On the other hand, IoT is a compelling platform connecting trillions of smart objects for sensing, collecting, memory, analyzing, and communication. The stability, endurance, and energy efficiency are generally concerned for the edge equipment connected in an IoT system, and all these requirements could be exactly fulfilled with applicable spin-orbitronic devices (Liu et al., 2019d). In addition to the magnetoresistance sensors that have already been widely used, sub-field researches on novel spin-orbitronic devices are desired for versatile specific IoT applications, including flexible SOT devices for wearable equipment (Lee et al., 2015), SOT-driven antiferromagnetic memories for security and magnetic field-immune applications, as well as spin-orbit THz emitters utilizing the ultrafast spin dynamics and the inverse spin Hall effect (ISHE) in FM/HM bilayers for rapid data communications (Kampfrath et al., 2013; Seifert et al., 2016; Wu et al., 2017). Besides, spin-orbitronic devices based on MTJs could also harvest the heat dissipation on a chip or from the environment and generate sufficient thermopower by magneto-Seebeck effects (Liebing et al., 2011; Walter et al., 2011; Boehnke et al., 2017; Tu et al., 2020; Friesen et al., 2019). In summary, the discovery of SOT-induced electrical manipulation of ferromagnet may be just a beginning and the party of spin-orbit related researches and applications will continue to prosper.

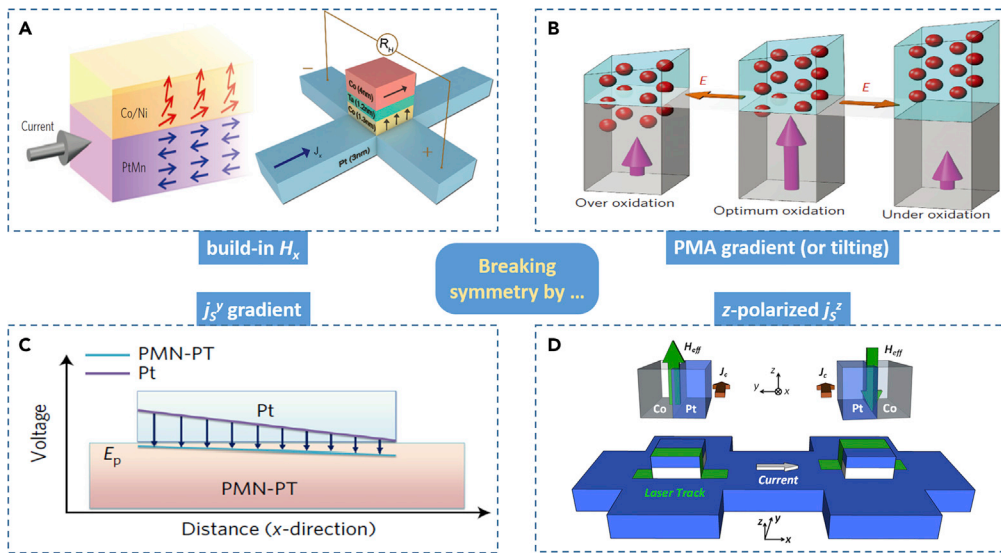
## KEY CHALLENGES FOR SPIN-ORBITRONIC DEVICES

### Realizing Field-free SOT Switching in a Scalable Way

As illustrated in Figure 1E, the  $\pm y$ -polarized spin current-induced  $\tau_{DL}$  alone will eventually align the magnetic moment  $m_z$  toward in-plane ( $\pm y$ -direction) orthogonal to the electric current ( $\mp x$ -direction); hence, an external in-plane magnetic field  $H_x$  is generally essential and prerequisite to break the symmetry and thereby realize the deterministic SOT-induced magnetization switching of PMA free layer in HM/FM structures (Emori et al., 2013). However, it is not applicable to introduce “bulky” and dissipative magnets into an SOT-MRAM for generating an assistive in-plane magnetic field, which goes counter to the demanding trend of data scalability and energy efficiency. As summarized in Figure 3, some representative symmetry breaking methods via generation or engineering of either magnetic field  $H_x$ , magnetic anisotropy  $H_K M_s/2$ , or spin-orbit current  $j_S$ , had been proposed to demonstrate magnetic field-free SOT-induced perpendicular magnetization switching. They are categorized as following four major schemes.

#### By Embedding the $H_x$ within the Stacks

“T-type” magnetically coupled stacks consisting of a PMA-FM free layer and an in-plane FM or AFM pinning layer were designed, wherein the in-plane interlayer exchange coupling field (i.e., HM/PMA-FM free layer/spacer layer/in-plane FM pinning layer structure) (Lau et al., 2016; Sheng et al., 2018a; Bekele et al., 2020; Cao et al., 2019) or the in-plane exchange bias field (e.g., HM/FM/AFM structure or AFM/FM bilayer when the AFM is a strong SOC alloy such as PtMn or IrMn and thereby also works as the spin-orbit current source) (Fukami et al., 2016; Oh et al., 2016) acting on the PMA-FM free layer plays as a built-in assistive magnetic field for a deterministic SOT-induced magnetization switching.



**Figure 3. Strategies for Realizing Magnetic Field-free SOT Switching**

Representative symmetry breaking methods via generation or engineering of either (A) magnetic field  $H_x$  (Fukami et al., 2016; Cao et al., 2019), (B) magnetic anisotropy (Yu et al., 2014), or (C and D) spin-orbit current  $j_s^z$  (Cai et al., 2017; Cao et al., 2020).

