The atomic-level regulation of single-atom site catalysts for the electrochemical CO$_2$ reduction reaction

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The electrochemical CO$_2$ reduction reaction (CO$_2$RR) is viewed as a promising way to remove the greenhouse gas CO$_2$ from the atmosphere and convert it into useful industrial products such as methane, methanol, formate, ethanol, and so forth. Single-atom site catalysts (SACs) featuring maximum theoretical atom utilization and a unique electronic structure and coordination environment have emerged as promising candidates for use in the CO$_2$RR. The electronic properties and atomic structures of the central metal sites in SACs will be changed significantly once the types or coordination environments of the central metal sites are altered, which appears to provide new routes for engineering SACs for CO$_2$ electrocatalysis. Therefore, it is of great importance to discuss the structural regulation of SACs at the atomic level and their influence on CO$_2$RR activity and selectivity. Despite substantial efforts being made to fabricate various SACs, the principles of regulating the intrinsic electrocatalytic performances of the single-atom sites still needs to be sufficiently emphasized. In this perspective article, we present the latest progress relating to the synthesis and catalytic performance of SACs for the electrochemical CO$_2$RR. We summarize the atomic-level regulation of SACs for the electrochemical CO$_2$RR from five aspects: the regulation of the central metal atoms, the coordination environments, the interface of single metal complex sites, multi-atom active sites, and other ingenious strategies to improve the performance of SACs. We highlight synthesis strategies and structural design approaches for SACs with unique geometric structures and discuss how the structure affects the catalytic properties.

1. Introduction

The scalable applications of fossil fuels have generated huge technological developments and resulted in significant improvements in people’s living conditions. However, it also causes a high concentration of CO$_2$ in the atmosphere, which contributes to the aggravation of the greenhouse effect, thus shifting ecological balance and accelerating ice sheet melting in Eastern Antarctica.¹ There is a general agreement that efforts should be made to control and reduce the CO$_2$ concentration in the atmosphere. Although fossil fuel is a significant part of our

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energy structure, CO$_2$ emission is inevitable. Capturing, storing and converting CO$_2$ has become a promising way to remove CO$_2$ from the atmosphere.$^2$ Significant efforts have been made in this field, the CO$_2$ reduction reaction (CO$_2$RR) has become one of the hottest topics among them.$^3$ The products of the CO$_2$RR are mainly methane, methanol, formate, ethanol, and so on, which are widely used in industrial production. The valuable products of CO$_2$RR have attracted extensive attention in this field in recent years. There are various approaches used to achieve CO$_2$ reduction, compared to thermocatalysis, biocatalysis and photocatalysis, electrocatalysis has more moderate reaction conditions, lower costs and higher yields.$^4$–$^10$ The electrochemical reduction of CO$_2$ can use electricity generated from renewable energy, such as wind energy and hydro-energy.$^11$ The conversion from electrical energy to the chemical energy of CO$_2$RR products can be viewed as a storage form of renewable energy, which is safe and convenient for transportation and long-term storage.

However, there still remains great challenges for the CO$_2$RR, as it has sluggish kinetics, a complex multi-electron mechanism and a hydrogen evolution reaction (HER) competition reaction.$^{12,13}$ The CO$_2$RR performance of catalysts is related to the rate determining steps, including CO$_2$ adsorption, *COOH and *CO formation on the active sites, which is decided by the adsorption free energy of CO$_2$, the binding energy of the intermediates, the electron transfer rate and so on.$^{14,15}$ For further reactions, the binding energy of intermediates, especially *CO is also crucial to the formation of C$_2$ products. Therefore, it is of great importance to manipulate the electronic and geometric structure of the catalysts, which can regulate the rate determining steps by changing the binding and formation energies of the intermediates, thus changing the activity and selectivity of the CO$_2$RR.$^{16,17}$

Among all the kinds of catalysts used, single-atom site catalysts (SACs) have drawn significant attention owing to their unique structure and properties, which have great potential to bridge the gap between homogenous and heterogeneous catalysts.$^{18–22}$ SACs feature isolated metal atoms dispersed on substrates as active sites, which result in multiple advantages: (i) they have the maximum theoretical atom utilization.$^{23–25}$ (ii) Single metal atoms, as active centers, generate low-coordination environments, as well as unique electronic and geometric structures, leading to enhanced catalytic activities.$^{26–30}$ (iii) The uniformity of the electronic and geometric structure of the active sites in SACs endows them with similar spatial and electronic interactions with substrate molecules, which facilitates an improvement in the catalytic selectivity.$^{31,32}$ (iv) Furthermore, the structural simplicity and uniformity of the SACs are conducive to the characterization and identification of catalytic active sites, which enables SACs to serve as ideal models to study reaction mechanisms.$^{33–36}$ This also indicates opportunities to design and regulate the active sites of SACs at the atomic level.$^{37–42}$ (v) Specifically, in the electrochemical CO$_2$RR, atomically dispersed metal atoms are suitable for single or coupled proton-electron transfer, and enhance the CO$_2$ adsorption and activation, leading to a high selectivity for C$_1$ products.$^{43–46}$ Meanwhile, isolated metal atoms offer an individual single adsorption site for CO$_2$, thus C$_2$ products are more difficult to obtain on SACs.$^{5–49}$ Despite substantial efforts being made to fabricate various SACs, the principles of regulating the intrinsic electrocatalytic performance of the single-atom active sites still needs to be sufficiently investigated.$^{50–52}$

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In this perspective article, we first focus on the controlled synthesis of SACs at the atomic scale for electrochemical CO₂ reduction reactions with regards to five aspects: regulation of the central metal atom, the coordination environment, the interface of single metal complex sites, multi-atom active sites and other ingenious strategies to improve the performance of the SACs. Finally, the challenges and potential for precise control over the synthesis and accurate characterization and identification of the active sites of SACs, as well as a study of the reaction mechanisms on electrochemical CO₂RR, will be discussed.

