



AI agents as co-designers of catalysts: a paradigm shift for designing Cu-based single-atom alloy catalysts in CO₂ electroreduction

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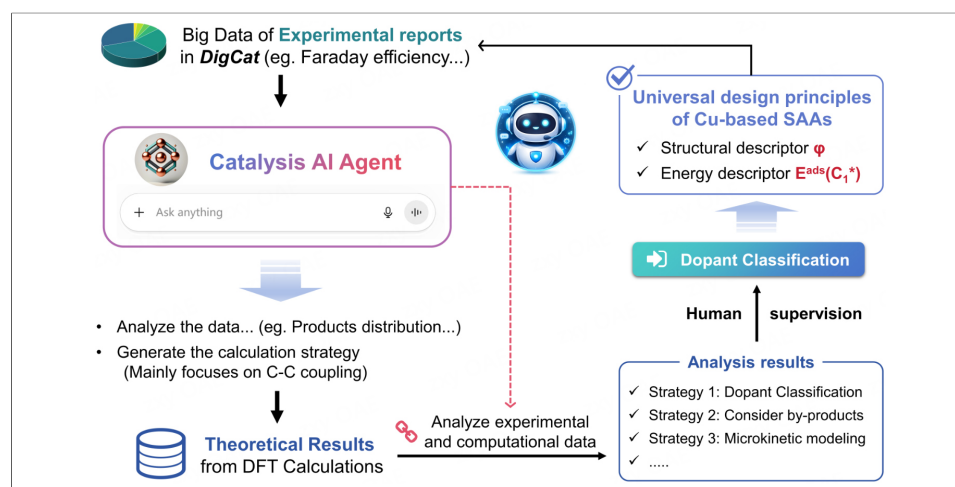
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The electrochemical CO₂ reduction reaction (CO₂RR) offers a promising route toward carbon neutrality and the sustainable production of value-added chemicals. Copper is the only metal that intrinsically produces multi-carbon (C₂₊) products, yet its catalyst design is hindered by complex C–C coupling mechanisms and sluggish kinetics^[1,2]. Recently, a team led by Prof. Daojian Cheng, Prof. Haoxiang Xu, and Prof. Hao Li reported an artificial intelligence (AI)-agent-guided catalyst design framework that integrates large-scale experimental and theoretical datasets with large language model (LLM) training to construct a Catalysis AI Agent [Figure 1]^[3]. This agent establishes universal design principles for C₂₊ production in Cu-based single-atom alloys (SAAs), demonstrating the capability of AI in research planning, mechanistic generalization, and materials screening.

A key contribution of this work lies in the AI agent's front-end guidance of the research workflow. By statistically analyzing the DigCat database^[4], the agent identified that C₂₊ selectivity is governed by the divergence between ethylene and ethanol pathways, thereby directing theoretical efforts toward the rate-determining C–C coupling step and reducing redundant calculations. Moreover, the agent



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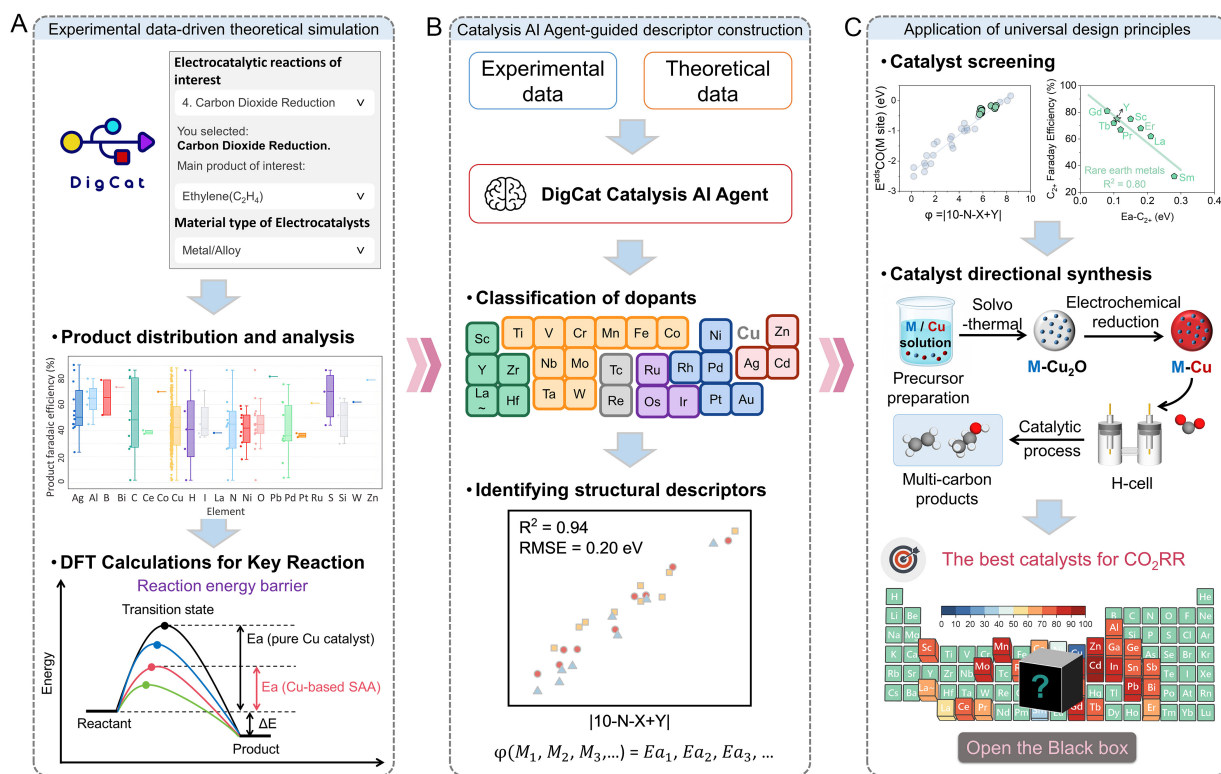
Intelligent design workflow for discovering Cu-based SAAs for CO₂RR toward multi-carbon products

