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# Looping metal-support interaction in heterogeneous catalysts during redox reactions

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Metal-support interfaces fundamentally govern the catalytic performance of heterogeneous systems through complex interactions. Here, utilizing operando transmission electron microscopy, we uncover a looping metal-support interaction in NiFe-Fe<sub>3</sub>O<sub>4</sub> catalysts during the hydrogen oxidation reaction. At the NiFe-Fe<sub>3</sub>O<sub>4</sub> interfaces, lattice oxygens react with NiFe-activated H atoms, gradually sacrificing themselves and resulting in dynamically migrating interfaces. Meanwhile, reduced iron atoms migrate to the {111} surface of Fe<sub>3</sub>O<sub>4</sub> support and react with oxygen molecules. Consequently, the hydrogen oxidation reaction separates spatially on a single nanoparticle and is intrinsically coupled with the redox reaction of the Fe<sub>3</sub>O<sub>4</sub> support through the dynamic migration of metal-support interfaces. Our work provides previously unidentified mechanistic insight into metal-support interactions and underscores the transformative potential of operando methodologies for studying atomic-scale dynamics.

Heterogeneous catalysts play a pivotal role in a variety of chemical processes, spanning chemical synthesis, energy conversion, and environmental remediation<sup>1-5</sup>. In metal-oxide support systems, oxide serves multiple critical functions: stabilizing metal particles under extreme conditions and modulating catalytic behaviors through metal-support interactions (MSIs)<sup>6-9</sup>. These interactions, primarily governed by the metal-metal or metal-oxygen interactions at the interface<sup>10</sup>, can result in complex phenomena such as electronic metal-support interaction (EMSI), strong metal-support interaction (SMSI), and reactive metal-support interaction (RMSI)<sup>11-14</sup>. Such MSIs profoundly influence catalytic performance, directly impacting critical parameters like reaction activity, selectivity, and stability across diverse reactions, including hydrocarbon dehydrogenation, Fischer-Tropsch synthesis, catalytic oxidation, gas/liquid phase reforming, and selective hydrogenation<sup>15-18</sup>. Therefore, understanding interfacial structures and gaining precise control over MSIs has become an important perspective for optimizing catalytic performances<sup>19,20</sup>.

Recent advancements in environmental transmission electron microscopy (ETEM) technologies enable real-time observation of catalyst structural evolutions during reactions, providing atomic-scale insights into reaction mechanisms <sup>18,21,22</sup>. These studies have revealed the highly dynamic nature of catalyst structures, which are significantly influenced by the surrounding chemical environment <sup>11,23–26</sup>. In-situ ETEM investigations of Pt-TiO<sub>2</sub> systems have revealed remarkable gasinduced oscillations at the metal-support interface, including dramatic structural collapses and reconstructions under redox conditions <sup>21,27</sup>. These transformations are believed to originate from the cyclic generation and refilling of oxygen vacancies. However, despite these results, the fundamental dynamics of MSIs and how their interfacial structure governs catalytic reactions remain poorly understood across many important catalytic systems.

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In this work, we investigate the reaction dynamics of the NiFe-Fe<sub>3</sub>O<sub>4</sub> catalyst during hydrogen oxidation  $(H_2 + O_2 \rightarrow H_2O)^{24,27}$  using the ETEM technique and uncover a novel looping metal-support interaction (LMSI). Yielding only water as the product in gas-phase reactions. the hydrogen oxidation reaction serves as a critical model system for investigating fundamental processes such as adsorption and surface reactions on heterogeneous catalysts<sup>28-30</sup>. Moreover, the coexistence of hydrogen and oxygen simulates redox environments relevant to various catalytic reactions, including CO2 hydrogenation, CO oxidation, methane combustion, and the water-gas shift reaction, particularly for transition metal catalysts like Ni and Fe, which are readily oxidized and reduced under redox conditions<sup>31-34</sup>. To construct the active interface, we reduce NiFe<sub>2</sub>O<sub>4</sub> (NFO) with hydrogen, thereby forming a NiFe-Fe<sub>3</sub>O<sub>4</sub> structure that enables us to probe the role of Ni in the redox behavior of Fe, as well as to investigate the metal-support interaction under redox conditions.

