Structures, and electronic and spectral properties of single-atom transition metal-doped boron clusters $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, Cr, Mn, Fe, Co, and Ni}$)†

Shi-Xiong Li,*a Yue-Ju Yang,a De-Liang Chena and Zheng-Wen Longb

A theoretical study of geometrical structures, electronic properties, and spectral properties of single-atom transition metal-doped boron clusters $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, Cr, Mn, Fe, Co, and Ni}$) is performed using the CALYPSO approach for the global minimum search, followed by density functional theory calculations. The global minima obtained for the $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, and Cr}$) clusters correspond to cage structures, and the $\text{MB}_{24}^-$ ($\text{M} = \text{Mn, Fe, and Co}$) clusters have similar distorted four-ring tubes with six boron atoms each. Interestingly, the global minima obtained for the $\text{NiB}_{24}^-$ cluster tend to a quasi-planar structure. Charge population analyses and valence electron density analyses reveal that almost one electron on the transition-metal atoms transfers to the boron atoms. The electron localization function (ELF) of $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, Cr, Mn, Fe, Co, and Ni}$) indicates that the local delocalization of $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, Cr, and Ni}$) is weaker than that of $\text{MB}_{24}^-$ ($\text{M} = \text{Mn, Fe, and Co}$), and there is no obvious covalent bond between doped metal and B atoms. The spin density and spin population analyses reveal that open-shell $\text{MB}_{24}^-$ ($\text{M} = \text{Ti, Cr, Fe, and Ni}$) has different spin characteristics which are expected to lead to interesting magnetic properties and potential applications in molecular devices. The polarizability of $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, Cr, Mn, Fe, Co, and Ni}$) has larger first hyperpolarizability, indicating that $\text{MB}_{24}^-$ ($\text{M} = \text{Mn, Fe, and Co}$) has a strong nonlinear optical response. Hence, $\text{MB}_{24}^-$ ($\text{M} = \text{Mn, Fe, and Co}$) might be considered as a promising nonlinear optical boron-based nanomaterial. The calculated spectra indicate that $\text{MB}_{24}^-$ ($\text{M} = \text{Sc, Ti, V, Cr, Mn, Fe, Co, and Ni}$) has different and meaningful characteristic peaks that can be compared with future experimental values and provide a theoretical basis for the identification and confirmation of these single-atom transition metal-doped boron clusters. Our work enriches the database of geometrical structures of doped boron clusters and can provide an insight into new doped boron clusters.

1. Introduction

Clusters are relatively stable microscopic or submicroscopic aggregates composed of several to thousands of atoms, molecules or ions, which have completely different structures and physical properties from bulk, and are also transition states from atoms to solid matter. Clusters are ideal models for correlating macroscopic properties and microscopic structures of substances, and cluster research is of great significance to deeply understand the laws of matter transformation. The physical properties of clusters are dependent on their size and shape, which can be changed to give them different physical properties owing to the quantum effect of electrons. Study of the structure and physical properties of clusters can provide guidance for the design and manufacture of new materials and new devices at the atomic level. The unique properties of clusters and doped clusters make their research a vibrant field of cluster science. For example, the emergence of fullerene $\text{C}_{60}$ is a new breakthrough in nanomaterials and nanotechnology, and the discovery of carbon nanotubes and graphene promoted carbon nanomaterials to become a vibrant scientific field. The boron atom, with only three valence electrons (one less than carbon), can form polycentric chemical bonds and produce several interesting structures and properties. Experimental studies have found that anionic pure boron clusters, $\text{B}_n^-$, with less than 38 atoms have a planar or quasi-planar structure. Theoretical studies have found that neutral pure boron clusters of different sizes of $\text{B}_n$ have planar, tubular, cage-like, or other three-dimensional structures. Until 2014, scientists had been exploring whether boron could also form cages fullerenes.
structures, but had been unable to experimentally determine the existence of caged boron clusters. In 2014, the cage-type all-boron cluster borospherene $B_{40}^{*-}$ was experimentally found.\textsuperscript{23} Borospheren B$_{40}^{*-}$ exhibits a hollow cage-like structure, but has different electronic structures and properties from C fullerenes. $B_{46}^{*-}$ is the second inorganic non-metallic cage-like cluster that has been fully confirmed experimentally and theoretically after C$_{60}$ and produced a lot of research on boron clusters.\textsuperscript{16–24} In 2015, graphene’s brother borophene was synthesized on the Ag(111) base,\textsuperscript{25} and the basic unit of borophene happened to be a deformed B$_2$ cluster. In 2021, uniform and large-scale (millimeter-scale) bilayer borophene was synthesized on the surface of Cu(111).\textsuperscript{26} Compared with borophene, bilayer borophene is more difficult to oxidize. Almost in the same period, a borophene crystal form comparable to graphene was experimentally and theoretically a borophene crystal form comparable to graphene was experimentally and theoretically synthesized,\textsuperscript{27} and atomic hydrogen was used to hydrogenate borophene to synthesize borophene that can be stable in the external environment for a week. The discovery of borospheren and borophene provides important clues for the development of new boron materials. In view of the difference in electronic structure with fullerenes and carbon nanomaterials, boron clusters and low-dimensional boron nanostructures can offer new ideas and technologies for new nanomaterials and nano devices.