2. Design and synthesis of SACs for the CO₂RR

The active sites of SACs can be divided into central metal atoms and the surrounding coordination environment, the influences of which on the activity and selectivity will be discussed first. Then, we will focus on the kind of SACs that constitute anchored metal complexes with constructed structures on the substrates, which are different from the traditional SACs that involve the building of coordination structures on substrates by anchoring metal atoms. Moreover, as the active sites of traditional SACs are separated atomically, they are expected to be more favorable to the C₂ product. In the fourth section, we will discuss multi-atom active sites which can introduce multiple CO₂ molecules into a single reaction. Finally, we will review other ingenious strategies to improve the CO₂RR performance of the SACs.

2.1 Regulation of the central metal

2.1.1 Regulation of the central metal elements. The central metal atoms are not only regarded as the essential constituents for traditional homogenous catalysts, but also play central roles in SACs. The electronic structures of active sites are largely based on different kinds of central metal and their different valence states. Gong et al. proposed an intrinsic descriptor (Φ) correlated with the electronic state of the central metal, which can enable a metal–nitrogen–doped carbon (M–N–C) SACs catalytic performance in the CO₂RR. Φ is defined as Φ = VₓM × EₓM/rₓM, in which VₓM, EₓM, rₓM represents the valence electron number of metals, the electronegativity of the central metals, and the radius of the metal ions, respectively. By calculating Φ, they predicted the CO₂RR performance sequence would be Co > Fe > Mn > Ni > Cu, which was successfully confirmed by the faradic efficiency (FE) and the onset potential of the experimental results. This work highlighted that the choice of central metal is of great importance in the design of SACs for the CO₂RR from a computational perspective.

Although SACs based on noble metals have revealed a good activity and selectivity, the shortage of noble metal resources and their expensive price has motivated researchers to investigate non-noble metal SACs. Cu and transition metals such as Fe, Ni, Co and so on are viewed as promising candidates because of their rich d orbital electrons and the variation in the valence state. Although the electrochemical CO₂RR has multiple products, CO, as the simplest one, is often used to evaluate the performance of the central metals. Li et al. investigated the different catalytic performances of metal–Nₓ (M = Mn, Fe, Co, Ni, and Cu) moieties on the M–N–C catalysts. Catalytic experiments revealed a volcano trend between the atomic number of the tested metal and their electrochemical CO₂RR performance, which can be explained by the Gibbs free energy changes of the rate determined steps. Based on different electrochemical potentials, Fe and/or Co are located at the top of the volcano (Fig. 1a). In contrast, there is no obvious trend towards faradic efficiency for CO. The high selectivity of Fe and Co (FE CO > 80%) can be explained by the binding energy of CO₂ and H*, which are associated with the electron number of d-antibonding. Ju et al. investigated the CO₂-to-CO electrochemical reduction catalytic performance of the M–N–C catalysts with different metal centers (M = Mn, Fe, Co, Ni, Cu). Fe–N–C showed a maximum FE CO of 65% at −0.55 V versus RHE (V_RHE), and Ni–N–C exhibited a maximum FE CO of 85% at −0.78 V_RHE.

Fig. 1 (a) The volcano trend of M–N–C catalysts in terms of electrochemical CO₂RR performance. Partial current densities of M–N–C catalysts for CO, HCOO⁻, and H₂ products at −0.6 V_RHE and −0.5 V_RHE. Reproduced from ref. 56 with permission from the American Chemical Society, copyright 2019. (b) Experimental CO TOFs of M–N–C catalysts. Reproduced from ref. 40 with permission from Springer Nature, copyright 2017.
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Combined with the density functional theory (DFT) calculations, Fe–N–C and Ni–N–C were predicted to be promising SACs for CO$_2$-to-CO. Zheng et al. developed a universal principle to synthesize a series of SACs M–N–C (M = Fe, Co, Ni, Cu) using *in situ* pyrolysis. The experimental results revealed Ni > Fe > Cu > Co as the catalytic performance sequence of SACs M–N–C in electrochemical CO$_2$-to-CO conversion. They attributed this result to the intrinsic property of the pyrrole-type M–N$_4$ structures. Pan et al. synthesized the M–N–C (M = Fe, Co) catalysts with M–N$_4$ sites from the Fe- or Co-doped MOFs precursors. Fe–N–C reached a maximum FE$_{CO}$ of 93% at $-0.58$ V$_{RHE}$, which is much higher than the maximum FE$_{CO}$ of Co–N–C, which was 45% at $-0.59$ V$_{RHE}$ (Fig. 2a and b). This experimental result is consistent with the results of the DFT calculations. In conclusion, regardless of the nuances which may be caused by different substrates, Ni and Fe showed the most promising catalytic activities among the M–N–C catalysts for the CO$_2$-to-CO electrochemical CO$_2$RR, which was verified using multiple experiments.

Furthermore, different central metals have different binding energies with intermediates such as *CO*, *CO$_2$*, and *COOH, which may lead to different products. For example, a high *COOH binding energy and weak *CO binding energy leads to CO, the Sn, Pb species with low *CO$_2$* binding energy lead to formate or formic acid, and metallic Cu with an enhanced *CO and *COOH binding energy leads to hydrocarbons. Zhang et al. synthesized N-doped porous carbon supported Cu single atom catalysts for electrochemical CO$_2$ reduction to acetone, which exhibited a maximum FE$_{acetone}$ of 36.7% at $-0.36$ V$_{RHE}$. Han et al. designed microporous N-doped carbon supported Zn single atom catalysts for reducing CO$_2$ to CH$_4$, which reached a maximum FE$_{CH_4}$ of 85% at $-1.8$ V$_{SCM}$.

However, the design of SACs for complicated products is still hindered by complicated mechanisms and various by-products. With the help of theoretical calculations, some researchers have provided guidance for future experimental efforts. Cui et al. used DFT calculations and a computational hydrogen electrode (CHE) model to investigate C$_2$N–graphene supported SACs with 12 different metal centers [M@C$_2$N]. They conducted DFT calculations with the models of the metal atom confined in the N$_6$ cavity as the active sites. Among the 12 metals, Ti, Mn, Fe, Co, Ni, Cu, Rh, and Ru preferred the CO$_2$RR to the HER under 0 V (Fig. 2c). Furthermore, different M@C$_2$N were predicted to produce methane (M = Ti, Mn) and methanol (M = Fe, Co, Ni, Ru), as their different carbophilicity and oxophilicity could determine the formation of the important intermediates *CH$_3$O and *CH$_2$OH, leading to the products CH$_4$ and CH$_3$OH, respectively.