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### By Engineering the Spatial Asymmetry in the Magnetism (e.g., $H_K$ or $m_z$ )

Magnetic field-free SOT switching was reported in samples containing either a wedged HM layer, a wedged FM layer, or a wedged oxide capping layer with spatial gradient thicknesses (Chen et al., 2018c; You et al., 2015; Wu et al., 2020a; Yu et al., 2014). Although the exact mechanism remains unclear (Akyol et al., 2015), a gradient of the PMA or the saturation magnetization was thought to be responsible for the deterministic SOT switching. In other cases, the easy axis of the PMA-FM was tilted away from the out-of-plane direction either by annealing the sample under an in-plane magnetic field (Kong et al., 2019) or by epitaxially depositing the SrIrO<sub>3</sub>/SrRuO<sub>3</sub> bilayer with tilted magnetocrystalline anisotropy on a (001)-oriented SrTiO<sub>3</sub> substrate (Liu et al., 2019c). Among them, each engineering methodology warrants sufficient asymmetry in the PMA for the field-free SOT-induced magnetization switching.

### By Creating a Spin Current Gradient $dj_s^y/dx$

Hybrid ferroelectric (FE, such as PMN-PT) substrate/HM/PMA-FM stack structures were used to generate a gradient  $j_s^y$  when the FE was electrically polarized parallel with the electric current (x-direction) (Cai et al., 2017; Yang et al., 2019b). The conventional HM/PMA-FM devices constructed with a wedged HM thickness or an in-plane wedge-patterned channel can also lead to a gradient  $j_s^y$  via the gradient electric current (Chen et al., 2019a; Yang et al., 2019a). Such x-direction gradient in  $j_s^y$  produces an additional torque  $\sim M \times (dj_s^y/dx)$  to the LLG equation and results in deterministic magnetization switching.

### By Using an Out-of-Plane Polarized Spin-Orbit Current $j_s^z$ Instead of the Conventional In-Plane Polarized $j_s^y$

Deterministic current-induced magnetization switching was obtained in an in-plane FM/Ti/PMA-FM structure where a z-polarized spin-orbit current  $j_s^z$  was generated from the in-plane FM/Ti interface via spin-orbit precession (Baek et al., 2018a). It was also reported that the spin-orbit current from low symmetry Weyl semimetals (e.g., WTe<sub>2</sub> and MoTe<sub>2</sub>) show out-of-plane spin polarization vectors (Macneill et al., 2017; Song et al., 2020b), whose effectiveness to a field-free magnetization switching for PMA-FMs remains to be experimentally examined. Zero-field current-induced magnetization switching was also demonstrated by combining the STT and the SOT, the interplay of which gives a compromised solution that shows better switching speed than the pure STT scheme, as well as allows the design of a two-terminal SOT-MTJ (Sato et al., 2018b; Wang et al., 2018a). However, the switching contribution from the perpendicular STT current and its damage to the fragile tunneling barrier have to be balanced. Most recently, a novel lateral SOT was



demonstrated in locally laser annealed Pt/Co/Pt trilayers, where  $j_S^2$  was generated from the laser-induced lateral local Pt-rich region inside the nominal Co layer (Cao et al., 2020). The current-induced an out-of-plane effective field and thereby zero-field magnetization switching was then achieved, the switching sense of which depends only on the relative location of the Pt-rich and the Co-rich regions, regardless of the net spin polarization of external spin current from both the bottom and the top Pt layers. The complementary spin-orbit building blocks analog to the n- and p-type semiconductors were then demonstrated by using a pair of lateral SOT devices with opposite laser annealing locations (Zhang et al., 2020a).

Despite the successful laboratory demonstration of the above proposals for field-free SOT-induced magnetization switching, however, the further high-demanding optimization on their industrial applicability is required since most of these methods involve either an in-plane FM, a canted magnetization in the PMA-FM, unconventional device shapes or structures, or multiterminal (terminal number >3) devices, which may challenge the fabrication feasibility or data scalability of an external field-free SOT-MRAM. Competing spin currents from the Pt/W bilayers with opposite signs in the spin Hall angle was reported as an integration-friendly method for realizing field-free SOT induced magnetization switching in Pt/W/PMA-FM structures with proper Ta and Pt thicknesses (Ma et al., 2018), but the underlying mechanism is still unclear (Chen et al., 2020a; Wu et al., 2020b), which is hard to gain deeper insights into any of the above four symmetry breaking ways. Most recent data on deterministic SOT-induced magnetization switching by inserting a slightly asymmetric light-metal layer between the HM and the FM interface was also claimed as a quite scalable approach, the exact explanation of which remains elusive as well (Razavi et al., 2020), since counter-intuitive uniform PMA was observed across all devices on the wafer. New CMOS process compatible approaches and strategy along with plausible understandings of field-free spin-orbitronic devices physics are urgently desired to be explored.

### Enhancing the Energy Efficiency by Materials Engineering

For a spin-orbit memory cell with given device size, the energy consumption per writing operation scales with  $j_{pt}^2$ , i.e., the square of critical switching current density, the resistivity of SOC layer, and the effective duration of switching pulse. The last term “t” can be reduced by replacing the FM with AFM systems such as synthetic AFMs and compensated ferrimagnets (Zhang et al., 2018; Cai et al., 2020), which shows much faster switching and domain wall motion speed. Anyway, in conventional HM/FM (HM = Pt, Pd, Ta, W, Hf, etc.; FM = Co, CoFe, CoFeB, etc.) structures, the  $j_{er}$ , which are generally reported as  $10^6$ – $10^8$  A/cm<sup>2</sup> are highly requiring to be reduced to achieve better energy efficiency. In particular, the PMA strength and the damping-like SOT efficiency are two contrary factors that determine the  $j_{er}$ , and the damping-like SOT efficiency in an HM/FM system scales with the charge-to-spin conversion efficiency (represented by the spin Hall angle  $\theta_{SH}$ , as aforementioned in the Introduction section) in the HM as well as the interfacial spin transparency ( $T_{int}$ ) between the HM and the FM, at the interface of which the spins may be reflected (Zhang et al., 2015) or depolarized (Rojas-Sánchez et al., 2014; Tao et al., 2018; Zhu et al., 2019a). Therefore, enhancing the effective spin Hall angle  $\theta_{SH,eff} = \theta_{SH}T_{int}$  via materials and device engineering is considered as a key solution to improve the energy efficiency of spin-orbitronic devices, as summarized below.