By controlling the redox environment through gas composition and temperature, we directly visualize reaction-induced solid-solid interfacial migration under reaction conditions and reveal the following mechanism: hydrogen spillover on NiFe nanoparticles provides  $H^{\dagger}$  to the NiFe-Fe<sub>3</sub>O<sub>4</sub> interface, triggering the reduction of Fe<sub>3</sub>O<sub>4</sub>. Reduced Fe<sup>0</sup> adatoms then migrate substantial distances to the edge sites of Fe<sub>3</sub>O<sub>4</sub> {111} planes, where they facilitate oxygen molecule activation. In this process, the redox of iron is coupled with hydrogen oxidation under the catalytic effect of the NiFe nanoparticle. Through quantitative analyses and theoretical calculations, we establish a direct correlation between metal-support interfacial dynamics and catalytic activity. This work highlights the role of LMSI in enhancing catalytic performance and provides novel insights into the fundamental processes of heterogeneous catalysis.

#### Results

#### Looping metal-support interaction

As illustrated in Supplementary Fig. 1, we investigate the MSI of NiFe-Fe<sub>3</sub>O<sub>4</sub> catalysts using a gas-celled ETEM equipped with a quadrupole mass spectrometer (MS). The NiFe-Fe<sub>3</sub>O<sub>4</sub> catalyst is synthesized through the partial reduction of the NFO precursor (Supplementary Figs. 2 and 3). Following a reduction procedure in 10% H<sub>2</sub>/He at 400 °C. the NFO nanoparticles transform into a composition of NiFe and Fe<sub>3</sub>O<sub>4</sub> as confirmed by selected area electron diffraction (SAED) analysis in Supplementary Fig. 4. The structural characterization of the synthesized NiFe-Fe<sub>3</sub>O<sub>4</sub>, presented in Supplementary Fig. 5, reveals a classical SMSI state, with NiFe nanoparticles encapsulated by FeO<sub>x</sub> layers. Notably, these encapsulated layers exhibit remarkable instability in redox environments, completely retracting from the NiFe nanoparticles upon introduction of the reactant gas mixture (2% O<sub>2</sub>, 20% H<sub>2</sub>, and 78% He) into the gas cell (Supplementary Fig. 6). This gas-induced destabilization of the encapsulating layers is analogous to behaviors observed in other metal-reducible oxide support systems, where oxygen abstraction from the overlayer under redox conditions leads to dynamic metal-support interactions<sup>27,35-37</sup>.

When the reaction temperature exceeds  $500\,^{\circ}\text{C}$ , a distinctive catalytic dynamic behavior emerges, characterized by the coordinated migration of NiFe nanoparticles across the Fe<sub>3</sub>O<sub>4</sub> support, accompanied by the etching and reconstruction of the support material (Supplementary Movie 1). In contrast, in-situ experiments on pure Ni and Fe<sub>3</sub>O<sub>4</sub> catalysts during hydrogen oxidation reaction reveal no comparable dynamic behavior (Supplementary Fig. 7). This dynamic behavior is consistently observed across all NiFe nanoparticles in the NiFe-Fe<sub>3</sub>O<sub>4</sub> system, suggesting a significant synergetic interaction between the NiFe nanoparticles and the Fe<sub>3</sub>O<sub>4</sub> support, which dynamically responds to the redox reaction environment. We propose a looping metal-support interaction (LMSI) mechanism to describe this phenomenon. The LMSI is primarily driven by high-pressure, high-temperature conditions typical of work conditions, which simulate the

chemical potential of  $H_2$  and  $O_2$  required to promote the structural evolution of the catalysts. These reaction conditions, and the associated structural dynamics they provoke, highlight the critical importance of studying catalyst behavior under authentic operational conditions through real-time operando TEM observations.

#### Interface dynamics coupled with dual-site redox cycles

HRTEM sequence images captured at 700 °C depict the interface reactions associated with LMSI, as shown in Supplementary Movie 2 and Fig. 1a-f. The images reveal a preferential epitaxial relationship between NiFe nanoparticles and Fe<sub>3</sub>O<sub>4</sub> support during the dynamic process. Based on the FFT analysis in Fig. 1g and the simulated SAED pattern in Supplementary Fig. 8, the orientational relationship between the NiFe and Fe<sub>3</sub>O<sub>4</sub> particles is determined to be: NiFe  $(\bar{112})$  //  $Fe_3O_4$  (111) and NiFe [110] //  $Fe_3O_4$  [110]. This correlation is further validated by simulating the HRTEM image of the interface structure, which aligns closely with experimental results (Fig. 1h, Supplementary Figs. 9 and 10). Interestingly, the lattice spacing of NiFe ( $\bar{1}11$ ) is 0.20 nm, approximately 15% larger than that of Fe<sub>3</sub>O<sub>4</sub> ( $2\overline{2}4$ ) (0.17 nm). This lattice mismatch results in a 4.2° tilting of the NiFe ( $1\bar{1}2$ ) plane relative to the Fe<sub>3</sub>O<sub>4</sub> (111) plane, a configuration that minimizes interfacial strain<sup>38-40</sup>. Consequently, this tilting leads to the formation of lattice voids along the interface, as illustrated in the structural model presented in Supplementary Fig. 11.