In addition to the transition metals, some SACs with main group elements also reveal an excellent performance in the electrochemical CO$_2$RR. Zhang et al. prepared a Bi-single-atom catalyst supported on N-doped carbon networks (Bi SAs/NC) for CO$_2$ reduction to CO. Bi SAs/NC was synthesized by a bismuth-based metal organic framework (MOF) and dicyandiamide (DCD) thermal decomposition. During the decomposition, Bi nanoparticles (NPs) were generated first, the ammonia...
generated from DCD decomposition promoted the atomization of the Bi NPs (Fig. 2d). Under $-0.5 \text{ V}_{\text{RHE}}$, Bi SAs/NC exhibits a maximum FE$_{\text{CO}}$ of 97%, and a current density of 3.9 mA cm$^{-2}$. DFT calculations illustrated that the Bi–N$_4$ sites act as the active centers, which promotes CO$_2$ activation and *COOH formation.

2.1.2 Regulation of the central metal valence. Another determining factor for the electronic structure of SACs is the valence of the central metal. Gu et al. prepared Fe$^{3+}$–N–C by pyrolysis of Fe-doped ZIF-8 in N$_2$ at 900 °C. The Fe ions maintain a +3 oxidation state during electrocatalysis, which was confirmed by operando X-ray absorption spectroscopy. Spectroscopic characterization confirmed the Fe$^{3+}$ ions coupled electronically with pyrrolic N, resulting in a Fe$^{3+/2+}$ lower reduction potential, leading to the stabilization of Fe$^{3+}$. Catalytic experiments revealed Fe$^{3+}$–N–C had a lower onset overpotential, higher turnover frequency (TOF) and better stability than Fe$^{2+}$–N–C, which could be explained by the weaker CO binding with Fe$^{3+}$ (Fig. 2e and f). Yang et al. prepared low-valence Ni(+1) SACs that exhibited a high catalytic performance in CO$_2$-to-CO electrochemical reduction. The experimental and DFT calculation results illustrated the delocalization of the unpaired electron in the Ni 3d$^x$–$y^2$ orbital and the overlap between the Ni 3d$^x$–$y^2$ and C 2p orbital promoted the formation of CO$_2$*– species. Numerous studies have revealed that SACs with a unique valence metal center can deliver an excellent catalytic performance in CO$_2$ reduction, the characterization of the valence of the central metal ions is still limited. As the valence may change during the catalysis, significant efforts should be made to develop operando characterization. Also, the electronic metal-support interaction (EMSI) between the central metal atoms and coordinated atoms plays an important role in determining the valence of the single metal atoms, which will be introduced in the next section.

2.2 Regulation of the coordination environment

2.2.1 Short-range regulation. The surrounding coordination environment is another important factor in manipulating the intrinsic nature of single atom sites in SACs. As aforementioned, it has a strong relationship with the valance state of the central atoms. The unique coordination structure of SACs supported on a well-designed substrate surface gives opportunities to construct central metal atoms with unique valances. Many studies have focused on Ni-single-atom catalysts with a +1 oxidation state. The average +1 oxidation state of Ni in the NC-carbon nanotubes (CNTs) (Ni) was between the metallic state Ni(0) and oxidized state Ni(+2), which can be explained by the electronic interaction between the central metal atoms and the neighboring atoms.

The coordination atoms, coordination number and coordination steric structure are the main influencing factors in the coordination environment of the single-atom sites, and these play important roles in regulating the electronic and geometric structures of the single-atom sites. Different coordination atoms directly influence the strength of the EMSI, changing the valence electron distribution of single-atom sites, thus leading to a different catalytic performance for the CO$_2$RR. Nitrogen atoms are the most common coordination atoms owing to the significant development of M–N–C catalysts. Therefore,
plenty of studies have investigated the hybrid coordination environment of the nitrogen and carbon atoms. Hossain et al. explored a series of Ni-single-atom catalysts with different N and C hybrid coordination environments of the Ni sites (Ni–N$_x$C$_y$, Ni–N$_x$C$_z$) on a graphene support. The grand canonical potential kinetics (GCP-K) methodology was developed to predict their catalytic activities for CO$_2$ reduction to CO and H$_2$ production. The prediction revealed the HER performance is correlated with the number of coordinated C atoms, indicating Ni–N$_4$ is least favorable for HER. Ni–N$_4$ exhibited the best performance for CO$_2$ reduction, reaching 40 mA cm$^{-2}$ with FE$_{CO}$ ≈ 100% at −1.05 V$_{RHE}$ (Fig. 3a). Research on Co$_1$–N$_4$.C$_y$ conducted by Geng et al. reported similar results. Their study revealed that compared to Co$_1$–N$_4$.C$_z$, Co$_1$–N$_4$ exhibited a higher binding strength with CO$_2$. This resulted in the easier activation of CO$_2$ and led to a higher current density and TOF of Co$_1$–N$_4$. However, other studies may come to a different conclusion. Zhao et al. applied $ab$ initio molecular dynamics (AIMD) to investigate the catalytic kinetics of Ni-single-atom catalysts supported by N-doped graphene toward CO$_2$-to-CO electrochemical reduction via a “slow-growth” sampling approach. Calculations predicted that the higher Fermi level of the Ni–N$_4$ site at the charge-neutral state led to its lower capacity, suggesting its higher electrochemical barriers and lower activity. The activity of Ni–C$_4$ and Ni–C$_3$N$_1$ sites differs by the CO desorption energy, the lower desorption barrier of the Ni–C$_3$N$_1$ sites, resulting in its higher activity. As a result, the coordination environment with one nitrogen and three carbon atoms is believed to have the best activity and selectivity for CO$_2$RR (Fig. 3b). The different results could be attributed to several factors. Firstly, the different calculation models, which focused on different rate determined steps and are inaccurate compared to the real experiment. Secondly, the different catalytic activity evaluation indicators, such as the FE, current density, TOF, and so on. Moreover, the different substrates and their synthesis process may also influence the activity, even though single-atom sites have a similar composition.