#### By Modifying the HM Layer and the Interface

It is worth noting that the  $\theta_{SH,eff}$  must be balanced with the resistivity  $\rho$ , hence an approximate figure of merit (FOM) for the switching power density  $P_{SW,FOM} \sim \rho/(\theta_{SH,eff})^2$  was suggested for estimating the overall power consumption per cross area (Manchon et al., 2019). Therefore, among conventional HMs that are commonly used for SOTs, Pt with moderate  $\theta_{SH}$  but much smaller resistivity is more favorable than Ta and W. But the measured  $\theta_{SH}$  (or  $\theta_{SH,eff}$ ) values from Pt in the range of 0.37%–14% should be further increased for practical application (Kimura et al., 2007; Ganguly et al., 2014; Nguyen et al., 2016a; Rojas-Sánchez et al., 2014; Nakayama et al., 2013; Liu et al., 2011; Althammer et al., 2013; Choi et al., 2017). Considering that the intrinsic  $\theta_{SH}$  in a 5d metal increases proportionally with the resistivity due to enhanced scattering, impurities such as Al, Hf, Au, and MgO were doped as scattering centers into the Pt layer, where enhanced Pt resistivity and consequently the strengthened SOTs were obtained (Nguyen et al., 2016b; Zhu et al., 2018, 2019c). Other resistivity engineering methods, including adjusting the HM thickness (Nguyen et al., 2016a) or adjusting the deposition conditions (Zhang et al., 2016a; Lee et al., 2017) were also examined to be effective in promoting the SOT efficiency. It is noteworthy that the interface-originated spin-orbit current is supposed to be an important contribution factor to significantly enhance SOTs with Pt resistivity slightly increased, since more current is concentrated near the Pt/FM interfaces. The interfaces were further confirmed as prominent sources for generating substantial SOTs in Pt(O)/FM, W(O)/FM,

NiFe/Cu(O), Pt/CoFeB/MgO/SiO<sub>2</sub>, and Pt/Co/TiO<sub>x</sub> structures with highly resistive or insulating oxygen-incorporated metals (An et al., 2016, 2018b; Qiu et al., 2015; Bekele et al., 2018; Demasius et al., 2016). More specific interface modifications by using Cu, Ti, or Hf insertion layers between the HM and the FM layers were also performed (Rojas-Sánchez et al., 2014; Huang et al., 2015; Lee et al., 2019; Shi et al., 2018; Zhu et al., 2019b), where improved interfacial spin transparency  $T_{int}$  and thereby enhanced  $\theta_{SH,eff}$  were obtained. Besides, the oxide/HM interface can also contribute to the overall SOTs in an oxide/HM/FM structure in terms of efficiency and direction (Sheng et al., 2019; Li et al., 2020).

### By Using Strong SOC Materials Other than HM

In addition to HMs, HM-based alloys, and metal oxides, various alternative materials including semiconductors, van der Waals crystals, and topological materials have been proposed as potential spin-orbit-induced spin current sources; the highly relevant literature reported on  $\theta_{SH,eff}$ ,  $\rho$ , and  $P_{SW,FOM}$  are summarized in Table 1. Particularly, in semiconductor/FM heterostructures such as GaAs/Fe and paramagnetic (Ga,Mn)As/Fe bilayers, SOTs that originated at the interfaces were elucidated in detail (Chen et al., 2016, 2018b). Some layered van der Waals crystals also exhibit strong SOC and an appreciable range of broken crystal symmetries; most recently, the strong spin-orbit current and efficient SOTs were observed in transition metal chalcogenide (TMD)/FM heterostructures involving MoS<sub>2</sub> (Xie et al., 2019), WSe<sub>2</sub> (Shao et al., 2016), Dirac semimetal PtTe<sub>2</sub> (Xu et al., 2020), or Weyl semimetal WTe<sub>2</sub> (MacNeill et al., 2017; Shi et al., 2019; Li et al., 2018; Zhao et al., 2020) and MoTe<sub>2</sub> (Song et al., 2020b). Topological insulators (TIs) of Bi<sub>1-x</sub>Sb<sub>x</sub> and their chalcogenides (X<sub>2</sub>Q<sub>3</sub>, X = Bi, Sb, Bi<sub>1-x</sub>Sb<sub>x</sub>; Q = Se, Te) with strong spin-momentum locking in the conductive surface are expected as promising source of SOTs (Khang et al., 2018; Wang et al., 2017; Mahendra et al., 2018; Chen et al., 2020b; Han et al., 2017). The reported  $\theta_{SH}$  in such TIs can exceed 100%, offering the superior efficiency of the SOTs over the STT, which bears the limited charge-to-spin conversion efficiency 100% in maximum. Highly efficient SOT-induced switching of perpendicular magnetized MnGa with a  $j_e = 1.5 \times 10^6$  A cm<sup>-2</sup> was observed by using conductive topological insulator Bi<sub>0.9</sub>Sb<sub>0.1</sub> thin film with a high conductivity ( $>2.5 \times 10^5$  Ω<sup>-1</sup>m<sup>-1</sup>) and a large  $\theta_{SH,eff}$  (~5,200%) (Khang et al., 2018). In the case of a sputtered Bi<sub>x</sub>Se<sub>1-x</sub>/CoFeB bilayer on the Si/SiO<sub>2</sub> wafer (Mahendra et al., 2018), the  $j_e$  had been lowered to as low as  $4.3 \times 10^5$  A/cm<sup>2</sup>. The open questions for these TI-based spin-orbitronic devices keep remaining, including the challenge in reproducible large area industrial fabrication, the structurally and chemically thermal stability, the compatibility with PMA-FM, and the issues at the interface where the uncertainty in TI surface conductivity as well as the possible interfacial orbital hybridization or chemical changes have to be considered.

