RESEARCH ARTICLE

Investigating the Effects of V_2C MXene on Improving the Switching Stability and Reducing the Operation Voltages of TiO₂-Based Memristors

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Abstract — Three-atoms-type V_2C MXene, an emerging class of transition metal carbides, has attracted tremendous attention in the fabrication of advanced memristive devices due to its excellent electrochemical properties. However, the inserted effects and corresponding physical mechanisms of inserting V_2C on traditional TiO₂-based memristors have not been clearly explored. In this work, exhaustive electrical characterizations of the V_2C/TiO_2 -based devices exhibit enhanced performance (e.g., improved switching stability and lower operating voltages) compared to the TiO₂-based counterparts. In addition, the advantaged influences of the inserted V_2C have also been studied by means of first-principles calculations, confirming that V_2C MXene enables controllable internal ionic process and facilitated formation mechanism of the Ag conductive filaments. This work demonstrates a way to combine experimental and theoretical investigations to reveal the positive effects of introducing V_2C MXene on memristor, which is beneficial for fabricating performance-enhanced memristors.

Keywords — Memristor, V_2C MXene, First-principles calculation, Switching stability, Formation mechanism. **Citation** — Nan HE, Lei WANG, and Yi TONG, "Investigating the Effects of V_2C MXene on Improving the Switching Stability and Reducing the Operation Voltages of TiO₂-Based Memristors," *Chinese Journal of Electronics*, vol. 33, no. 5, pp. 1181–1187, 2024. doi: 10.23919/cje.2022.00.327.

I. Introduction

Memristor, an ideal device for simulating the artificial synapse, has been undoubtedly considered as one of the fundamental functional building blocks in developing brain-inspired computational systems due to many merits, such as biological structure and functions, good complementary metal-oxide-semiconductor (CMOS) compatibility, and low energy consumption [1]–[3]. The simple metal/insulator/metal (MIM) structure of memristors enables the high-density integration, in which the medium functional materials play the key role in the resistive switching (RS) process from the perspectives of materials [4], [5]. Up to now, titanium dioxide (TiO₂), a binary transition metal oxide, has been widely employed as a dielectric layer to construct memristors due to many remarkable advantages, for example, ease of deposition,

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high temperature stability, and high dielectric constant [6]–[9]. However, there is still lots of room for the enhancement of some unsatisfactory RS characteristics of TiO_2 -based memristor including the large operating voltages and relatively poor endurance property, since the existing crucial obstacles can hinder further development and thus fail to fit industrial requirements.

Recently, five-atoms-type Ti_3C_2 MX ene, a hot family of two-dimensional materials, has been inserted into memristors to improve the device performance [10], [11]. In addition, the positive inserted effects of Ti_3C_2 materials have been investigated by the compared electrical RS characteristics and the first-principles calculations. More recently, three-atoms-type V₂C MX ene, another new member of MX ene family, has been previously introduced into traditional TiO₂-based memristors with structure of Ag/V₂C/TiO₂/W to stimulate electronic synapses since V₂C MXene has more stable atomic structure and higher electronic conductivity when compared to Ti₃C₂ [12], [13]. However, the inserted effects of V₂C MXene on the RS characteristics (e.g., switching stability and operating voltage) have not been intensively investigated so far. More importantly, the corresponding physical mechanisms related to the insertion of V₂C have not been systematically elucidated, which requires considerable effort to explore since a deeper understanding of the RS mechanism will in turn guide the structural design of the device.

In this work, the memristors with and without V_2C MXene have been synchronously fabricated by magnetron sputtering and spin-coating methods. As a comparison, the RS characteristics of both memristors have been investigated in detail from the perspectives of electrical properties, showing that V₂C-based memristors exhibit better performance including longer data retention, more concentrated and lower operating voltages, and more stable endurance characteristics. In addition, by means of first-principles calculations and electrode-cutting operations, their RS mechanisms have been explained by locally controlled formation and dissolution of the Ag conductive filaments (CFs). All in all, our work provides a viable approach to effectively designing the performanceenhanced memristors and further clarifying the underlying mechanisms of the investigated devices.