Oxygen and sulphur atoms, which are electron-rich and easy to dope, can also be introduced to the hybrid coordination environment. The hybrid coordination environment not only regulates the electronic structure of single-atom sites, but also creates defects on the substrate, leading to a better catalytic activity and stability. Yang et al. reported a Ni single-atom site catalyst supported on N,S-doped graphene (A-Ni-NSG) and N-doped graphene (A-Ni-NG). The weaker and wider X-ray diffractometry (XRD) peaks indicated A-Ni-NSG has a defect-rich structure compared to A-Ni-NG (Fig. 3c). Multiple characterizations revealed the existence of Ni–S bonds in A-Ni-NSG. Compared to A-Ni-NG, A-Ni-NSG exhibited a lower onset overpotential, larger current density and better chemical stability, suggesting the introduction of S atoms into the coordination environment improved the catalytic activity (Fig. 3d). Wang et al. synthesized a nanoporous carbon supported Fe single-atom catalyst with a Fe–N$_x$O$_2$ structure. The extended X-ray absorption fine structure (EXAFS) wavelet transform (WT) results confirmed the existence of Fe–O. In the Fe–N$_x$O$_2$ structure, four N atoms were coordinated in a planar position to Fe, while the O atom was coordinated out-of-plane (Fig. 3e). This coordination structure was optimized using DFT calculations as the lowest free energy structure. DFT calculations also revealed the CO desorption barrier on Fe–N$_x$O$_2$ is relatively low, leading to easier CO desorption and alteration of the rate determining step (RDS). The RDS changed from $^*$CO-to-CO to CO$_2$-to-$^*$COOH, indicating that Fe–N$_x$O$_2$ had a better performance at a high overpotential. The Fe–N$_x$O$_2$ catalyst reached FE$_{CO}$ ≈ 96% at −0.57 V$_{RHE}$, suggesting the Fe–N$_x$O$_2$ structure could be a promising direction for designing M–N–C CO$_2$RR catalysts. Also, there are some novel coordination structures, such as the π → d coordination interactions which are not viewed as an atom coordination, but as a bond coordination instead. Shen et al. reported the novel structure of a triphenylene–graphdiyne supported Cu-single-atom catalyst (Cu@TP-GDY) using DFT calculations. The DFT calculations unveiled the atomically dispersed Cu species were confined in triangular pores by π → d interactions between diacetylenic linkages and Cu atoms. CO$_2$-to-COOH$^*$ was predicted to be the rate determined steps on Cu@TP-GDY. Cu@TP-GDY was expected to show a better catalytic performance towards CO$_2$RR, as its overpotential was found to be lower than most of the Cu-based catalysts.

The change of the coordination number also significantly affects the activity of single-atom sites, which will not only influence the geometric structure, but also reattribute the electronic structures, leading to different catalytic performances. Fan et al. constructed a Ni single atom catalyst (NC-
CNTs (Ni) through the pyrolysis of Ni particles containing commercial multi-walled carbon nanotubes (MWCNTs) coated with a polymeric multi-walled carbon nanotubes (MWCNTs) coated with a polymeric layer (Fig. 4a). EXAFS fitting results indicated the Ni–N coordination number is 2.5 ± 0.2. The authors viewed NiN₃ moieties as the active center in the NC-CNTs (Ni). DFT calculations revealed the formation of *COOH has a lower free energy on NiN₃ (pyrrolic) than on NiN₄, which means the NC-CNTs (Ni) exhibit a better catalytic performance for electrochemical CO₂-to-CO conversion (Fig. 4b).

The most common strategy to create SACs with a lower coordination number is high temperature pyrolysis. Pan et al. synthesized polymer-derived hollow N-doped porous carbon spheres (HNPCSs) supported Co–N₃ sites catalysts. Cobalt phthalocyanines are uniformly anchored on the HNPCSs, together with the strong electronic interactions which were revealed by Raman spectroscopy. As the pyrolysis temperature was raised to 400 and 600 °C, the FE of Co–N₃/HNPCSs dropped and the coordination number decreased to 4 and 3 (Fig. 4c). The Co–N₅/HNPCSs catalyst exhibited a high FE (90%) over a wide potential range (–0.57 to 0.88 V_RHE), which can be attributed to the low *COOH formation free energy and moderate binding energy of CO on the Co–N₅ sites. In contrast, a negative correlation between the N coordination numbers and catalytic activity was reported. In research published by Gong et al., a series of N-doped carbon supported Ni SACs (Ni–Nₓ,Cₓ) (x = 2, 3, 4), Ni–Nₓ–C achieved the highest FE of 98% and the highest TOF of 1622 h⁻¹ (Fig. 4d). Wang et al. reported Co single-atom catalysts on N-doped porous carbon (Co–N₃ SACs, x = 2, 3, 4), the Co–N₃ SACs exhibited a high FE (94%) and a high current density (Fig. 4e).

The uncertain correlation between the N coordination numbers and the catalytic performance in a different series of SACs may be explained by their different coordination structures, owing to the different synthesis processes. Co–N₃/HNPCSs (x = 3, 4) was obtained by the pyrolysis of Co–N₅/HNPCSs, while Ni–Nₓ–C SACs (x = 2, 3, 4) and Co–Nₓ SACs (x = 2, 3, 4) were obtained by the pyrolysis of the MOFs precursors under different temperatures.