Similar to fullerenes, doped (especially for mono-atom) boron clusters can produce new structures or properties.\textsuperscript{18,20–22,18–24} For example, B$_{20}^{*-}$, B$_{22}^{*-}$, and B$_{24}^{*-}$ have a quasi-planar, quasi-planar, and double-ring tubular structure,\textsuperscript{16,21} respectively. However, after adding alkali metal atoms, both LiB$_{20}^{*-}$ and MB$_{24}^{*-}$ (M = Na, K) possess a double-ring tubular structure and Li$_2$B$_{24}$ possesses a three-ring tubular structure.\textsuperscript{29–31} In addition, Li, Na, or K-doped B$_{40}$ is expected to become a nonlinear optical nanomaterial.\textsuperscript{21} Because of their rich electronic structure characteristics, transition metal atom can combine with boron clusters to produce rich structures and properties. For example, the quasi-planar B$_{12}$ cluster has a sandwich structure after being doped with a metal atom such as Co and Rh.\textsuperscript{6,34} Neutral B$_{24}$ has a double-ring tubular structure, while TiB$_{24}$ and CrB$_{24}$ have a cage structure after doping with one Ti or Cr atom.\textsuperscript{45} The single-atom Sc- or Ti-doped B$_{40}$ is expected to become a hydrogen storage material\textsuperscript{18,20,22} doped boron clusters MB$_{12}^{*-}$ (M = Co, and Rh) can enhance chemical activity,\textsuperscript{14} and the Co-doped B$_{40}$ is expected to be applied in molecular devices.\textsuperscript{36} Experimental and theoretical studies have found that transition metal atom doped boron clusters ReB$_{n}^{*-}$ ($n$ = 3–4, 6, 8–9), MnB$_{n}^{*-}$ ($n$ = 6, 16), BiB$_{n}^{*-}$ ($n$ = 6–8), CoB$_{16}^{*}$, La$_2$B$_{14}$ ($n$ = 10–11) and La$_3$B$_{18}$ have various unique structures.\textsuperscript{13–41} Metal encapsulation is known as an effective approach to modify the chemical bonding and occupancy of energy levels of clusters. Metal (or metal cluster) encapsulation has also been suggested as a possible synthesis pathway for stabilizing the unstable boron fullerene analogue. Therefore, the study of transition metal-doped boron clusters provides important theoretical guidance for the study of new structures and new properties of boron clusters and the preparation of new boron nanomaterials. Herein, to obtain the structures and properties of transition metal-doped boron clusters MB$_{24}^{*-}$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni), extensive research has been conducted on the geometric structure, spectral properties, and electronic structure using the CALYPSO approach,\textsuperscript{46} in combination with the density functional theory method PBE0.\textsuperscript{47} The calculation results will be useful for future experimental data of MB$_{24}^{*-}$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni).

2. Computational methods

Geometric structure searches of MB$_{24}^{*-}$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) clusters were implemented using particle swarm optimization (CALYPSO) software. CALYPSO is a powerful cluster structure search method, which has been successfully applied to boron and doped boron clusters.\textsuperscript{48,49} The PBE0/3-21G level was used for the preliminary structural search. In each generation, 70% of the structures were produced by particle swarm optimization (PSO) operations, while the others were randomly generated. There were nearly 2000 isomers initially obtained for each doped boron cluster. In addition, some plane structural constructions were also produced by the artificial bee colony algorithm (ABC) software\textsuperscript{47} at the PBE0/3-21G level.

Low-energy structures were then fully optimized at the PBE0/6-311+G* and TPSSH/6-311+G* levels.\textsuperscript{47,49,50} Moreover, density functional theory with dispersion correction (DFT-D3) was tested in the energy calculation.\textsuperscript{51} At present, there are many methods of dispersion correction, such as dispersion-corrected atom-centered potentials (DCACPs), functional with van der Waals corrections (vdW-DF), dispersion correction as an add-on to standard Kohn–Sham density functional theory (DFT-D3) etc.\textsuperscript{52} The DFT-D3 method is more advantageous,\textsuperscript{53} and can be performed in Gaussian 16 software. We used the PBE0/6-311+G(d) and PBE0-D3/6-311+G(d) methods to calculate the low-energy structures of MB$_{24}^{*-}$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni), and the results show that the relative energy trend of isomers (low-energy structures) in each cluster is found to be almost the same by using two methods. Moreover, PBE0/6-311+G(d) and PBE0-D3/6-311+G(d) methods were tested in the calculation of infrared spectra, Raman spectra, and polarizability of lowest energy structure for NiB$_{24}^{*}$, and the results also show that the infrared spectra, Raman spectra, and polarizability are found to be almost the same by using two methods. Therefore, density functional theory with dispersion correction (PBE0-D3) does not have a significant effect on the results, however, it further verifies the reliability of the PBE0 method. In addition, the PBE0/6-311+G* level is reliable method for boron cluster,\textsuperscript{15,23–25} specifically, theoretical calculation results with the PBE0/6-311+G* level agrees with the experimental results.\textsuperscript{23} Therefore, after the geometry optimizations, frequency analyses, electronic structures and spectroscopic properties were studied at the PBE0/6-311+G* level. All computations were performed using Gaussian 16 software.\textsuperscript{54} The dipole moment, spin density, atomic charge, and electronic structures can be obtained directly from the calculation results of geometry optimizations. The harmonic frequency can be obtained from the calculation results of frequency analyses (add keyword Freq in Gaussian 16). All analyses and various types of isosurface map drawings were realized using the Multiwfn 3.7(dev) code.\textsuperscript{58}
The energy of a system in the weak and uniform external electric field $\mathbf{E}$ can be revealed as $^{11,60}$

$$E(\mathbf{E}) = E(0) - \mu_0 \mathbf{F} - \frac{1}{2} \alpha \mathbf{F}^2 - \frac{1}{6} \beta \mathbf{F}^3 - \cdots$$ (1)

where $E(0)$ is the molecular total energy without the external electric field, $\mu_0$ is dipole moment, $\alpha$ is polarizability, which is a matrix (second rank tensor), $\beta$ is first hyperpolarizability, which is a third rank tensor and known as second order nonlinear optical response (NLO) coefficient. Isotropic average polarizability $\alpha$ can be defined as $^{60}$

$$\alpha = (\alpha_{xx} + \alpha_{yy} + \alpha_{zz})/3$$ (2)