II. Experiments

The 80 nm W bottom electrodes (BEs) and 60 nm TiO_2 layer (for $V_2\text{C}/\text{TiO}_2$ -based device) have been sequentially deposited by magnetron sputtering with the respective targets on a cleaned 2-inch wafer. After that, $V_2\text{C}$ MXene layer can be prepared by spin-coating (1000 rpm for 60 s) the mixture of $V_2\text{C}$ material and dimethyl sulfoxide (DMSO) with a ratio of 10 mg/ml. And finally, 80 nm Ag top electrodes (TEs) were deposited by direct current sputtering to complete the fabrication of the Ag/ $V_2\text{C}/\text{TiO}_2/W$ structure devices. The control TiO₂-based devices without $V_2\text{C}$ MXene have been prepared by the similar processes under the same environment.

The electrical RS characteristics of both structural devices have been tested by using Keithley 4200A-SCS. First-principles calculations have been carried out within the framework of density functional theory (DFT), which has been implemented in the Vienna Ab-Initio simulation package (VASP) software [14], [15]. Generalized gradient approximation (GGA) of Perdew-Burke-Ernzerhof (PBE) has been employed for computing the exchange-correlation energy. In addition, the valence electronic states have been expanded on the basis of plane-wave with the core-valence interaction represented by adopting the projector augmented wave (PAW) method. More importantly, for all calculations, the plane-wave cut-off energy has been set to 520 eV and a Γ -centered k-mesh of 2 \times 2 \times 2 has been utilized [16]. Furthermore, electrical convergence can be achieved once

the force acting on each ionic was less than 0.02 eV/Å.

III. Results and Discussion

The atomic structure of the as-prepared V₂C MXene has been shown in Figure 1(a), where the unit cell of V₂C consists of three atoms including two vanadium atoms (cyan balls) and one carbon atom (black ball). Figure 1(b) exhibits a schematic configuration of the studied device with Ag/V₂C/TiO₂/W structure. As shown in Figures 1(c) and (d), the typical of current-voltage (I-V) curves of the both devices operating at the same compliance current of 400 μ A show the similar bipolar RS behaviors. Both devices have a high-resistance state (HRS, OFF-State) in their initial stages and are set to low-resistance state (LRS, ON-State) referred as set process when applying an appropriate positive voltage (i.e., set voltage, V_{Set}). Conversely, both devices can be reversibly reset from the LRS to HRS termed as reset process at a certain voltage (i.e., reset voltage, V_{Reset}) once changing the polarity of the electric field. Compared with the control device without MXene, we found that the lower voltage corresponds to the current jump process of V₂C/TiO₂-based device, as demonstrated in the insets of Figures 1(c) and (d). The current jump process is obtained after increasing the compliance current value and can be functionalized as electroforming process for $400 \,\mu A$. In addition, the extremely small variation of multiple I-Vcurves reveals the remarkable repeatability of V₂C/TiO₂based device, strongly reflecting the advantaged effects of introducing V₂C. Such positive impact will be discussed later in greater detail. More obviously, the RS behavior of the TiO₂-based device fails after only 19 cycles, whereas the V_2C/TiO_2 -based device can switch for 240 cycles without any manifest fluctuation.

Figures 2(a) and (b) exhibit the cyclic endurance properties of the TiO₂-based and V₂C/TiO₂-based device, respectively. The device's states before and after set process were measured with a low readout voltage of 0.1 V. It is evident that the V_2C/TiO_2 -based device performs better endurance, i.e., more stable switching cycles. In addition, the corresponding operating voltages (set voltage and reset voltage) have been replotted with the form of cumulative distributions, as shown in Figures 2(c) and (d). It can be clearly observed that the set voltage (range from 0.62 V to 0.66 V) and reset voltage (from -0.19 V to -0.02 V) of the V₂C/TiO₂-based memristor are lower and more concentrated than the set voltage (range from 0.72 to 1.07 V) and reset voltage (from -0.69 V to -1.55V) of TiO₂-based device, respectively. Besides, the reset current of as-manufactured V₂C-based device is lower than that of the device without V₂C, revealing the lower power consumption of reset process. Such reduction and concentration with respect to the operating voltages are crucial in pursuing stable and low-power consumption memristors that are more suitable to realize low-power operation [17]. Moreover, retention characteristics at room temperature have been tested to evaluate the memory