### Integration Challenges

Nowadays, the spin-orbitronic devices are encountering major on-chip integration challenges pertaining to scaling compatibility, energy efficiency, interfacing circuit design, etc., which challenge both two-terminal and three-terminal schemes in device, cell, and system levels. Among them, one typical challenge is the integration of SOT-MTJ with CMOS, where there is an extra SOC layer compared with an STT-MTJ. Briefly, a CMOS-compatible SOT-MTJ process flow is as follows. Upon availability of high-quality MTJ stacks consisting SOC layer via employing physical vapor deposition (PVD, e.g., sputtering), specifically designed SOT-MTJ masks are required to define the MTJ element pillar using deep immersion (e.g., 193 nm) lithography before the etching module by ion beam etching. Note that the quality and fabrication reproducibility of the stacks primarily depend on the properties of the SOC layer, FM free layer, and barrier layer, as well as interfaces formed in the module. The dedicated chamber with atomic level precision (~0.1 Å) one-step deposition helps to improve films quality control, i.e., stoichiometry, integrity, defectivity, and uniformity, eventually to reproducibly achieve the target SOT and magnetization switching efficiency, resistance-area product, and TMR characteristics (Qiu et al., 2018; Ramaswamy et al., 2018). Typically, the top pinned MTJ consists of SOC layer/CoFeB/MgO/CoFeB/SAF perpendicularly magnetized stacks, where typical β-W or Ta-based electrode works as SOC layer (Garello et al., 2019a). Hence, specific stop etching conditions have to be developed to enable the SOC layer intact with dedicated endpoint detection mode while patterning the MTJ pillar without producing re-deposition clusters, which would form sidewall shorts across the MgO barrier layer. Subsequently, the SOC layer is etched to form the two or three terminals device, and the gap filling is to be implemented following with chemical mechanical planarization. Also note that most recently reported SOTs in various single magnetic layers could help to facilitate the development of SOT-MTJs without the SOC layer (Wang et al., 2012; Amin et al., 2019; Luo et al., 2019b; Liu et al., 2020a; Zhang et al., 2020a; Tang et al., 2020; Cao et al., 2020). Eventually, a dual damascene Cu or TiN electrode will be fabricated to complete the electrical connection for routing and testing.

Materials	$\theta_{SH}$ (%)	$\rho$ ( $10^{-8} \Omega \text{ m}$ )	$P_{SW,FOM}$ ( $10^{-5} \Omega \text{ m}$ )	Method	Reference
Metals					
Pt	0.37	15.6	1,139.52	NLD	(Kimura et al., 2007)
	2.2	28	57.85	ST-FMR	(Ganguly et al., 2014)
	4	86	53.75	SMR	(Nakayama et al., 2013)
	5.6	20	6.38	ST-FMR	(Liu et al., 2011)
	5.6	17.3	5.52	SP	(Rojas-Sánchez et al., 2014)
	8.5	28	3.88	DC	(Ganguly et al., 2014)
	11	32.8	2.71	SMR	(Althammer et al., 2013)
	12	50	3.47	SHM	(Nguyen et al., 2016a)
	14	31	1.58	SMR	(Choi et al., 2017)
	Pd	0.8	27	421.88	ST-FMR
1.2		20	138.89	SP	(Vlaminck et al., 2013)
$\alpha$ -Hf	7 <sup>a</sup>	156.25	31.89	SMR	(Liu et al., 2015)
Hf	11 <sup>a</sup>	400	33.06	SMR	(Liu et al., 2015)
$\beta$ -Ta	-12	190	13.19	ST-FMR	(Liu et al., 2012)
	-7.1	290	57.53	SP	(Wang et al., 2014)
$\beta$ -W	-14	180	9.18	SP	(Wang et al., 2014)
	-22	129	2.67	SMR	(Choi et al., 2017)
	-30	300	3.33	ST-FMR	(De La Venta et al., 2013)
	-40	210	1.31	SP	(Hao and Xiao, 2015)
Metal alloys					
Pt <sub>80</sub> Al <sub>20</sub>	14	75	3.83	SHM	(Nguyen et al., 2016b)
Pt <sub>85</sub> Hf <sub>15</sub>	16	110	4.30	SHM	(Nguyen et al., 2016b)
Pt <sub>75</sub> Au <sub>25</sub>	35	80	0.65	SHM	(Zhu et al., 2018)
Metal oxides					
W <sub>88</sub> O <sub>12</sub>	-49	172	0.72	ST-FMR	(Demasius et al., 2016)
PtO <sub>2</sub>	92	~ 10 <sup>9</sup>	~ 10 <sup>6</sup>	ST-FMR	(An et al., 2018a)
Antiferromagnets					
PtMn	6	164	45.56	SP	(Zhang et al., 2014)
FeMn	0.8	167.7	2,620.31	SP	(Zhang et al., 2014)
PdMn	1.5	223	991.11	SP	(Zhang et al., 2014)
IrMn	2.2	269.3	556.40	SP	(Zhang et al., 2014)
	22	205	4.24	ST-FMR	(Tshitoyan et al., 2015)
IrMn <sub>3</sub> (001)	20	160	4.00	ST-FMR	(Zhang et al., 2016b)
IrMn <sub>3</sub> (111)	12	198	13.75	ST-FMR	(Zhang et al., 2016b)

**Table 1. The Signed Spin Hall Angle  $\theta_{SH}$ , the Resistivity  $\rho$ , and Calculated Figure of Merit of the SOT Switching Power Density  $P_{SW,FOM} \sim \rho/(\theta_{SH,eff})^2$  for Various Materials at Room Temperature**

(Continued on next page)