Anisotropy of polarizability can be defined as $^{41}$

$$\Delta \alpha = \sqrt{\left[(\alpha_{xx} - \alpha_{yy})^2 + (\alpha_{xx} - \alpha_{zz})^2 + (\alpha_{yy} - \alpha_{zz})^2 + 6(\alpha_{xy}^2 + \alpha_{xz}^2 + \alpha_{yz}^2)\right]/2}$$ (3)

Magnitude of first hyperpolarizability $\beta_0$ can be defined as $^{11}$

$$\beta_0 = \sqrt{(\beta_{xx}^2 + \beta_{yy}^2 + \beta_{zz}^2)}$$ (4)

where $\beta_x = \frac{3}{5}(\beta_{xxx} + \beta_{xyy} + \beta_{xzz})$, $\beta_y = \frac{3}{5}(\beta_{yyy} + \beta_{yxx} + \beta_{yzz})$, $\beta_z = \frac{3}{5}(\beta_{zzz} + \beta_{zxx} + \beta_{zyy})$. These components can be calculated using Gaussian 16 software and analyzed using Multiwfn 3.7(dev) code.

## 3. Results and discussion

### 3.1 Structures and electronic properties

The five low-energy structures of transition metal-doped boron clusters $\text{MB}_{24}^-$ ($\text{M} = \text{Sc}, \text{Ti}, \text{V}, \text{Cr}, \text{Mn}, \text{Fe}, \text{Co}$, and $\text{Ni}$) are shown in Fig. S1–S8 (ESI†). As shown in Fig. S1–S8, † the relative energy trend of five low-energy structures in each cluster is found to be almost the same by using PBE0/6-311+$G^*$, TPSSH/6-311+$G^*$, and PBE0-D3/6-311+$G^*$ levels. The calculation results show that the low-energy structures of $\text{MB}_{24}^-$ ($\text{M} = \text{Sc}, \text{Ti}, \text{V}, \text{Cr}, \text{Mn}, \text{Fe}, \text{Co}$) tend to form cage structure or tubular structure, and $\text{NiB}_{24}^-$ tend to form quasi-planar structure. Early research found that $\text{B}_{24}$ has a double-ring tubular structure, and $\text{B}_{24}^-$ has a planar structure. It can be seen from Fig. 1 and the calculated results that after adding metal atoms, the lowest energy structures $\text{MB}_{24}^-$ ($\text{M} = \text{Sc}, \text{Ti}, \text{V}, \text{Cr})$ have endohedral borospherene structures. The lowest energy structure $\text{TiB}_{24}^-$ has high symmetry ($D_{3h}$), and the Ti atom is located at the center of the cage. The calculated results and Fig. 1 show that the lowest energy structures of $\text{VB}_{24}^-$ and $\text{CrB}_{24}^-$ have similar five-membered rings and there are four five-membered rings with a boron atom embedded in the center of five-membered rings. Among them, $\text{VB}_{24}^-$ has higher symmetry ($C_{4v}$) than $\text{CrB}_{24}^-$ ($C_{3v}$), and the V atom is almost located at the center of the cage.

The calculated results and Fig. 2 show that the lowest energy structures of $\text{MB}_{24}^-$ ($\text{M} = \text{Mn}, \text{Fe}, \text{and Co}$) have similar distorted four-ring tube with six boron atoms each. This structure can also be viewed as a distorted cage. In particular, the ring where the metal atom is located is not closed, further leading to an open seven-membered ring on the wall. $\text{MB}_{24}^-$ ($\text{M} = \text{Mn}, \text{Fe}, \text{and Co}$) have low symmetry ($C_{3v}$), and the doped atom is located at the center of a six-membered ring. Similar to tubular B clusters, these doped boron clusters are expected to become the basic unit of boron nanotube materials, which will be further synthesized into boron nanotubes. It can be seen from Fig. 2 that the lowest energy structure of $\text{NiB}_{24}^-$ has quasi-planar structure similar to a warplane shape. The metal atom is located right at the nose, surrounded by an eight-membered boron ring. Similar to deformed $\text{B}_2$ cluster, the quasi-planar $\text{NiB}_{24}^-$ is expected to become the basic unit of doped borophene, which will be further synthesized into borophene. In the following discussion, the main focus is on the study of the lowest energy structure.