Figure 1 (a) Atomic structure of pristine V_2C MXene; (b) Schematic illustration of the studied Ag/ V_2C /TiO₂/W device structure; Typical bipolar RS behaviors for the device (c) Without and (d) With V_2C MXene [12]. The insets represent the current jump behaviors before measuring the typical *I*-*V* curves.

nonvolatility of two devices, as indicated in Figures 2(e) and (f). The V_2C/TiO_2 -based memristor demonstrates better retention performance since the HRS of TiO₂-based memristor has obvious decay phenomenon in a very short time. The large fluctuation may be due to the stochastic nature of positively charged Ag ions migration and diffusion in TiO₂ layer during the RS process [18].

Moreover, the statistical HRS and LRS distributions for randomly selected four devices from conventional TiO₂-based and V₂C-inserted memristors have been plotted with box plots, as demonstrated in Figures 2(g) and (h), respectively. The results show that extracted HRS and LRS values of V₂C-based devices fluctuate within a relatively narrow range. The statistical analysis of what percentage of devices showed enhanced performance will be carried out in our future study. Detailed comparisons performed above disclose that the insertion of V_2C is significant for the reduction of operating voltages and enhancement of RS stability. The RS characteristics of the as-fabricated V₂C-based memristors and other as-investigated devices recently reported in the literature are compared and summarized in Table 1, suggesting the relatively excellent performance of the studied V₂C-based memristors [19]–[34].

For the sake of investigating why the inserted V_2C -

based memristors can obtain low concentrated operating voltages and more stable RS stability, formation energies calculations related to the formation of Ag CFs as well as differential charge density analyses with respect to the electronic exchange have been carried out via the firstprinciples calculations, as presented in Figure 3 [35], [36]. Structural models of the TiO_2 compound and V_2C/TiO_2 heterojunction have been modeled in a single unit respectively, where C, O, Ag, V, and Ti atoms are represented by gray, red, dark blue, purple, and light blue balls, respectively. As a result, the substitution of Ti site by Ag at low temperature requires a relatively large formation energy of 0.97 eV in the single-layer TiO₂-based memristor, whereas the Ag substitution in V_2C/TiO_2 heterojunction is strongly facilitated with a lower formation energy of 0.63 eV, as plotted in Figures 3(a) and (c) respectively. Such reduction fact implies that the V₂C/TiO₂based memristor has higher structural stability to easily initialize the formation of Ag clusters. After the initialization of Ag clusters, the final Ag CFs are easily formed and the memristor is switched-ON.

In order to achieve a deeper understanding of the facilitated formation mechanisms of Ag dopants at V_2C/TiO_2 heterojunctions, the differential charge density distribution and Bader charge analysis have been exe-



Figure 2 Cyclic endurance property of the device (a) Without and (b) With V_2C MXene. Cumulative probability distributions of the operation voltages of the device (c) Without and (d) With V_2C MXene [12]. Data retention characteristics of the device (e) Without and (f) With V_2C MXene [12]. Device-to-device distributions of HRS and LRS read at 0.1 V for four devices (g) Without and (h) With V_2C MXene.

cuted in Figures 3(b) and (d) for the corresponding formation energies (i.e., 0.97 eV and 0.63 eV) of the two

structures, respectively. In comparison with the result of TiO_{2} -based memristor in Figure 3(b), there exists