Materials	$\theta_{SH}$ (%)	$\rho$ ( $10^{-8} \Omega \text{ m}$ )	$P_{SW,FOM}$ ( $10^{-5} \Omega \text{ m}$ )	Method	Reference
Semiconductors					
(Ga,Mn)As	0.15	4,300	$1.91 \times 10^6$	SP	(Mendes et al., 2017)
2D semimetals					
WTe <sub>2</sub>	51	580	2.23	ST-FMR	(Shi et al., 2019)
MoTe <sub>2</sub>	3.2	550	537.11	ST-FMR	(Stiehl et al., 2019)
PtTe <sub>2</sub>	15.2	95	4.11	ST-FMR	(Xu et al., 2020)
TIs					
Bi <sub>2</sub> Se <sub>3</sub>	16	1,060	41.41	DC	(Han et al., 2017)
	175	4,117	1.34	ST-FMR	(Wang et al., 2017)
Bi <sub>x</sub> Se <sub>1-x</sub>	1,870	12,821	0.04	DC	(Mahendra et al., 2018)
	867	12,821	0.17	ST-FMR	(Mahendra et al., 2018)
(Bi,Sb) <sub>2</sub> Te <sub>3</sub>	40	4,020	25.13	DC	(Han et al., 2017)
Bi <sub>0.9</sub> Sb <sub>0.1</sub>	5,200	400	$1.48 \times 10^{-4}$	DC	(Khang et al., 2018)

**Table 1. Continued**

TIs, topological insulators; Method, measuring method; NLD, non-local detection; ST-FMR, spin torque ferromagnetic resonance; SMR, spin Hall magnetoresistance; SP, spin pumping; DC, direct current method; SHM, second-harmonic measurement.

<sup>a</sup>Sign uncertain.

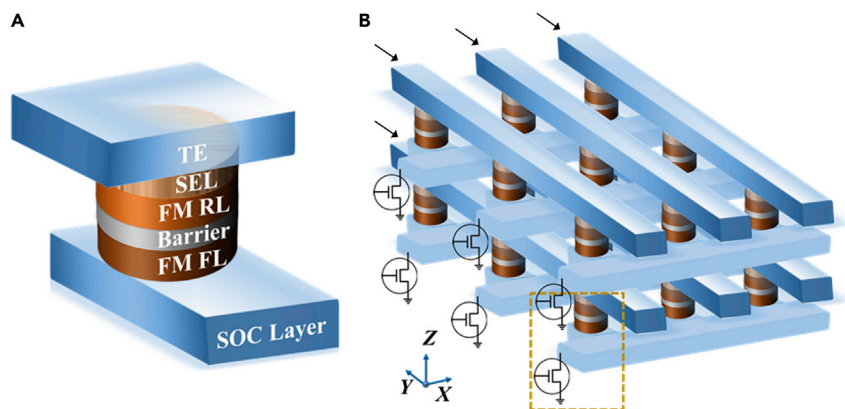
Benefiting from the matureness of STT-MTJ development (He et al., 2018), the established process know-how gained from STT-MRAM foundries learning cycles are constructive to tackle the existing integration obstacles of SOT-MRAM. Examples include the elemental movements and morphology changes impact on perpendicular magnetic anisotropy and exchange coupling degradation, as well as the strong dependence of the magnetoresistance and reliability on the defect species and concentration, diffusion barrier and interface quality of SOT and MTJ modules, etc. However, owing to the unique device structure for strong SOC-induced SOT-driven magnetization switching implemented with synergistic MTJ integration during back-end of line (BEOL) process, SOT-MTJ bears special process integration and control challenges (e.g., the dimension, thickness, and smoothness of heavy metal and corresponding thermal stability with the co-optimized spin hall angle and conductivity), which engages specific engineering needs for electrodes, film stack, lithography, alignment accuracy, etching process, clean technology, and encapsulation with applicable low-k gap filling, etc. For instance, compared with STT-MRAM thin films, to develop a robust wafer-level thin film process for SOT-MRAM with high thermal stability remains a great challenge upon maintaining MTJ perpendicular anisotropy after 400°C thermal budget during typical CMOS integration. Hence, it is indispensable to build up a robust SOT-MRAM fabrication integration process to enhance the thermal stability of the SOT-MRAM (Ramaswamy et al., 2018; Garello et al., 2019a). Furthermore, in order to successfully move SOT-MRAM into pre-industrial maturity phase, it is also expected to tackle aforementioned emerging integration issues with BEOL thermal budget compatibility and critical switching current minimization, which would in turn mitigate the current existing indecisive concern on the device modeling, circuit simulation, and system level integration development momentum for spin-orbitronics devices including SOT-MRAM.

## THE FUTURE OPPORTUNITIES

Parallel to the intensive investigations on the above challenges, the research community of spin-orbitronic devices are moving on for future science and technologies. Corresponding to an estimated timescale from near technology improvement to farther future principle innovations, here we example the 3D SOT-MRAM, the programmable spin-orbit logics, and the exotic magnetic configurations with new physics to be rising highlights in the field of spin-orbitronics, as following.

### 3D SOT-MRAM

Energy-efficient nonvolatile memory plays a paramount important role in the implementation of artificial intelligence and advanced network technologies at the endpoints. An increasing demand for massive