Some of the ground-state parameters of transition metal-doped boron clusters $\text{MB}_{24}^-$ ($\text{M} = \text{Sc}, \text{Ti}, \text{V}, \text{Cr}, \text{Mn}, \text{Fe}, \text{Co}, \text{and Ni}$) are listed in Table 1, including the lowest harmonic frequency, dipole moment, atomic charge on doped transition-metal atoms, and Mayer bond level. $^{41}$ The lowest harmonic frequency analysis (see Table 1 for the lowest harmonic frequencies of each cluster) confirmed that these lowest energy structures are indeed stable (no imaginary frequency). The charge population analysis shows that all the metal atoms show positive charges, indicating that electrons have been transferred to the boron atoms and the metal atoms have transferred almost one electron. Because there is more than one outer valence electron of doped atom, only a small part of the electrons has been transferred. Analysis shows that the Mayer bond level of the metal atom $\text{M}$ and $\text{B}$ atom of these clusters is between 0.05 and 0.55 and it is less than 1, indicating that no obvious covalent bond is formed between the metal atom and the B atom. Because $\text{TiB}_{24}^-$ has high symmetry, $D_{3h}$, the dipole moment is 0. Among these nanoclusters $\text{MB}_{24}^-$ ($\text{M} = \text{Sc}, \text{Ti}, \text{V}, \text{Cr}, \text{Mn}, \text{Fe}, \text{Co}, \text{and Ni}$), it is found that the closed-shell $\text{MB}_{24}^-$ ($\text{M} = \text{Sc}, \text{V}, \text{Mn}, \text{and Co}$) clusters have large HOMO–LUMO gap of $3.49, 4.02, 2.22, \text{and} 3.14 \text{ eV}$, respectively. For the open-shell $\text{MB}_{24}^-$ ($\text{M} = \text{Ti}, \text{Cr}, \text{Fe}, \text{and Ni}$) clusters, alpha HOMO–LUMO gaps are $3.84, 2.63, 3.17 \text{ and} 1.91 \text{ eV}$, respectively, and beta HOMO–LUMO gaps are $1.97, 3.87, 2.45, \text{and} 2.03 \text{ eV}$, respectively. To show more clearly the influence of the transition metal-doping toward the electronic structure, total density of states (TDOS) of each cluster and partial density of states (PDOS) of the transition metal atom were analyzed using the Multiwfn 3.7(dev) code, as shown in Fig. S9 (ESI†). For the closed-shell $\text{MB}_{24}^- \text{(M = Mn, Fe, and Co)}$, metal atoms contribute a part to HOMO and LUMO. However, for the closed-shell $\text{VB}_{24}^-$, V atom contributes nothing to HOMO and LUMO. For the open-shell $\text{TiB}_{24}^-$, alpha HOMO is entirely contributed...
by the orbitals of Ti atom, while Ti atom does not contribute to alpha LUMO, moreover, beta LUMO is mainly contributed by the orbitals of Ti atom, and Ti atom contributes a part to beta HOMO. For open-shell CrB_{24}^{-}, Cr atom contributes a part to alpha HOMO, alpha LUMO and beta LUMO, but Cr atom does not contribute to beta HOMO. For open-shell MB_{24}^{-} (M = Fe, and Ni), metal atoms contribute a part to alpha HOMO, alpha LUMO, beta HOMO, and beta LUMO. It can be seen from Fig. S9(b, c, e, f, h, i, k and l)† that for open-shell MB_{24}^{-} (M = Ti, Cr, Fe, and Ni) clusters, the spin polarization of the electronic states of these systems is obvious.

Fig. S10–S12† show the electron localization function (ELF)\(^{33}\) of the valence electrons of MB_{24}^{-} (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni). ELF can well describe the delocalization (or localization) of electrons and chemical bonds. Under the same isosurface value, a wider connected area occupied by an isosurface map means that electron delocalization is easier, and a narrower connected area occupied by an isosurface map means that electron delocalization is relatively difficult. When the isosurface value is 0.60 (Fig. S10†), the isosurface maps of NiB_{24}^{-} are connected on the plane of the molecule and the isosurface diagrams of MB_{24}^{-} (M = Sc, Ti, V, Cr, Mn, Fe, and Co) are connected on the surface of the cage. Fig. S11† shows the ELF when the isosurface value is 0.70. With this isosurface value, the isosurface diagram of NiB_{24}^{-} is broken on the part of the molecule, and the isosurface diagrams of MB_{24}^{-} (M = Sc, Ti, V, Cr, Mn, Fe, and Co) are connected on the surface of the cage.
Cr, Mn, Fe, and Co) are broken on the surface of the cage. Fig. S10–S11† also show that there is a wide blank area around the metal atom, showing that the metal atom does not form an obvious covalent bond with the surrounding B atoms, which is consistent with the Mayer bond level analysis. Fig. S12† shows the ELF when the isosurface value is 0.80. Under this isosurface value, all the isosurface maps of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) are disconnected and there are no connected regions. However, the isosurface maps of MB$_{24}^-$ (M = Mn, Fe, and Co) show that there is still a connected area on the surface of the cage, indicating that the local delocalization of MB$_{24}^-$ (M = Sc, Ti, V, Cr, and Ni) is weaker than the MB$_{24}^-$(M = Mn, Fe, and Co). Quasi-planar structure NiB$_{24}^-$, cage-type MB$_{24}^-$(M = Sc, Ti, V, and Cr) and tubular MB$_{24}^-$(M = Mn, Fe, and Co) are expected to become the basic units of boron nanomaterials and be further synthesized into borophene, boron nanotubes or other three-dimensional materials. Considering the electron delocalization characteristics of these clusters, they are expected to be applied to molecular devices or switches.