Figure 1. Intelligent design workflow for discovering Cu-based SAA electrocatalysts for CO₂RR toward multi-carbon products. (A) Experimental data-driven theoretical simulations; (B) Catalysis AI Agent-aided descriptor construction; (C) Application of universal design principles. Reprinted with permission from [3]. Follow CC BY 4.0 protocol. SSA: Single-atom alloy; SAAs: single-atom alloys; AI: artificial intelligence; CO₂RR: CO₂ reduction reaction; DFT: density functional theory; R²: coefficient of determination; RMSE: root mean square error.

exhibited a degree of “chemical intuition”. When the correlation between calculated C–C coupling barriers and experimental selectivity was weak, it proposed classifying dopants based on their chemical nature as a prerequisite for establishing meaningful structure–performance relationships. This insight led to the development of an adsorption-energy-difference descriptor that partitions SAAs into five categories with clear linear trends. Importantly, the study also demonstrates the transferability of the AI-agent-assisted design principles. These principles not only rationalize existing experimental observations but also predict new high-selectivity SAAs and dual-single-atom alloys (DSAAs), and can be extended to rare-earth and alkali-metal dopants. These results suggest that the AI agent is capable not only of “summarizing existing rules” but also - to a certain degree - of extrapolative reasoning, which is a critical step toward autonomous catalyst design^[5,6].

The study also highlights current limitations of AI agents. Their cognition is restricted by data coverage and quality, and they primarily perform correlation discovery and route planning rather than autonomous scientific reasoning, thus still requiring human verification for physical validity. In this sense, the agent provides the “what” (e.g., the need to classify dopants), whereas human researchers elucidate the “why” (e.g., the distinct adsorption energetics and coupling pathways). The present framework focuses on the C–C coupling step and treats interfacial electric fields and solvent effects in a simplified manner, which constrains predictive accuracy under realistic conditions. Under such conditions, interfacial chemistry (such as hydrogen-bonding networks, local pH, and polarized electric double layers) is crucial, as it can markedly

influence the kinetics and mass transport of key steps, including proton-coupled electron transfer. Therefore, incorporating explicit electrochemical interface models into AI-assisted frameworks is a critical step toward achieving predictive accuracy under operando conditions. Beyond intrinsic active sites, CO₂ reduction is also influenced by electrode structure and reactor construction. Integrating AI-guided descriptors with multiscale and device-level design can help translate atomic-scale insights into scalable electrode fabrication strategies. Moreover, an unguided AI agent may overinterpret its findings. In addition to highlighting dopant classification, the agent also suggested multiple possible influencing factors, including electrochemical simulation methodologies, microkinetic analyses, and competing side reactions. This further illustrates that the AI agent operates strictly within the conceptual framework defined by its human collaborators and is bounded by the data scope and predefined problem settings it is tasked to address.

Overall, this work not only establishes general structure-selectivity relationships for Cu-based SAAs but also introduces a new research paradigm in which AI becomes a co-designer of scientific strategy. Importantly, the AI-agent-guided catalyst design principles demonstrated here can be extended to a broader range of catalytic systems, including Cu-based catalysts with multi-metal or non-metal dopants, as well as reactions such as C–N coupling. This generality underscores the broad impact of AI agents as transferable tools for accelerating discovery across diverse catalytic systems. Future developments may couple AI with automated experimentation to form a self-driving closed loop, incorporate realistic electrochemical environments, enable multi-objective optimization, and employ active learning to explore vast compositional spaces such as high-entropy alloys. With the continued development of high-quality data infrastructures and automated experimentation, this “AI planning-theoretical validation-experimental closed loop” workflow is expected to shift catalyst discovery from empirical trial-and-error to an AI-accelerated, theory-guided paradigm.

DECLARATIONS

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Authors' contributions

The author contributed solely to the article.

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