The epitaxial NiFe-Fe<sub>3</sub>O<sub>4</sub> interface initially forms a ledge-andterrace configuration as denoted by the black dashed line in Fig. 1a. Subsequently, the interface migrates through lateral propagation of atomic ledge along the NiFe-Fe<sub>3</sub>O<sub>4</sub> interface (Fig. 1b-f). The interface migration process led to the layer-by-layer dissolution of the Fe<sub>3</sub>O<sub>4</sub> along the (111) plane, preserving the continuity of the interface structure. The dissolution resembles the Mars-van Krevelen mechanism, where activated hydrogen from NiFe spills over to the interface, facilitating the release of lattice oxygen and reduction of Fe<sub>3</sub>O<sub>4</sub><sup>41,42</sup>. During this process, surface Ni (Fe) atoms migrate to lattice voids placed at the interface, driving the migration of NiFe toward the Fe<sub>3</sub>O<sub>4</sub> side (Supplementary Fig. 12). Therefore, the vacancies generated by the exsolution of Fe and O from the Fe<sub>3</sub>O<sub>4</sub> support are promptly replenished by migrating NiFe atoms, resulting in a self-regulated dynamic interface that minimizes the accumulation of persistent defects. As surface atoms diffuse, the morphology of NiFe deforms with the propagation of NiFe-Fe<sub>3</sub>O<sub>4</sub> interface, as illustrated in Supplementary Fig. 13. Although Wulff construction predicts that NiFe nanoparticles would expose {111}, {100}, {311}, {110} surfaces<sup>43</sup>, surfacediffusion-induced dynamics result in varying proportions of surface terminations. The metal nanoparticle morphology, induced by interface dynamics, enables NiFe to continuously expose high-index active sites for hydrogen activation. Notably, as the NiFe particle adjusts to achieve lattice matching, its shape changes like a liquid droplet while maintaining its single-crystalline structure<sup>44</sup>.

With lattice oxygen released from Fe<sub>3</sub>O<sub>4</sub> at the interface, Fe<sup>2/3+</sup> ions are reduced to mobilizable adatoms that can migrate across the Fe<sub>3</sub>O<sub>4</sub> surface, capturing and activating oxygen gas molecules. The activation of oxygen gas takes place at the Fe<sub>3</sub>O<sub>4</sub> {111} facets, away from the NiFe-Fe<sub>3</sub>O<sub>4</sub> interface, as illustrated in Supplementary Movie 3. As shown in Fig. 1i, the Fe<sub>3</sub>O<sub>4</sub> predominantly exposes the atomically flat {111} facets. Upon reaction between reduced Fe adatoms and oxygen gas molecules, a monoatomic layer nucleates at the flat {111} plane of the Fe<sub>3</sub>O<sub>4</sub>, creating a step-terrace configuration, as marked by the red arrows in Fig. 1j. This newly formed atomic layer then grows laterally through step-flow growth with Fe and O adatoms attaching to the step edge (Fig. 1k-n). The Fe atoms, originating from the NiFe-Fe<sub>3</sub>O<sub>4</sub> interface and diffusing outward on the Fe<sub>3</sub>O<sub>4</sub> support, facilitate the dissociative adsorption of O<sub>2</sub> molecules<sup>23</sup>. The growth behavior ensures that the Fe<sub>3</sub>O<sub>4</sub> support continuously exposes {111} planes, lowering the system's energy. Overall, the LMSI of NiFe-Fe<sub>3</sub>O<sub>4</sub> catalysts