Although it is difficult to control the coordination number exactly using the pyrolysis method, some well-designed strategies have been developed to produce SACs with a defined coordination number. Rong et al. developed a strategy to synthesize vacancy-defect Ni SACs (Ni–Nₓ–V). They first prepared Ni–NₓO single-atom catalysts under 500 °C. As the temperature rises, the coordinated oxygen atom on the substrate can be gradually evaporated leaving vacancy-defects, thus the Ni–Nₓ–V SACs were formed (Fig. 5a). The structure of the Ni–Nₓ–V sites was confirmed using Fourier transform (FT)-EXAFS fitting in the R space. At −0.9 V_RHE, Ni–Nₓ–V exhibited a high FE of 90%, a high current density of 65 mA cm⁻² and a high TOF of 1.35 × 10⁸ h⁻¹. DFT calculations were performed on Ni–Nₓ, Ni–Nₓ, (in which the Ni atom was coordinated with three nitrogen atoms and exhibited a symmetrical structure) and Ni–Nₓ–V (in which the Ni atom was coordinated with three nitrogen atoms and a vacancy, and exhibited an asymmetrical structure). Ni–Nₓ–V and Ni–Nₓ both exhibited a lower free energy in the RDS (the formation of *COOH), but Ni–Nₓ encountered difficulties when releasing the CO, suggesting the vacancy-defect structure in Ni–Nₓ–V greatly promoted the catalysis of CO₂ reduction. Zhang et al. reported structured FeN₅ SACs on the N-doped graphene support through the pyrolysis of hemic and melamine. A large amount of melamine was added, which served as a nitrogen source to promote the formation of Fe–N₅ sites. The N atoms in the adjacent layers provided axial ligand sites for FeN₅ to convert to FeN₅ (Fig. 5b). The FeN₅ catalyst showed a greater performance towards FeN₅ in CO₂-to-CO conversion owing to the weaker CO binding strength on FeN₅, and reached a maximum FE of 97.0% at −0.46 V_RHE.
The effect of the coordination steric structure towards active sites is often overlooked because of its close connection with the coordination atoms and coordination number. However, it is of great importance to investigate the appropriative coordination steric structure. This provides a new strategy to regulate the electronic structure, directly modifying the accessibility of the single-atom sites, and eventually improving the selectivity and activity. Cheng et al. developed microwave exfoliated graphene oxide supported Ni SACs (Ni–N–MGO). Aberration-corrected scanning transmission electron microscopy (AC-STEM) combined with X-ray absorption spectroscopy (XAS) indicated the atomically dispersed Ni atoms were anchored on the edges of nanopores (Fig. 5c). The DFT calculations suggested the three N coordinated edge-anchored Ni sites have a better performance than in-plane structures owing to their moderate CO₂ activation energy and CO desorption energy.

In addition to all the aforementioned improvements in the catalytic performance, the rational design of the coordination environment can also contribute to the synthesis process, and even improve the durability of SACs. Yang et al. investigated the process of defect-containing N-doped carbon supported Ni NPs converted to Ni single atoms through thermal atomization. Aberration corrected high-angle annular dark-field scanning transmission electron microscope (HAADF-STEM) measurements and environmental transmission electron microscopy (TEM) were employed to characterize the process. The average size of the Ni NPs was gradually increased as the temperature rose. When the temperature was above 673 K, the Ni NPs started the atomization process, distributed to Ni single atoms. EXAFS revealed the dominant peak of Ni–N at 1.32 Å appeared after the thermal process, while the Ni–Ni peak at 2.15 Å disappeared, suggesting the Ni–N strong coordination promoted the Ni NPs atomization process (Fig. 5d).

2.2.2 Long-range regulation. Despite the first shell coordination atoms having the strongest EMSI, the higher shell atoms also sometimes play an important part in the promotion of the catalytic performance. Some regulations of atoms around the coordination environment can be viewed as a co-catalysis or relatively independent active site to accelerate the rate determined steps or promote the side reactions, though these do not regulate the electronic structure of the central metals directly. Pan et al. explored two different kinds of Ni–N₄ moieties: the Ni–N₂₋₂₋₂₋₄₋₈ type at the edge of the carbon matrix and the Ni–N₄₋₄₋₄₋₈ type in the bulk of the carbon matrix (Fig. 6a). The DFT calculations indicated the Ni–N₂₋₂₋₂₋₄₋₈ site with dangling bonds for active C atoms was viewed as the active moiety because of its lower activation energy for *COOH → *CO + *OH. In contrast, the bulk-hosted Ni–N₂₋₂₋₄₋₁₀ site seemed to be inactive, which could be explained by the fact that it was embedded in a graphitic layer. Previous work published by Pan et al. pointed out that the critical difference between two types of M–N₄ is that the adjacent carbon atoms of the M–N₂₋₂₋₂₋₄₋₈ types have dangling bonds, while the adjacent carbon atoms of M–N₂₋₂₋₄₋₁₀ have not. DFT calculations revealed that after one of the C=O bonds breaks, the product, CO, is adsorbed on the M site, while OH is adsorbed on the dangling bonds of the adjacent C atom.

Fig. 6 (a) Ni–N₄₋₄₋₄₋₁₀ sites (left) are inactive for the *COOH dissociation reaction. Ni–N₂₋₂₋₂₋₄₋₈ sites are active because of the dangling bonds on the adjacent C atoms. Reproduced from ref. 82 with permission from the Royal Society of Chemistry, copyright 2019. (b) Raman spectra of CoPc, the CoPc/CNT(6%) hybrid, and CNTs. Reproduced from ref. 31 with permission from Springer Nature, copyright 2017. (c) Total current density, (d) faradic efficiencies, and (e) effective turnover frequencies of CCG/CoPc–A and CCG/CoPc hybrids. Reproduced from ref. 85 with permission from the American Chemical Society, copyright 2019.
This result supports the lower energy of the *COOH dissociation on the M–N$_2$–C$_6$ sites, leading to its high catalytic performance. In addition to the C atoms, uncoordinated N atoms, as a rich species on the M–N–C catalysts, may also serve as independent active centers. In the research reported by Song et al., SACs with Co–C$_2$N$_2$ moieties were synthesized by the pyrolysis of ZnO@ZIF to catalyze both the CO$_2$RR and HER. At $-0.7 \text{ VR}_{\text{RHE}}$ to $1.0 \text{ VR}_{\text{RHE}}$, it exhibited an almost 100% FE$_{\text{CO}}$ and an ideal CO/H$_2$ ratio of 1/2. Potassium thiocyanate (KSCN) poisoning experiments and DFT calculations confirmed that the Co–C$_2$N$_2$ moieties served as the active sites for CO$_2$RR, while the additional N functional groups served as the active sites for HER.