Fig. S13–S16† show the isosurface diagrams of valence electron density for MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) with isosurface values of 0.10, 0.14, 0.20 and 0.52, respectively. Electron density describes the characteristics of electron distribution. Under the same isosurface value, a fatter (represents the bigger volume and wider connected area occupied by an isosurface map) isosurface means more electrons and a thinner isosurface means fewer electrons. The isosurface diagram of Sc is the thinnest (disappeared) and that of Ni is the thickest under the same isosurface value of 0.10, indicating that the electron density of Sc is the minimum and the electron density of Ni is the highest. From the previous atomic charge population analysis, we found that the charges on Sc, Ti, V, Cr, Mn, Fe, Co, and Ni were 0.56, 0.69, 0.70, 0.81, 0.85, 0.89, 0.90 and 0.92, respectively. The valence electrons of Sc, Ti, V, Cr, Mn, Fe, Co, and Ni are 3, 4, 5, 6, 7, 8, 9, and 10, respectively, so when the transferred electrons are removed, the remaining valence electrons of Sc, Ti, V, Cr, Mn, Fe, Co, and Ni should be 2.44, 3.31, 4.3, 5.19, 6.15, 7.11, 8.10, and 9.08. From this, it can be inferred that under the same isosurface value, the isosurface map of the Ni atom is the thickest and that of Sc is the thinnest. In addition, because the B atom has three valence electrons in addition to part of the electrons transferred from the metal atom, it has between 3 and 4 valence electrons. Therefore, the electron density of the B atom should be greater than that of Sc but less than that of V, Cr, Mn, Fe, Co, and Ni atoms. The calculation results (isosurface diagrams of valence electron density) show that as the value of the isosurface increases, the isosurface diagram of the Sc atom will disappear first and that of the B atoms in the ScB$_{24}^-$ will disappear later (as shown in Fig. S13(a) and S15(a)† indicating that the electron density of the B atoms is greater than that of Sc. With the increase of the isosurface value, the isosurface diagrams of the B atoms in MB$_{24}^-$(M = V, Cr, Mn, Fe, Co, and Ni) will disappear first, and the electron density isosurfaces of M (V, Cr, Mn, Fe, Co, and Ni) atoms will disappear later (as shown in Fig. S15(c–h)†), indicating that the electron density of the B atoms is less than those of the M (M = V, Cr, Mn, Fe, Co, and Ni) atoms. The electron density isosurface diagrams are qualitatively consistent with the atomic charge analysis results.

Fig. 3 shows the isosurface diagram of the spin density of MB$_{24}^-$(M = Ti, Cr, Fe, and Ni) with open shell structure at the PBE0/6-311G* level. Spin density reveals the distribution of unpaired electrons (single electrons) in three-dimensional space. A positive spin density means that there are more alpha electrons than beta electrons, while a negative spin density means that there are more beta electrons than alpha electrons. Fig. 3 shows a spin density diagram for an isosurface value of 0.002. Green represents a positive value (alpha electrons), while blue represents a negative value (beta electrons). It can be seen from Fig. 3 that the unpaired single electrons of TiB$_{24}^-$ are alpha electrons that are distributed on Ti and B atoms. The unpaired single electrons of CrB$_{24}^-$, FeB$_{24}^-$, and NiB$_{24}^-$ are both alpha and beta electrons. For CrB$_{24}^-$ system, part of the unpaired alpha electrons are distributed on the Cr atom and part of the unpaired alpha electrons are on one B atoms, and the unpaired beta electrons of CrB$_{24}^-$ are distributed on the other B atoms. For FeB$_{24}^-$ system, part of the unpaired alpha electrons are distributed on the Fe atom and part of the unpaired alpha electrons are on seven B atoms, and the unpaired beta electrons of FeB$_{24}^-$ are distributed on the other B atoms. For NiB$_{24}^-$ system, only a small part of the unpaired alpha electrons is on the Ni atom and most of the unpaired alpha electrons are on the B atoms, and the unpaired beta electrons of NiB$_{24}^-$ are distributed on the two B atoms.

To further quantitatively analyze the distribution of unpaired single electrons on different atoms, the spin density of the B atom should be greater than that of Sc but less than that of V, Cr, Mn, Fe, Co, and Ni atoms. The calculation results (isosurface diagrams of valence electron density) show that as the value of the isosurface increases, the isosurface diagram of the Sc atom will disappear first and that of the B atoms in the ScB$_{24}^-$ will disappear later (as shown in Fig. S13(a) and S15(a)† indicating that the electron density of the B atoms is greater than that of Sc. With the increase of the isosurface value, the isosurface diagrams of the B atoms in MB$_{24}^-$(M = V, Cr, Mn, Fe, Co, and Ni) will disappear first, and the electron density isosurfaces of M (V, Cr, Mn, Fe, Co, and Ni) atoms will disappear later (as shown in Fig. S15(c–h)†), indicating that the electron density of the B atoms is less than those of the M (M = V, Cr, Mn, Fe, Co, and Ni) atoms. The electron density isosurface diagrams are qualitatively consistent with the atomic charge analysis results.

Fig. 3 shows the isosurface diagram of the spin density of MB$_{24}^-$(M = Ti, Cr, Fe, and Ni) with open shell structure at the PBE0/6-311G* level. Spin density reveals the distribution of unpaired electrons (single electrons) in three-dimensional space. A positive spin density means that there are more alpha electrons than beta electrons, while a negative spin density means that there are more beta electrons than alpha electrons. Fig. 3 shows a spin density diagram for an isosurface value of 0.002. Green represents a positive value (alpha electrons), while blue represents a negative value (beta electrons). It can be seen from Fig. 3 that the unpaired single electrons of TiB$_{24}^-$ are alpha electrons that are distributed on Ti and B atoms. The unpaired single electrons of CrB$_{24}^-$, FeB$_{24}^-$, and NiB$_{24}^-$ are both alpha and beta electrons. For CrB$_{24}^-$ system, part of the unpaired alpha electrons are distributed on the Cr atom and part of the unpaired alpha electrons are on one B atoms, and the unpaired beta electrons of CrB$_{24}^-$ are distributed on the other B atoms. For FeB$_{24}^-$ system, part of the unpaired alpha electrons are distributed on the Fe atom and part of the unpaired alpha electrons are on seven B atoms, and the unpaired beta electrons of FeB$_{24}^-$ are distributed on the other B atoms. For NiB$_{24}^-$ system, only a small part of the unpaired alpha electrons is on the Ni atom and most of the unpaired alpha electrons are on the B atoms, and the unpaired beta electrons of NiB$_{24}^-$ are distributed on the two B atoms.