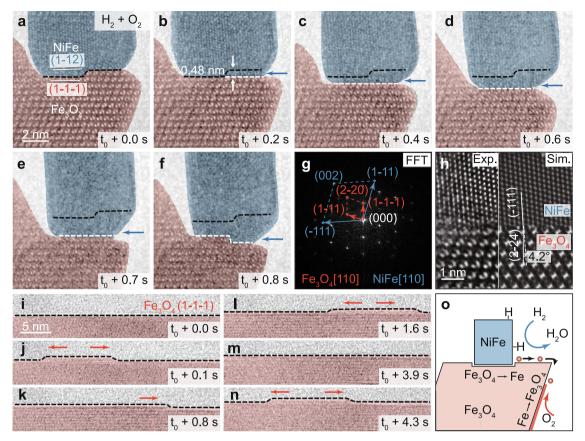


Fig. 1 | Atomic-resolution observation of the LMSI of NiFe-Fe $_3O_4$  catalyst. a–f Time-sequence HRTEM images of a NiFe-Fe $_3O_4$  nanoparticle under hydrogen oxidation reaction at 700 °C from Supplementary Movie 2, showing surface-diffusion-induced migration of the NiFe nanoparticle, along with the layer-by-layer reduction of Fe $_3O_4$ , g FFT pattern of a illustrating the epitaxial relationship between the NiFe and Fe $_3O_4$ , i.e., NiFe ( $1\bar{1}2$ ) // Fe $_3O_4$  ( $1\bar{1}\bar{1}$ ) and NiFe [110] // Fe $_3O_4$  [110]. h is an

enlarged image of a selected region in (a). In comparison, a simulated HRTEM image is also shown. i-n Observed layer-by-layer growth of Fe $_3O_4$  at the surface of Fe $_3O_4$  from Supplementary Movie 3. o Schematic image illustrates the relation between the LMSI effect and catalytic reactions. The reduction of Fe $_3O_4$  at the NiFe-Fe $_3O_4$  interface resulted in the migration of the interface. Additionally, the oxidation of Fe at the edge sites of the Fe $_3O_4$  {111} planes leads to the growth of Fe $_3O_4$ .

align with gas-solid reactions at separated sites, including the reduction of  $Fe_3O_4$  at NiFe- $Fe_3O_4$  interface and oxidation of Fe adatoms at  $Fe_3O_4$  {111} sites, as illustrated in Fig. 10. These two gas-solid reactions are synergistically facilitated by the migration of Fe adatoms.

TEM images (Supplementary Fig. 14) and the movie (Supplementary Movie 1) recorded at 700 °C reveal that the LMSI between NiFe and Fe $_3$ O $_4$  significantly contributes to its structural dynamics. The simultaneous reduction and oxidation of Fe $_3$ O $_4$  are governed by the chemical potential of the gas phase, which drives the system into a nonequilibrium dynamic state<sup>23,24,45,46</sup>. As shown in Supplementary Fig. 15, we investigate the NiFe-Fe $_3$ O $_4$  catalysts under varying H $_2$ /O $_2$  ratios and find that increasing the oxygen content suppresses redox dynamics, necessitating higher temperatures to initiate interface reduction and surface oxidation processes.

Time-sequence TEM images of a NiFe-Fe<sub>3</sub>O<sub>4</sub> system in Fig. 2a to h and Supplementary Movie 4 illustrate the synergistic effect between interfacial reduction and surface oxidation of Fe<sub>3</sub>O<sub>4</sub>. The phases of NiFe and Fe<sub>3</sub>O<sub>4</sub> are confirmed by the corresponding filtered inverse Fast Fourier Transform (iFFT) presented in Fig. 2i. To clearly illustrate interface migration and surface growth, the NiFe nanoparticle and growth Fe<sub>3</sub>O<sub>4</sub> layers are denoted by blue and red colors, respectively. It is evident that as the interface migrates, the Fe<sub>3</sub>O<sub>4</sub> support is etched, exposing a pathway, while simultaneously, Fe<sub>3</sub>O<sub>4</sub> layers grow at the {111} planes near the interface. In Fig. 2j, we track the trajectory of the NiFe nanoparticle, revealing its movement along the <112> direction of Fe<sub>3</sub>O<sub>4</sub>. This directional movement correlates with layer-by-layer