2.3 Interface design of the single metal complexes

Traditional SACs were synthesized through anchoring metal atoms on the prepared substrate with coordination atoms to construct a coordination structure such as M–N$_4$ which was proved to be analogous to molecular catalysts. Recently, a novel strategy was reported to synthesize SACs by anchoring metal complexes with a formed M–N$_4$ structure on a carbon metal substrate. The M–N$_4$ structure in the metal precursor can integrally anchor on the substrate, leading to the formation of SACs with well-defined active sites. Also, as the metal complexes offer M–N$_4$ there is no need for the substrate to provide extra coordination atoms, therefore carbon materials (e.g., graphene, carbon nanotubes, and MOFs) have become the most popular substrates in metal complex derived SACs. Metal phthalocyanine is a promising candidate for this kind of synthesis strategy. Zhang et al. anchored a cobalt phthalocyanine (CoPc) molecule on a carbon nanotubes (CNT) to synthesize a CoPc/CNT catalyst. Inductively coupled plasma mass spectrometry (ICP-MS) demonstrated the amount of Co in the prepared CoPc/CNT was 0.63 wt%. Material characterizations also revealed the C and N of CoPc was distributed on the sidewalls of the CNTs that overlapped with the nanotube structures. Some of the vibrational modes of the CoPc are prohibited, indicating the strong electronic interaction between CoPc and CNT (Fig. 6b). CoPc/CNT exhibited a high activity, stability and selectivity in the CO$_2$-to-CO conversion. The phthalocyanine molecule offers several sites for organic modification, leading to improvements in the catalytic performance. The researchers further prepared a CoPc-CN/CNT hybrid catalyst using cobalt-2,3,7,8,12,13,17,18-octacyano-phthalocyanine (CoPc-CN). CoPc-CN/CNT delivered an even better catalytic performance for the CO$_2$-to-CO electrochemical reaction than CoPc/CNT. CoPc-CN/CNT maintained a FE$_{\text{CO}}$ value of over 95% at $-0.53$–$0.63 \text{ VR}_{\text{RHE}}$. Choi et al. anchored cobalt[2+] octa-alkoxy phthalocyanine (CoPc-A) on chemically converted graphene (CCG) via π–π stacking. Compared to the graphene supported cobalt phthalocyanine catalyst (CCG/CoPc), the octa-alkoxy groups on phthalocyanine helped to suppress its aggregation, leading to its significantly enhanced catalytic activity. CCG/CoPc-A exhibited a higher total current density, a higher FE$_{\text{CO}}$, higher eTOFs for CO production and over 30 h of stable CO conversion (Fig. 6c–e). As with the other SACs, the metal loading will largely effect the performance of the catalysts. Yang et al. synthesized a CoTAPc–ZIF-90 hybrid catalyst through anchoring cobalt phthalocyanine on the surface of ZIF-90 using the Schiff base reaction. The SEM images confirmed the CoTAPc units were distributed uniformly, and the XANES spectra demonstrated the Co–N$_4$ structure. Catalytic control experiments revealed the catalytic performance of CoTAPc–ZIF-90, which was quantified by the CO partial current density, could be improved by increasing the content of CoTAPc from ZIF-90 (0 mg CoTAPc) to ZIF-90-4 (30 mg CoTAPc) (Fig. 7a). ZIF-90-4, synthesized using 30 mg of CoTAPc and 100 mg of ZIF-90, exhibited a high FE$_{\text{CO}}$ of 90% at $-0.97 \text{ VR}_{\text{RHE}}$ and a large current density of 13 mA cm$^{-2}$.

Additionally, the catalytic performance of the phthalocyanines derived SACs with different metal centers was investigated. Wang et al. reported a series of SACs (Me–SAC (Pc), Me = Co, Fe, Ni) for CO$_2$RR, synthesized by the pyrolysis of the encapsulating cyano-substituted metal phthalocyanines (MePc-CN) in Zeolitic imidazolate frameworks (ZIFs). Me–N/C could enable metal loading up to approximately 2.2 wt% without aggregation. The sequence of the Me–SAC (Pc) current densities under certain potentials in the H-cell is Co–SAC (Pc) > Fe–SAC (Pc) > Ni–SAC (Pc). In the gas-diffusion electrode (GDE) setups, Ni–SAC (Pc) operated steadily from $-10$ up to $-200$ mA cm$^{-2}$ with a FE$_{\text{CO}}$ of over 96.0%, while Fe–SAC (Pc) only exhibited 50.1% of FE$_{\text{CO}}$ at $-100$ mA cm$^{-2}$. The results suggested the promising potential of Ni–SAC (Pc) for use in practical electrochemical CO$_2$RR devices.

In addition to metal phthalocyanines, some other molecular complexes, such as metal porphyrins, also have a defined M–N$_4$
structure. Kim et al. reported carbon substrate supported Ni metal complexes with two different porphyrins ligands, tetraphenylporphyrin (N4–TPP) and 21-oxtetraphenylporphyrin (N4O–TPP). Spectroscopic and computational studies of Ni–N4–TPP and Ni(–Cl)–N4O–TPP revealed that the destruction of the ligand field symmetry could increase the redox potential from 0 to +1, leading to a better performance in the CO2RR. The additional ligand for the central atoms could also be a modification strategy to regulate the interfacial electronic structure from the axial direction. Wang et al. immobilized tetraphenylporphyrin cobalt (PCo) on graphene by π–π interactions only. They discovered that diphenyl sulfide (Di-S) could act as an axial ligand to the Co single atom sites. Di-S enhanced the electron transfer between the interface of graphene and Co complexes by parallel stacking geometry, leading to better generation of [PCo]− as active sites for CO2RR.