**Figure 4. A Proposed 3D SOT-MRAM**

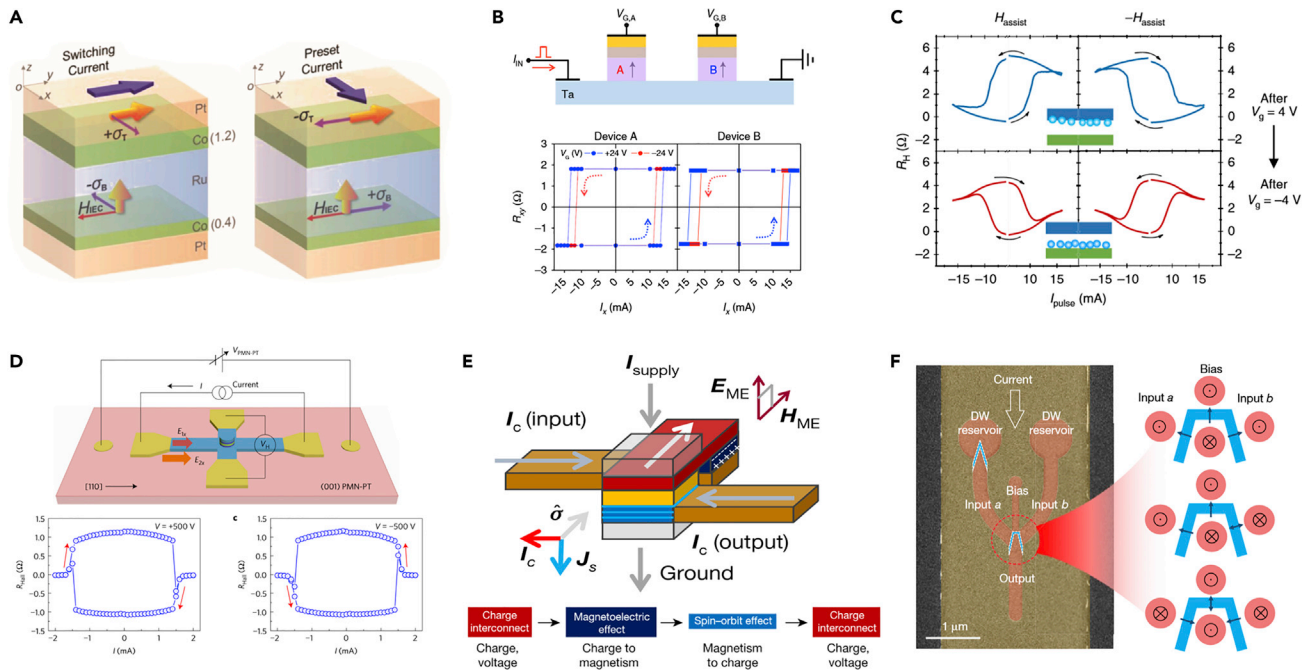
Schematic of proposed single two-terminal SOT-MTJ cell (A) and the corresponding integrated 3D SOT-MRAM architecture (B). Writing and reading currents can be addressed to a specific MTJ cell by controlling the transistor switches and selectors. FL, free layer; RL, reference layer; SEL, selector; TE, top electrode.

and variable data storage and fast processing (e.g., autonomous vehicle applications) drives 3D memory integration to be a key enabler, and thus bringing the scaling concept to the next level of the system requirements (Chandrasekaran, 2013). The major semiconductor design house and industrial foundry players are engaged in developing 3D-MRAM product equips a class of nonvolatile memory arrays that are scalable to be stacked to achieve complementary DRAM performance and Flash non-volatility attributes with high density (Huai et al., 2018).

Poised as a keystone architecture, 3D cross-point SOT-MRAM is one of the best candidates as two-pronged approach of 3D STT-MRAM to replace eDRAM, for instance, and serve as the storage class memory (SCM). Aiming at achieving both high-density and high-performance 3D SOT-MRAM, herein a two-terminal stackable 3D cross-point field free SOT-MRAM architecture is proposed, comprising an integrated selector in series with perpendicular MTJ. As illustrated in Figure 4, an optimized prerequisite 1-transistor-1-resistor (1T1R) device configuration is made of interrelated SOC layer with large spin Hall angle and high spin conductivity, enabling significant enhancement of SOT-driven magnetization switching efficiency in FM free layer of MTJ. Importantly, both in-plane and out-of-plane currents are simultaneously generated on application under a programmable bias voltage; nevertheless, the SOT switching mechanism is prerequisite to facilitate compact and highly efficient operation (Sato et al., 2018b). Moreover, in the two-terminal stacked 3D SOT-MRAM array, to eliminate the sneak current induced cross-talk issue through the half-biased unselected cell in the same row or column of the selected element, an applicable selector is required with low ON voltage  $V_{ON} < 1$  V, fast turn-on and turn-off speed ( $< 1$  ns), as well as the suppression capability of non-linearity ratio (i.e., the ratio between the maximum current  $J_{ON}$  and the current  $J_{HB} = J(1/2 V_{ON})$  of half biased cells) in a memory-type SCM, for instance. In fact, as demonstrated from the latest reports, the timely overall performance investigation of stacked SOT-MRAM architecture in comparison with other memory technologies in array and hybrid level elaborates its superior area, access latency, access energy, and write current benefits (Moradi et al., 2019; Bishnoi et al., 2014). Hence, it enables the access transistor(s) of an SOT-MRAM bit-cell to be designed much smaller, in turn leading to a lower leakage power for 3D SOT-MRAM.

### Programmable Spin-Orbit Logics

In contrast to the field free SOT-induced deterministic magnetization switching of  $m_z$ , the unwanted external  $H_x$  that requires for breaking symmetry can turn out to be a unique advantage of reconfiguring the switching sense, since the direction of  $H_x$  determines a down  $\rightarrow$  up or an up  $\rightarrow$  down orientation of the  $m_z$  for a fixed  $j_x$ . Corresponding to the aforementioned strategies for realization of external  $H_x$ -free SOT-induced  $m_z$  switching, the programmable spin-orbit cells for memory and logic applications with increased logic densities are desired in various reversible symmetry breaking ways. One basic idea is to adjust the interlayer coupling field direction by magnetically or electrically pre-magnetizing the in-plane FM pinning layer within the "T-type" magnetically coupled HM/PMA-FM free layer/spacer layer/in-plane



**Figure 5. Devices for Programmable Spin-orbit Logics**

Representative reprinted works reported on, or potentially capable of, demonstrating programmable spin-orbit logics based on various device approaches, e.g., (A) reconfigurable SOT switching of the PMA-FM layer in a “T-type” magnetically coupled structure realized by tuning the magnetization direction of the assistant in-plane FM layer via in-plane configured SOTs by applying orthogonal electrical currents (Wang et al., 2018b).