etching of the Fe $_3$ O $_4$  at {111} planes. Additionally, the etching process exposes new {111} planes of Fe $_3$ O $_4$  along the path of the NiFe nanoparticle. Upon reaching the boundary of the Fe $_3$ O $_4$ , the NiFe nanoparticle reorients and continues its movement in the specific direction (Fig. 2e–f, Supplementary Figs. 13 and 16). The directional migration of NiFe nanoparticles, along with the specific lattice growth of Fe $_3$ O $_4$ , ensures that the Fe $_3$ O $_4$  consistently exposes low-index {111} planes, thereby minimizing the total energy of the catalyst system<sup>47,48</sup>. We have recorded the movement of different nanoparticles (Supplementary Fig. 17), confirming the above-mentioned conclusions. We find that the reduction and oxidation processes are coupled, forming an integral part of the overall hydrogen oxidation reaction. Although reduction and oxidation occur at separate sites, the proportions of Fe $_3$ O $_4$  and NiFe remain steady, as evidenced by the measured projection area in Fig. 2k, further confirming the coupled iron redox process.

To further clarify the correlation between the LMSI and catalytic activity, we simultaneously measured the MS signals of oxygen and water in Fig. 3a. The results reveal the production of H<sub>2</sub>O and the consumption of O<sub>2</sub> at temperatures above 500 °C, suggesting that the hydrogen oxidation reaction occurs. In contrast, blank experiments using empty chips (Supplementary Fig. 18) show no variation in signal with temperature increases up to 900 °C, confirming that the detected water signal originates from catalytic H<sub>2</sub>-O<sub>2</sub> reaction. Additionally, sole Fe<sub>3</sub>O<sub>4</sub> nanoparticles exhibit no catalytic activity nor LMSI effect under the same conditions (Supplementary Figs. 7 and 19). In-situ SAED pattern recorded during the structural dynamics (Fig. 3b) and

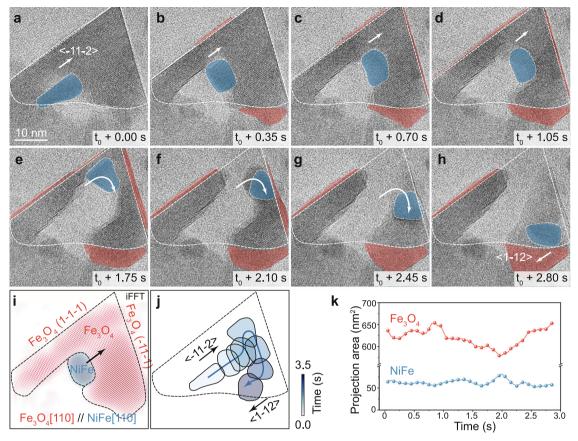


Fig. 2 | Dynamic LMSI in NiFe-Fe $_3O_4$  catalysts during hydrogen oxidation reaction. a–h Time-sequence HRTEM images of NiFe-Fe $_3O_4$  catalyst at 700 °C at an  $O_2/H_2$  ratio of 1/10 in Supplementary Movie 4. i Filtered inverse FFT of HRTEM image in **b** shows the correlated orientation between Fe $_3O_4$  and NiFe. **j** Trace of

motion path and morphology evolution of the NiFe nanoparticle in Supplementary Movie 4.  $\bf k$  Projection area of Fe $_3$ O $_4$  and NiFe in function of time from Supplementary Movie 4.

corresponding peaks analysis (Fig. 3c) suggest that the observed structural dynamics arise from phase transitions between NiFe and Fe<sub>3</sub>O<sub>4</sub>. We simultaneously record the structural evolution of the NiFe-Fe<sub>3</sub>O<sub>4</sub> catalyst during the above reaction process, as illustrated in Fig. 3d-h and Supplementary Movies 5–9. At the onset of the reaction at 500 °C, LMSI effects in the NiFe-Fe<sub>3</sub>O<sub>4</sub> nanoparticles are observed (Supplementary Figs. 20 and 21). As the temperature increases to 600 °C, water production rises significantly, accompanied by more pronounced LMSI effects of the nanoparticles (Supplementary Movie 7). The enhanced structural dynamics are also accompanied by an increase in NiFe particle size by both Ostwald ripening and coalescence process (Supplementary Fig. 22). However, the growth becomes limited as the temperature exceeds 700 °C, suggesting that particle sintering is constrained by dynamic interface interactions.