To further quantitatively analyze the distribution of unpaired single electrons on different atoms, the spin density of the B atom should be greater than that of Sc but less than that of V, Cr, Mn, Fe, Co, and Ni atoms. The calculation results (isosurface diagrams of valence electron density) show that as the value of the isosurface increases, the isosurface diagram of the Sc atom will disappear first and that of the B atoms in the ScB$_{24}^-$ will disappear later (as shown in Fig. S13(a) and S15(a)† indicating that the electron density of the B atoms is greater than that of Sc. With the increase of the isosurface value, the isosurface diagrams of the B atoms in MB$_{24}^-$(M = V, Cr, Mn, Fe, Co, and Ni) will disappear first, and the electron density isosurfaces of M (V, Cr, Mn, Fe, Co, and Ni) atoms will disappear later (as shown in Fig. S15(c–h)†), indicating that the electron density of the B atoms is less than those of the M (M = V, Cr, Mn, Fe, Co, and Ni) atoms. The electron density isosurface diagrams are qualitatively consistent with the atomic charge analysis results.
population is calculated at the PBE0/6-311G* level. The spin population is defined as the alpha electron population minus the beta electron population. For example, if the spin population of an atom is one, the alpha electron population of this atom is one more than its beta electron population. A positive population corresponds to an alpha single electron, while a negative population corresponds to a beta single electron. The spin population analysis shows that there is one unpaired alpha electron in the TiB$_{24}^-$ system, of which 0.54 is on the Ti atom and the remaining 0.46 is on the B atoms. This result is consistent with the spin density diagram (Fig. 3(a)). Although the total number of unpaired electrons in the CrB$_{24}^-$, FeB$_{24}^-$, and NiB$_{24}^-$ systems are both 1, 1.64 unpaired alpha electrons and 0.64 unpaired beta electrons, 1.66 unpaired alpha electrons and 0.66 unpaired beta electrons, 1.24 unpaired alpha electrons and 0.24 unpaired beta electrons are distributed in the CrB$_{24}^-$, FeB$_{24}^-$, and NiB$_{24}^-$ systems, respectively. For CrB$_{24}^-$ system, 1.11 alpha electrons are on the Cr atom and 0.53 alpha electrons are on the one B atom, and the 0.64 beta electrons are distributed on the remaining B atoms. For FeB$_{24}^-$ system, 0.75 alpha electrons are on the Fe atom and 0.91 alpha electrons are on the seven B atoms, and the 0.66 beta electrons are distributed on the remaining B atoms. For NiB$_{24}^-$ system, 0.20 alpha electrons are on the Ni atom and 1.04 alpha electrons are on the ten B atoms, and the 0.24 beta electrons are distributed on the two B atoms. These results are also consistent with the spin density diagram of MB$_{24}^-$ (M = Cr, Fe, and Ni). The spin density reflects chemical reactions or adsorption to a certain extent. The single electrons of TiB$_{24}^-$ are all alpha electrons and distributed on the Sc and B atoms that can pair with free radicals or small molecules containing beta single electrons to form new covalent bonds. For the CrB$_{24}^-$ system, one B atom with single alpha electrons can adsorb or react with free radicals or small molecules with single beta electron, while other B atoms with single beta electrons can adsorb or react with atoms, free radicals, or small molecules with alpha single electrons. Spin features of these clusters are expected to be applied to catalysis. In addition, these spin features are expected to produce interesting magnetic properties, which will further lead to potential applications in molecular devices.

### 3.2 Polarization properties

To understand the polarization properties of the clusters, the polarizability of each cluster was calculated, including average isotropic polarizability $\alpha$, anisotropic polarizability $\Delta \alpha$, and the first hyperpolarizability $\beta_0$. $\alpha$ is also called the linear optical coefficient and $\Delta \alpha$ describes the response of the system to electric fields from different directions. The larger the value of $\Delta \alpha$, the stronger is the anisotropic response to the external electric field. The first hyperpolarizability is also called the second-order nonlinear optical (NLO) coefficient, which evaluates the nonlinear optical properties of molecules. It can be

| MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) | $\alpha$/a.u. | $\Delta \alpha$/a.u. | $\beta_0$/a.u. |
|-------------------------------------------------|--------------|-----------------|--------------|
| ScB$_{24}^-$                                    | 342          | 11              | 2            |
| TiB$_{24}^-$                                    | 320          | 9               | 0            |
| VB$_{24}^-$                                     | 308          | 2               | 57           |
| CrB$_{24}^-$                                    | 318          | 32              | 416          |
| MnB$_{24}^-$                                    | 322          | 76              | 1673         |
| FeB$_{24}^-$                                    | 324          | 75              | 1236         |
| CoB$_{24}^-$                                    | 328          | 75              | 1100         |
| NiB$_{24}^-$                                    | 457          | 416             | 494          |
seen from Table 2 that the isotropic polarizability of NiB$_{24}^-$ is higher than that of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, and Co), indicating that the bonding interactions between the atoms within NiB$_{24}^-$ are stronger than those of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, and Co), and NiB$_{24}^-$ is more likely to be polarized by an external electric field. The anisotropic polarizability of VB$_{24}^-$ is the smallest and that of NiB$_{24}^-$ is the largest, indicating that VB$_{24}^-$ has the weakest anisotropic response and NiB$_{24}^-$ has the strongest response to an external electric field. It can be seen from Table 2 that the first hyperpolarizability of TiB$_{24}^-$ is equal to 0, indicating that there is no nonlinear optical response. The first hyperpolarizability of ScB$_{24}^-$ is 2, indicating that the nonlinear optical response is extremely small, and MB$_{24}^-$ (M = Mn, Fe, and Co) have larger first hyperpolarizability, indicating that MB$_{24}^-$ (M = Mn, Fe, and Co) have strong nonlinear optical response. Hence, the MB$_{24}^-$ (M = Mn, Fe, and Co) might be considered as a promising nonlinear optical boron-based nanomaterial.