Reference	Material	$V_{\rm Set}$ (V)	V_{Reset} (V)	Cycles	Retention (s)
Ours	V_2C/TiO_2	0.62-0.66	-0.02 to -0.19	240	4×10^{3}
[20]	ZnO NPs/CuO NWs	1.5	-0.9	100	8×10^{3}
[21]	CdSe QDs-PVP	1.6	-1.7	4000	3.8×10^{3}
[22]	HfO_x/AlO_y	0.8	-1.4	100	1×10^{4}
[23]	SiC	2.5	-1	100	1×10^{3}
[24]	$CsPbBr_3$ QDs:GO	2.28	-2.04	500	5×10^{3}
[25]	SiO_x	1.2	-1.1	100	1×10^{4}
[26]	Graphene oxide GO	1.8-2.8	-1.6 to -2.6	100	1×10^{4}
[27]	HfO ₂ /ZnO	>2.8	<-1	100	1×10^{4}
[28]	Polydopamine	2.1	-2.3	30	N/A
[29]	$\mathrm{Bi}_{2}\mathrm{O}_{2}\mathrm{Se}/\mathrm{Bi}_{2}\mathrm{SeO}_{x}$	1-2.2	-0.4 to -1.2	20	5×10^3
[30]	LSMO/ZnO	1.4–1.7	-3.1 to -3.3	80	4×10^{3}
[31]	Mn-ZnO	0.71	-0.6	80	N/A
[32]	$\rm Cs_2BiAgBr_6$	1.0	-0.4	110	1×10^{3}
[33]	$CsPbBr_3$	-0.2	1.7	100	1×10^{4}
[34]	TaO_x/Al_2O_3	>2.5	<-2	100	2.5×10^{3}

Table 1 Comparison of few recently reported memristors with our customized devices



Figure 3 Structural models and required formation energies of (a) Ag-doped TiO_2 compounds and (c) Ag-doped $\text{V}_2\text{C}/\text{TiO}_2$ heterojunctions; Differential charge density diagrams of the device (b) Without and (d) With V_2C MXene, corresponding to the formation energies (0.97 eV and 0.63 eV) of the initially formed Ag clusters in (a) and (c) respectively. (Ti, O, Ag, V, and C atoms are represented by light blue, red, dark blue, purple, and gray balls, respectively).

stronger charge transfer (larger Bader charge 0.43 e) in V_2C/TiO_2 heterojunctions in Figure 3(d) between Ag ions and their coordinated atoms. Such powerfully reveals that the insertion of V_2C can readily adsorb Ag ions to move and significantly benefit the formation of Ag clusters or CFs as a result of the stronger electrostatic interactions, thus leading to the lower operating voltages and more stable RS behaviors. In other words, the inserted V_2C MXene has a strong capability to easily

attract Ag ions to directionally migrate towards the TiO_2 layer along the location of V_2C nanostructures with lower voltage.

To verify the localized formation of CFs rather than uniform distribution in V₂C/TiO₂-based memristor, TEcutting operations have been experimentally performed, as presented in Figure 4. First, both devices were switched to nonvolatile LRS, and the device's states before and after set process were measured with a low readout voltage of 0.1 V, as presented in Figure 4(a). After that, the Ag TEs were cut into two parts marked with TE1 and TE2 respectively by using the test probe, as displayed in Figure 4(b). Next, the device's states of both parts have been read, and the results have been plotted in Figures 4(c) and (d). It can be clearly seen that both memristors demonstrate localized formation of CFs (mainly occurring in the right TE1) but the V₂C/TiO₂-based device obviously shows better similarity of LRS read before and after cutting. Such an approach further reveals that the insertion of V₂C MXene can guide the stable creation of CFs because of the lower formation energy and higher charge transfer. On the basis of above theoretical analysis, the schematic diagrams of RS mechanism related to the electrochemical formation of Ag CFs have been proposed and illustrated in Figure 5, where the distribution of CFs in TiO_2 -based device is relatively stochastic. In the near future, the Xray photoelectron spectroscopy (XPS) or transmission electron microscopy (TEM) characterization methods will be employed to future prove the internal mechanism of our studied devices.

IV. Conclusion

In conclusion, the compared results presented here



Figure 4 Schematic illustrations of (a) Before and (b) After electrode-cutting operations; Device states read before and after electrode-cutting operations of the device (c) Without and (d) With V_2C MXene.



Figure 5 Schematic illustrations of resistive switching mechanisms of the device (a) Without and (b) With V_2C MXene.

experimentally exhibit that three-atoms-type V₂C MXene can be introduced into conventional TiO_2 -based memristors to improve the switching stability and reduce the operating voltages. In addition, the favorable formation energy, differential charge density distribution, and Bader charge analysis based on first-principles calculations not only theoretically reveal that the V₂C/TiO₂based device has higher structural stability, but also clearly interpret the corresponding facilitated formation mechanisms.

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