Compared with the traditional synthesis of SACs, using metal complexes such as metal phthalocyanines and metal porphyrins as precursors shows several advantages. First, metal complexes can be anchored by π–π stacking without pyrolysis. Second, the M–N4 structure in the metal complexes can be anchored onto the substrate intact to form SACs with clear active sites. Third, the steric hindrance of the phthalocyanine and porphyrin ring are large enough to alleviate the aggregation of the single atoms. Overall, the interface design of the single metal complexes offers a novel method for the construction of SACs and a bridge to connect molecular homogenous catalysts with heterogenous catalysts directly.

2.4 Design of multi-atom site catalysts

Although SACs exhibit a great performance in the CO2RR, most of them catalyze reactions that only involve single molecules. On traditional SACs, the single metal atoms are dispersed on substrates in isolation with no interaction between each other. When the neighboring single atom is close enough, there is a chance that C–C coupling reactions will be enabled, leading to C2+ products. Guan et al. reported electrochemical CO2 reduction to C2H4 on single-atom Cu catalysts supported on nitrogen-doped carbon.95 When the Cu concentration was below approximately 2.4%mol, the Cu–N4 species were isolated, leading to the C2H4 products of CH4. When the Cu concentration reached approximately 4.9%mol, the adjacent Cu–N4 species were close enough to enable a synergistic effect between the neighboring Cu single atoms and resulted in the dimerization of the *CO intermediates. If the distance between the single-atom site continues to reduce, the extreme condition of it will result in multi-atoms site catalysts. Several multi-atoms site catalysts have been reported in recent research, in which the active sites were constructed by two or more metal atoms instead of only one metal atom in the SACs. The multiple atoms offer additional sites for CO2 adsorption, involving additional CO2 in a single reaction process, and leading to the production of C2+ products. Jiao et al. reported a Cu atom-pair catalyst (Cu–APC) on Pd10Te3 nanowires for the CO2 electrochemical reduction to CO.96 By combining the EXAFS and DFT calculations, they revealed that in Cu4, which is the smallest stable configuration, Cu1+ was formed via a single Cu atom binding with an O atom, then a Cu1+–Cu1+ atom pair was constructed as an active site by Cu1+ together with an adjacent Cu atom (Fig. 7b). Further calculations indicated that the Cu1+–Cu1+ sites catalytic mechanism is a ‘bimolecular activating bimolecular’ mechanism. At −0.78 V_RHE, Cu–APC with a 0.10% Cu loading exhibited a FECO of 92%, with only a corresponding FEH2 of 3%. The theoretical calculation also confirmed that diatomic sites catalysts promote the formation of C2+ products. Zhao et al. investigated whether the porous C2N layer supported a series of transition metal dimers catalysts (Cu2@C2N) for CO2RR using DFT calculations.97 The results showed a maximum positive free energy change of 0.76 eV in the formation of the COCO* species, indicating that Cu2@C2N is preferred to C2H4 in the CO2RR.

In addition, multi-atoms sites can be constructed using different transmission metal atoms. Zhu et al. reported neighboring Zn/Co monomers dispersed on N doped carbon (ZnCoNC) for electrochemical CO2 reduction to CO.27 The indirect electron interaction of the neighboring Zn/Co through the N atoms was confirmed using XANES and EXAFS analysis (Fig. 7c–f). In situ attenuated total reflection-infrared spectroscopy (ATR-IR) and DFT calculations suggested that the electronic effect of the neighboring Zn/Co reduced the *COOH formation energy barrier, leading to easier CO production. ZnCoNC exhibited a FECO of 93.2% at −0.5 V_RHE in a 30 h test. Ren et al. synthesized a diatomic Ni–Fe sites catalyst supported by nitrogenated carbon (Ni/Fe–N–C) via an ion-exchange strategy.98 The obvious metal–metal peak for Ni–Fe coordination was observed at 2.06 Å in FT EXAFS spectra. Compared with Ni–N–C and Fe–N–C synthesized using similar methods, Ni/Fe–N–C exhibited a higher faradaic efficiency of CO, a higher current density of CO, and a higher TOF. Moreover, the Ni/Fe–N–C reached a maximum FECO of 98% at −0.7 V_RHE and maintained a FECO of 99% after 30 h of continuous electrolysis, suggesting its outstanding catalytic performance and durability. DFT calculations revealed the diatomic Ni–Fe sites of Ni/Fe–N–C provided an additional active site for the second CO2 activation. Compared with bare Ni/Fe–N–C, Ni/Fe–N–C has a weaker binding strength for COOH* and CO*, leading to a lower energy barrier for CO production.

Apart from dual-atom site catalysts with metal–metal bonds, there are some dual-atom site catalysts which are composed of two types of single-atomic sites with two different metal centers. Xie et al. reported hierarchical integrated electrodes supported NiSn atomic pair catalysts (NiSnAPC).99 XAFS and XPS analysis suggested that NiSnAPC contains a separately dispersed Ni-N4 and Sn–N4 configuration and the Ni–Sn bond was not observed. However, the isolated Ni–N4 and Sn–N4 configuration could allow them to modify each other’s electronic structure. Compared with Sn-SAC, NiSn-APC exhibited a TOF of 4752 h−1, and revealed a better activity and selectivity for CO2RR compared to formate. Lin et al. synthesized a CoPc and Zn–N–C CoPc@Zn–N–C tandem catalyst for the CO2RR to form CH4.100 CoPc@Zn–N–C showed a CH4/CO production rate that was over 100 times greater than that of the CoPc or Zn–N–C catalysts. Electrochemical experiments and DFT calculations revealed the two-step tandem mechanism. CO2 was first reduced to CO on
CoPc, then diffused onto Zn–N–C and converted to CH4. CoPc contributed to the reservoir of adsorbed *H on ZnNₓ, which is critical to the high CH₄ production rate.

A change in the number of central atoms in multi-atoms site catalysts may also influence the selectivity of C₁ products. He et al. investigated the activity and selectivity of a series of multi-Fe atoms (Feₙ, n = 1–4) doped graphdiyne catalysts for CO₂ electrochemical reduction using ab initio studies. Theoretical calculations revealed Fe₂ and Fe₃ exhibited a better performance in CO₂-to-CH₄, CO₂-to-HCOOH, respectively. Multi-atoms site catalysts may catalyze the synthesis of CO₂⁺ products via multiple metal active sites. From the perspective of SACs, introducing novel metal atoms in single-atom sites also offers a novel strategy to regulate the electronic structure of the active sites.