### 3.3 Photoelectron spectra

Photoelectron spectroscopy is powerful experimental technique to probe the electronic structure of cluster. Photoelectron spectroscopy in combination with theoretical calculations has been used to understand and identify the structures of size-selected boron clusters.$^5$ To facilitate future identifications of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni), the adiabatic detachment energies (ADEs) for MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) were calculated at the PBE0 level, then, we calculated the vertical detachment energies (VDEs) and simulated the photoelectron spectra for MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) with the time-dependent DFT (TD-DFT) method.$^{6,15,64}$ Adiabatic detachment energy of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) represents the electron affinity (EA) of corresponding neutral MB$_{24}$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni). The larger EA can lead to the stronger probability of capturing an electron, i.e., the neutral MB$_{24}$ with larger EA is easier to capture an electron. MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) give the ground-state ADEs of 3.62 (ScB$_{24}^-$), 3.57 (TiB$_{24}^-$), 3.60 (VB$_{24}^-$), 1.92 (CrB$_{24}^-$), 3.08 (MnB$_{24}^-$), 3.11 (FeB$_{24}^-$), 3.01 (CoB$_{24}^-$) and 3.79 (NiB$_{24}^-$) eV, respectively. Among the MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) quasi-planar NiB$_{24}^-$ has the largest ADE (3.79 eV), which is larger than the ADE (3.55 eV)$^{10}$ of quasi-planar B$_{24}^-$. 

Fig. 4 presents the photoelectron spectra of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni). The predicted photoelectron spectra show that CrB$_{24}^-$ has the lowest first vertical detachment energy (VDE) and the largest energy gap (about 1.51 eV) between the first and second bands. The first several bands of photoelectron spectra were used to identify boron clusters,$^{6,15}$ so we will focus on the bands at the low binding energy side. The first peaks of these photoelectron spectra (except for FeB$_{24}^-$) come from the calculated ground-state VDEs of ScB$_{24}^-$, TiB$_{24}^-$, VB$_{24}^-$, CrB$_{24}^-$, MnB$_{24}^-$, CoB$_{24}^-$ and NiB$_{24}^-$ at 3.78, 3.73, 3.86, 3.51, 3.71, 3.42, 3.18 and 3.79 eV, respectively.
2.37, 3.46, 3.24 and 3.87 eV, respectively. The calculated ground-state VDEs of MB$_{24}^-$ (M = Sc, V, Mn, and Co) originate from the detachment of the electron from the molecular orbital (HOMO). However, for open-shell structure MB$_{24}^-$ (M = Ti, Cr, and Ni), the calculated ground-state VDE of each cluster originates from the detachment of the electron from the singly occupied molecular orbital ($\pi$-SOMO). The first peak of FeB$_{24}^-$ comes from the ground-state VDE and second VDE at 3.30 and 3.38 eV, respectively, which originate from detaching the electrons from singly occupied molecular orbital ($\pi$-SOMO) and $\beta$-HOMO$-1$, respectively. The second peaks of FeB$_{24}^-$, ScB$_{24}^-$, V B$_{24}^-$, MnB$_{24}^-$, and CoB$_{24}^- \text{ come from the second calculated VDEs at 4.05, 4.07, 3.85, and 3.67 eV, respectively, which originate from detaching the electrons from HOMO$-1$. The second peak of TiB$_{24}^-$ comes from the second and third VDEs at 3.90 and 3.89 eV, respectively, which originate from detaching the electrons from singly occupied molecular orbital $\beta$-HOMO$-1$ and $\beta$-HOMO$-2$, respectively. The second peaks of CrB$_{24}^-$ and NiB$_{24}^-$ come from the second VDE at 3.87 and 4.09 eV, respectively, which originate from detaching the electrons from $\beta$-HOMO$-1$. The second peak of FeB$_{24}^-$ comes from the third VDE and fourth VDE at 3.86 and 3.95 eV, respectively, which originate from detaching the electrons from singly occupied molecular orbital $\beta$-HOMO$-2$ and $\pi$-HOMO$-1$, respectively. In addition, the

Fig. 6  Calculated Raman spectra with PBE0/6-311+G* method. (a) ScB$_{24}^- \text{; (b) TiB$_{24}$^-; (c) VB$_{24}$^-; (d) CrB$_{24}$^-; (e) MnB$_{24}$^-; (f) FeB$_{24}$^-; (g) CoB$_{24}$^-; (h) NiB$_{24}$^-.
peaks with higher binding energy originate from detaching the electrons from lower molecular orbitals.

Fig. 4 indicates that MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) have different spectral features, especially they have different spectral bands at the low binding energy side. These features can be used to distinguish the MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) and provide important information for the identification of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni). It is worth to note that the structures of clusters cannot directly be identified by common analytical experimental methods, but they can indirectly be determined by using combined theoretical and experimental studies. As the discovery of other anionic boron clusters, if the photoelectron spectra of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) are obtained in experiments, these calculated characteristic bands may be used as theoretical basis for the identification of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni).