#### Mechanistic insights from quantification and computations

To quantify these dynamics, we have employed an optical flow method to quantitatively track the movement velocity of nanoparticles<sup>49</sup>. As shown in Fig. 3i–m, the velocity of particle movement increases notably from 400 °C to 600 °C, reflecting a consistent trend with catalytic activity. With the reaction temperature reaching 800 °C, both MS signals and the velocity of particle movement reach a steady state. In-situ SAED patterns are also recorded from 400 °C to 800 °C (heat rate: 1 °C/s) to illustrate the structural dynamics above 500 °C (Supplementary Movie 10). A diffraction-spot-detection method<sup>50</sup> is employed to track these dynamic diffraction spots (Supplementary Movie 11), revealing a noticeable reduction in their lifespan (Fig. 3n). Our statistics analysis of the average velocity magnitudes of the structural dynamics and the average lifespan of the dynamic

diffraction spots (Fig. 3o) further corroborates the close relationship between LMSI and catalytic activity.

We investigate the LMSI effect on the spatially decoupled hydrogen oxidation reaction in the NiFe-Fe<sub>3</sub>O<sub>4</sub> system through DFT calculations with Hubbard U correction, as shown in Fig. 4a. The computed Gibbs free energy diagram reveals an exceptionally low hydrogen dissociation barrier of 0.11 eV for the NiFe-Fe<sub>3</sub>O<sub>4</sub> system, which is significantly lower than the barriers observed for Fe<sub>3</sub>O<sub>4</sub> and Fe-Fe<sub>3</sub>O<sub>4</sub> systems (Supplementary Fig. 23). The activated hydrogen then spillover to the interface, promoting the reduction of the Fe<sub>3</sub>O<sub>4</sub> support, as discussed in detail by Prins, R<sup>51</sup>. NN-MD simulations further elucidate the interface reduction mechanism, demonstrating that NiFe preferentially attracts oxygen from the Fe<sub>3</sub>O<sub>4</sub> due to its stronger oxygen affinity compared to Fe-Fe<sub>3</sub>O<sub>4</sub> (Fig. 4b, c, and Supplementary Fig. 24-26). This phenomenon, termed the oxygen reverse spillover effect, facilitates the reduction of Fe<sub>3</sub>O<sub>4</sub> layers at the interface<sup>52</sup> (Supplementary Note 3). This observed tendency of oxygen attraction to NiFe aligns closely with our experimental findings from reduction and oxidation experiments on the NFO sample (Supplementary Notes 4 and 5). The attracted oxygen atoms on the NiFe surface are subsequently reduced by dissociated hydrogen atoms, forming water through a process that is substantially more efficient than on pure Fe, where hydrogen activation and water formation typically constitute rate-limiting steps (Supplementary Figs. 27–29).

Concurrently, the reduced Fe atoms migrate to the Fe $_3O_4$  {111} facets, where they undergo re-oxidization by oxygen. This migration proceeds significantly more rapidly on the surface than through the Fe $_3O_4$  bulk (Fig. 4d). Besides, the NiFe's superior H $_2$  dissociation activity enables hydrogen spillover across a broader region on the

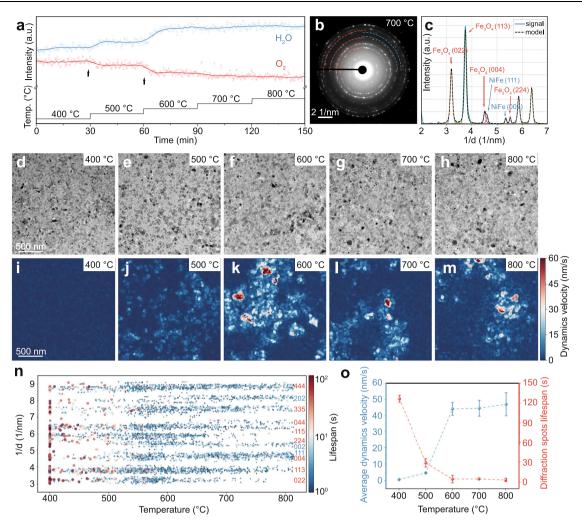
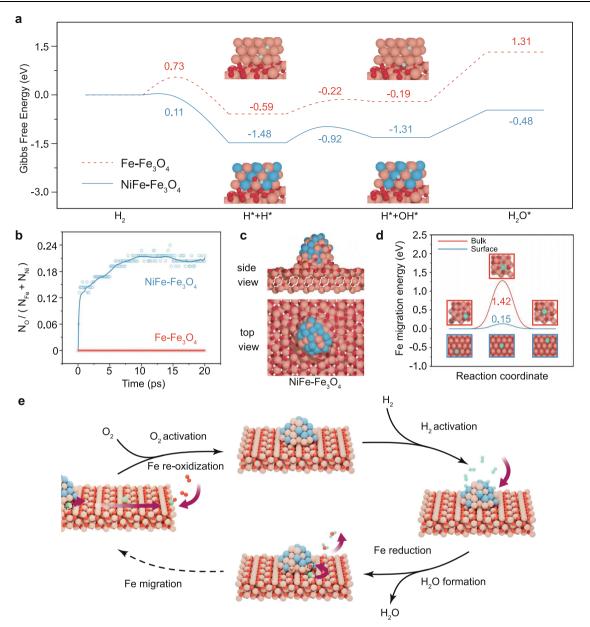