(B) VCMA control of the PMA and thereby the driving current intensity of the SOT switching (Baek et al., 2018b).

(C) Tuning the polarity of current-induced spin accumulation by modulating the oxygen ions in a Pt/Co/GdO<sub>x</sub> structure by voltage gating, the interfacial chemistry of which results in an interplay between the interfacial torques and the spin Hall current from Pt, and determines the sense of the SOT-induced magnetization switching (Mishra et al., 2019).

(D) External magnetic field-free reconfigurable SOT switching of Pt/CoNiCo/Pt obtained by electrically controlling the nonvolatile polarity of the ferroelectric PMN-PT substrate, where sufficient gradient in spin-orbit current is produced, and the direction of which determines the SOT switching sense to be clockwise or anticlockwise (Cai et al., 2017).

(E) MESO devices involving the magnetoelectric effect and the charge-to-spin interconversions via spin filter and spin-orbit effects (Manipatruni et al., 2019).

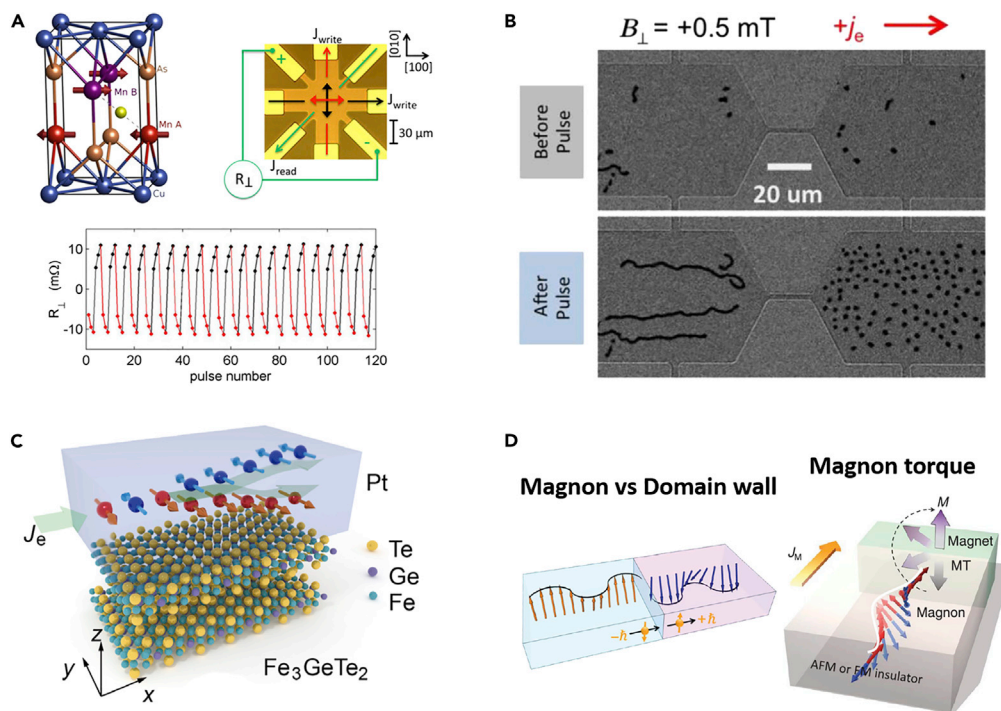
(F) Reconfigurable and cascadable SOT-induced magnetic domain-wall logics by exploiting the invertible chiral coupling between neighboring magnetic domains (Luo et al., 2020).

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FM pinning layer stacks (Sheng et al., 2018a; Wan et al., 2017; Wang et al., 2018b), as shown in Figure 5A. Typically, the voltage-controlled magnetic anisotropy (VCMA) in the FM (Lee et al., 2016; Baek et al., 2018b; Wang, 2018; Grimaldi et al., 2020) (i.e., Figure 5B), as well as the gate-voltage tunable spin-orbit current from either a metal oxide (Mishra et al., 2019) as illustrated in Figure 5C, semiconductor (Chen et al., 2018b), a van der Waals crystal (Benitez et al., 2020), or a topological insulator (Fan et al., 2016), provides a class of powerful electrical manipulation methods for programmable spin-orbit logics. Besides, introducing other multiferroic behaviors beyond the ferromagnetism, such as the ferroelectric/HM/FM heterostructure (Cai et al., 2017; Belopolski et al., 2019; Filianina et al., 2020; Noël et al., 2020; Fang et al., 2020) (see Figure 5D) and the novel proposal of magnetoelectric spin-orbit logics (MESO, see Figure 5E), can also bring additional nonvolatile freedoms for realizing all electrically programmable functionalities (Manipatruni et al., 2019). Most recently, the programmable spin-orbit domain-wall logics have been demonstrated and drawing attention by controlling either the initial domain states (Lee et al., 2018) or the chirality of the domain walls (Luo et al., 2019a, 2020), as shown in Figure 5F. To look forward, more diverse methods might be proposed for the programmable spin-orbitronics, whose overall energy efficiency, scalability, and industrial feasibility should be compared and assessed before any potential practical applications.

### Spin-Orbitronics in Exotic Magnetic Materials with New Physics

Although the spin-orbitronic researches were first initiated and extensively performed in FM-based materials, they have been extended to several exotic magnetic materials with new investigating of SOC physics.



**Figure 6. Representative Reprinted Works Reported on Spin-Orbitronics in Exotic Magnetic Materials beyond the Ferromagnets**

(A) Electric switching of antiferromagnet. Unlike conventional SOTs generated in HM/FM bilayers, the opposite signs of spin polarization at individual spin sublattices give staggered SOTs in a single CuMnAs layer (Wadley et al., 2016).