3.4 Infrared and Raman spectra

Fig. 5 and 6 show plots of the calculated infrared and Raman spectra of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) with PBE0/6-311+G* method. The lowest harmonic frequencies of these clusters are listed in Table 1. From Table 1 and Fig. 5, it can be seen that the cluster structure has a strong influence on the harmonic frequency because these vibration modes are derived from the stretching or bending vibrations of the atoms. Differences in the arrangement of atoms will lead to different modes of vibration. From the calculation results, it can be seen that among the 69 vibration modes of MB$_{24}^-$ (M = Sc, Cr, Mn, Fe, Co, and Ni), all modes are infrared active and Raman active. The calculation results show that among the 69 vibration modes of TiB$_{24}^-$, 44 modes are infrared-active vibration modes and 25 are inactive modes. Among the 69 vibration modes of TiB$_{24}^-$, there are 62 Raman-active modes and 7 inactive modes. Among the 69 vibration modes of VB$_{24}^-$, 55 vibration modes are infrared active and 14 vibration modes are inactive, and only one mode is Raman-inactive mode and other are Raman-active vibration modes. Under the resonance approximation, the infrared intensity is not zero for only the mode where vibration changes the dipole moment and the Raman activity is not zero for only the mode where vibration changes the polarizability. Therefore, all vibration modes of MB$_{24}^-$ (M = Sc, Cr, Mn, Fe, Co, and Ni) can cause changes in polarizability and dipole moment, these vibration characteristics are mainly due to the low symmetry of MB$_{24}^-$ (M = Sc, Cr, Mn, Fe, Co, and Ni). However, for TiB$_{24}^-$ the 25 infrared inactive modes did not cause changes in dipole moment and the 7 Raman-inactive modes did not cause changes in polarizability. Similarly, for VB$_{24}^-$, the 14 infrared inactive modes did not cause changes in dipole moment and one Raman-inactive modes did not cause changes in polarizability. These vibration characteristics are mainly due to the high $D_{2h}$ symmetry of TiB$_{24}^-$ and lower $C_{2v}$ symmetry of VB$_{24}^-$.

It can be seen from Fig. 5 and 6 that MnB$_{24}^-$, FeB$_{24}^-$, and CoB$_{24}^-$ have some similar band characteristics for their similar structure. Although VB$_{24}^-$ and CrB$_{24}^-$ have similar cage structures, they have different infrared spectra. In particular, infrared spectra of VB$_{24}^-$ presents two adjacent strong peaks in the low-frequency region. In addition, from Fig. 6 and the calculation results, the strongest Raman peaks of MB$_{24}^-$ (M = Sc, Ti, V, and Cr) are all located at approximately 620 cm$^{-1}$, and it maybe due to cage structures of MB$_{24}^-$ (M = Sc, Ti, V, and Cr). The characteristic peaks and band characteristics of these clusters can be used to identify these structures, which can be compared and analyzed in future experiments.

These different results such as the dipole moment, atomic charge, polarizability, and spectral properties are closely related to the structure of clusters. These clusters possess cage structure, tubular structure, and quasi-planar structure, which lead to different electron structures. In addition, the doping of metal atom also has an effect on the electronic structure, as the previous analysis of density of states. Therefore, these clusters show different properties.

4. Conclusions

Research results include the following points. The global minima obtained for the MB$_{24}^-$ (M = Sc, Ti, and V) clusters correspond to cage structures, and the MB$_{24}^-$ (M = Mn, Fe, and Co) clusters have similar distorted four-ring tube with six boron atoms each. Interestingly, the global minima obtained for the NiB$_{24}^-$ cluster tend to a quasi-planar structure. The electron localization function of MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) indicates that the local delocalization of MB$_{24}^-$ (M = Sc, Ti, V, Cr, and Ni) is weaker than that of MB$_{24}^-$ (M = Mn, Fe, and Co), and there is no obvious covalent bond between doped metals and B atoms. Similar to tubular B clusters and deformed B$_2$ cluster, quasi-planar structure NiB$_{24}^-$, cage-type MB$_{24}^-$ (M = Sc, Ti, V, and Cr) and tubular MB$_{24}^-$ (M = Mn, Fe, and Co) are expected to become the basic units of boron nanomaterials and be further synthesized into borophene, boron nanotubes or other three-dimensional materials. Considering the electron delocalization characteristics of these clusters, they are expected to be applied to molecular devices or switches. The spin density and spin population analyses reveal that MB$_{24}^-$ (M = Ti, Cr, Fe, and Ni) have different spin characteristics, for example, single electrons of TiB$_{24}^-$ are all alpha electrons and distributed on the Sc and B atoms that can pair with free radicals or small molecules containing beta single electrons to form new covalent bonds. Spin features of these clusters are expected to be applied to catalysis. In addition, these spin features are expected to produce interesting magnetic properties, which will further leads to potential applications in molecular devices. The polarization analysis indicates that MB$_{24}^-$ (M = Mn, Fe, and Co) have larger first hyperpolarizability, indicating that they have strong nonlinear optical response and might be considered as a promising nonlinear optical boron-based nanomaterial. The calculated photoelectron spectra indicate that MB$_{24}^-$ (M = Sc, Ti, V, Cr, Mn, Fe, Co, and Ni) has different characteristic peaks that can be compared with future experimental values and provide a theoretical basis for the identification and confirmation of these single-atom transition metal-doped boron clusters. This research has enriched the structure of single-atom transition metal-doped boron clusters and has certain theoretical
guiding significance for the preparation of new boron nanomaterials, such as borophene and boron nanotubes.

Conflicts of interest

There are no conflicts of interest to declare.

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