2.5 Strategies to improve SAC performance

All of the aforementioned approaches have focused on improving the intrinsic nature of a single-atom site. Moreover, improving the accessibility of single-atom sites and increasing the density of single-atom sites are also promising strategies. Owing to the different synthesis strategies, there may be part of the single-atom sites that were embedded in substrates in some SACs, leading to significant loss of catalytic activities. Ye et al. compared the electrocatalytic performances of C-AFC©ZIF-8 and C-AFC@ZIF-8. The precursor AFC©ZIF-8 was prepared by immersing ZIF-8 in ammonium ferric citrate (AFC) aqueous solution for 24 h, AFC@ZIF-8 was obtained by sealing AFC in ZIF-8. X-ray photoelectron spectroscopy (XPS) confirmed C-AFC©ZIF-8 had more Fe–N active sites on the surface than C-AFC@ZIF-8, leading to its better performance in the CO₂RR. Further experiments confirmed the activities of the catalysts towards the CO₂RR exhibited a positive correlation with the content of the exposed Fe–N active sites. Therefore, increasing the quantity of single-atom sites on the surface is viewed as an efficient way to improve the catalytic performance of SACs.

Two dimensional materials such as nanofibers constructed by one-dimension carbon materials are good choices for substrates because of their high surface areas, which can provide more space to support and anchor metal single-atom sites. Yang et al. reported a strategy for large-scale synthesis of a single Cu atoms catalyst supported on through-hole carbon nanofibers (CuSAs/TCNFs) for electrochemical CO₂-to-CO reduction. Cu/ZIF-8 nanoparticles were first synthesized using the double-solvent method, and were then attached to polycrylonitrile (PAN) nanofibers via the electro-spinning method (Fig. 8a). The through-hole structure offered large surface areas and improved the accessibility for Cu atom sites. At −0.9 Vₜₛₑₑₑ, CuSAs/TCNFs exhibited a maximum FEₘₒᵢₒᵢ of 44%, and CO (56%) was obtained in the gas-phase. Later, Yang et al. synthesized cobalt single atoms (CoSA) supported by freestanding carbon nanofibers (HCNFs) via a similar strategy (Fig. 8b). The CoSA/HCNFs reached an extremely high current density of 211 mA cm⁻² with a 92% FE in the flow cell. MOFs with a well-defined spatial structure that can form porous carbon nanoframes through one-step pyrolysis are also viewed as a facile choice. Chen et al. reported SACs with Fe–Nₓ active sites supported on mesoporous carbon nanoframes synthesized...
The electrochemical CO$_2$RR provides a novel way to convert electricity, which can be generated from renewable energy, to chemical energy in the forms of CO, CH$_4$, and even more complicated hydrocarbon fuels. As a bridge between homogeneous catalysts and heterogeneous catalysts, SACs feature single-atom sites similar to molecular catalysts with great uniformity and unique geometric and electronic structures, resulting in their outstanding performances in the CO$_2$RR.

In order to design high-performance SACs accurately, the necessity for the atomic-level regulation of SACs must be recognized. In this perspective article, the importance of the regulation of SACs at the atomic level is stressed from several aspects. The design of SACs can be divided into the regulation of SAC structures to improve the catalytic activities and selectivity. Enhancing the intrinsic nature of each single-atom site and increasing the density of the single-atom sites are the two main strategies used to improve SAC catalytic performance. The choice of the metal center and the regulation of the coordination environment are vital for the structural and electronic properties of SACs. Recently, dual- and multiple-atom sites have drawn significant attention owing to their great performance in the CO$_2$RR, especially C$_2$+ products, and they are also important in SACs for achieving highly efficient CO$_2$RR performance. Agglomeration is a huge unavoidable hinderance to increasing the density of single-atom sites. The fine regulation of single-atom sites from both geometric and electronic angles can relieve aggregation through interactions between metal atoms and substrates. Synthetic methods also influence the performance of SACs via determining the accessibility of single-atom sites.

Although the development of SACs holds promise, there are still multiple challenges that must be noted:

1. Although a large number of SACs have shown good performance for the CO$_2$RR, there is still the large potential for the improvement of the activity and selectivity, especially for C$_2$+ products and liquid hydrocarbon fuels, which are more valuable for industrial use. Although most SACs for the CO$_2$RR catalyze CO$_2$-to-CO conversion, more effort should be made to explore C-C coupling on SACs. Also, the HER, as a common side reaction to the CO$_2$RR, should receive more attention. With appropriate regulation, the HER could work alongside the CO$_2$RR to produce syngas.

2. Although single-atom sites have great uniformity, their actual condition still remains ambiguous. An understanding of the reaction mechanism and active sites, which depends on further developments in characterization methods and the assistance of theoretical computation, is vital to the regulation of SACs at the atomic level. Advanced characterization techniques, such as operando characterization, are urgently needed, which can reveal the actual active sites during the catalysis reaction, thus contributing to our understanding of the mechanism, enabling the final regulation of SACs. Theoretical computation is built on known mechanisms and ideal reaction conditions; accordingly, there are differences between the results of theoretical computations and laboratory experiments. The process used to diminish the differences also offers better understanding of the reaction mechanism.

3. It should be emphasized that there is still a long way to go for SACs to move from laboratory tests into industrial production. The scaling up of synthesis and complicated reaction conditions are the main hindrances to the practical application of SACs. Recently, several mass production methods for SACs have been reported; facile strategies or commercial reactors were used to meet industrial-scale synthesis demand. However, there is a large discrepancy between the applications of SACs in half-cells and full-cells, which may be caused by transport loss and ohmic loss. In addition, SACs have to overcome the reaction conditions, which are much more unstable and impure in full-cell and industrial applications, owing to low-cost requirements.
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Notes and references

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