(B) Generation and motion of magnetic skyrmions by spatially divergent SOTs (Jiang et al., 2015).

(C) Electrical switching of a  $\text{Fe}_3\text{GeTe}_2$  van der Waals material via SOTs generated from the capping Pt layer (Wang et al., 2019a).

(D) Magnetic domain wall motions as well as magnetization switching induced by the torques mediated by spin waves (magnons), the phase and magnitude of which can also be tuned by the domain walls mutually in a nonvolatile manner (Han et al., 2019; Wang et al., 2019b).

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As shown in Figure 6A, for example, the staggered SOT-induced switching of unique antiferromagnets (e.g., CuMnAs and  $\text{Mn}_2\text{Au}$ ) with broken inversion symmetry in two spin-sublattices has offered an alternative solution to the writing problems for the external magnetic field-insensitive AFMs (Železný et al., 2014; Chen et al., 2019b; Wadley et al., 2016). Similarly, the sawtooth-shaped current-induced switching phenomena were also reported in HM/AFM or AFM/HM stacks of NiO/Pt, Ta/MnN/Pt,  $\alpha\text{-Fe}_2\text{O}_3/\text{Pt}$ , and Pt/PtMn, although the mechanisms of SOT-induced switching of the Néel vectors in these systems are still debated (Baldrati et al., 2019; Zhang et al., 2019a; Chiang et al., 2019; Shi et al., 2020). Meanwhile, SOT-induced switching of other AFM coupled systems, such as the synthetic AFMs with two antiferromagnetic coupled FM layers (Shi et al., 2017; Zhang et al., 2018; Yu et al., 2018; Kong et al., 2018; Bi et al., 2017), and the compensated ferrimagnet comprising transition metal (Fe, Co, Ni) and rare earth elements (Gd, Tb, Dy, Rh, etc.) (Finley and Liu, 2016; Mishra et al., 2017; Yu et al., 2019; Pham et al., 2018; Kim et al., 2017; Han et al., 2017; An et al., 2018b; Cai et al., 2020) provide alternative approaches toward the AFM spin-orbitronics with advantages in processing speed (much higher precession frequency than FMs), data scalability (no stray field), and information security (zero net magnetization, and insensitive to external magnetic field). To date, the SOT-induced manipulation of skyrmions motion (Jiang et al., 2015; Buttner et al., 2017; Yu et al., 2016) (the topological spin textures stabilized by Dzyaloshinskii-Moriya interactions, DMI, see Figure 6B) and magnetization switching in magnetic insulators (Avci et al., 2017; Shao et al., 2018), ferromagnetic topological insulators (Fan et al., 2014b, 2016), antiferromagnetic Weyl semimetals (Tsai et al., 2020), and 2D ferromagnets (Wang et al., 2019a; Alghamdi et al., 2019; Ostwal et al., 2020) (see Figure 6C) have already been studied intensively, and it is believed that extensive investigations of SOTs in other exotic magnetic materials, such as ferromagnetic Weyl semimetals (Liu et al., 2019b; Morali et al., 2019; Belopolski

et al., 2019) and antiferromagnetic topological insulator (Guin et al., 2019; Ghosh and Manchon, 2017; Otrokov et al., 2019) could attract intriguing interests to enrich the understanding of fundamental SOC physics and corresponding potential applications. Note that the giant amplitude of inverse and direct Rashba-Edelstein effect in oxide heterostructures of SrTiO<sub>3</sub> and LaAlO<sub>3</sub>/SrTiO<sub>3</sub> formed quasi 2D electron gas (2DEG) system also provide significant charge-spin interconversions (Noël et al., 2020), holding the promise to pave the way from oxide spin-orbitronics prospect toward low-power electrical control of magnetizations. In addition, the frontier researches on spin-orbitronics could inspire innovations in other spintronic devices, e.g., the newly reported optical spin-orbit torque (OSOT) devices with an optical means for magnetization manipulation in FM layer (Choi et al., 2020), and the magnonic devices where significant discoveries in the detection and the manipulation (see Figure 6D) of magnetization via spin waves have been recently presented (Han et al., 2019; Wang et al., 2019b; Liu et al., 2019a).

## CONCLUSIONS

In summary, the latest SOT research advancements have fueled fundamental spin-orbitronic exploration and associated technical innovations. The spin-orbitronic devices based on SOT-induced magnetization switching demonstrate great advantages in terms of nonvolatility, fast processing speed, high energy efficiency, reliable endurance, potential multilevel storage, stochastic switching, and reconfigurable switching, making them promising candidates for emerging applications in processing in-memory, neuromorphic computing, probabilistic computing, avionics, and internet of things. Look toward spin-orbitronic devices development, realizing field-free SOT-induced magnetization switching in a scalable way, enhancing energy efficiency via materials engineering and implementing application with practical integration remain as major challenges to be addressed. Nevertheless, new opportunities in the 3D spin-orbitronic devices, the programmable logics, and the novel SOT research findings in exotic magnetic materials to enrich SOC physics are drawing great interests from both scientific and industrial perspectives, paving the way for more ambitious and futuristic applications of spin-orbitronic devices.

## ACKNOWLEDGMENTS

The authors are grateful for the financial support from National Key R&D Program of China (Grant No. 2017YFB0405700 and 2019FYB2205100), NSFC (Grant No. 11474272 and 61774144), Chinese Academy of Sciences (Grant No. QYZDY-SSW-JSC020, XDB44000000, XDB28000000, E0YR063004 and E0SR023002), and Beijing Natural Science Foundation Key Program (Grant No. Z190007).

## AUTHOR CONTRIBUTIONS

K.W. conceived the idea. Y.C. and G.X. contributed equally to this work. Y.C., G.X., and K.W. wrote the manuscript. All authors discussed and modified the manuscript.

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