Fig. 3 | Correlation between the LMSI and catalytic activity of NiFe-Fe $_3$ O $_4$  catalyst in hydrogen oxidation reaction. a Operando MS data obtained post-TEM at temperatures from 400 °C to 800 °C. b, c SAED pattern and corresponding peaks analysis of the catalyst. d–h Representative TEM images of NiFe-Fe $_3$ O $_4$  nanoparticles at different temperatures captured from Supplementary Movie 5–9. i–m Dynamics velocity analyses with an optical flow method based on

Supplementary Movie 5–9.  $\bf n$  Lifespan from tracking diffraction spots of in-situ SAED (Supplementary Movies 10 and 11) pattern captured with heating under ambient conditions. The reciprocal spacing and lifespan of each dot are shown in the function of temperature.  $\bf o$  The average dynamics velocity (blue dots), and the lifespan of diffraction spots (red dots) across various temperature stages illustrate a close correlation between structural dynamics and catalytic activity.

NiFe-Fe<sub>3</sub>O<sub>4</sub> system, creating an extended hydrogen-rich environment. As a result, Fe atoms in the NiFe-Fe<sub>3</sub>O<sub>4</sub> system need to traverse a longer distance before re-oxidation compared to those in the Fe-Fe<sub>3</sub>O<sub>4</sub> system. This extended Fe diffusion pathway is fundamental to the spatially decoupled redox process characteristic of NiFe-Fe<sub>3</sub>O<sub>4</sub>, which distinguishes it from the more localized redox behavior seen in Fe-Fe<sub>3</sub>O<sub>4</sub>. The energy profile illustrating the dissociation pathway of molecular oxygen (O<sub>2</sub>) on an Fe adatom anchored to the Fe<sub>3</sub>O<sub>4</sub> surface (Supplementary Fig. 30) shows that the energy barrier is low, indicating that this step is not rate-limiting in the redox cycle. Figure 4e provides a comprehensive visualization of the correlation between LMSI and the hydrogen oxidation mechanism in NiFe-Fe<sub>3</sub>O<sub>4</sub>. The dynamic process is characterized by spatially decoupled hydrogen and oxygen activation (hydrogen activation occurs around NiFe, while oxygen activation takes place at distant Fe<sub>3</sub>O<sub>4</sub> {111} facets). This is accompanied by Fe<sub>3</sub>O<sub>4</sub> reduction, Fe atom migration, and subsequent re-oxidation. The low H<sub>2</sub> dissociation barrier on NiFe, combined with rapid surface diffusion of Fe atoms, facilitates efficient hydrogen spillover and swift Fe atom migration. These factors are crucial in enabling spatial separation that defines the unique LMSI phenomenon in the NiFe-Fe<sub>3</sub>O<sub>4</sub> system.

In summary, our comprehensive investigation using operando ETEM reveals a new type of metal-support interaction in the NiFe-Fe<sub>3</sub>O<sub>4</sub> catalyst system. The Fe<sup>2/3+</sup>/Fe<sup>0</sup> redox cycles demonstrate remarkable spatial segregation, activating hydrogen and oxygen at distinctly different locations. This mechanism drives two critical processes: reduction (etching) of Fe<sub>3</sub>O<sub>4</sub> at the NiFe-Fe<sub>3</sub>O<sub>4</sub> interface and promoting growth of Fe<sub>3</sub>O<sub>4</sub> layers along the {111} planes. The LMSI effect emerges from the inherent reducibility of the Fe<sub>3</sub>O<sub>4</sub> support, with interface migration precisely orchestrated by the movement of reduced iron species. NiFe nanoparticles play a role in prompting the spillover of hydrogen and accelerating the iron redox process. By elucidating the intricate interplay between catalyst components, we establish a fundamental correlation between the LMSI effect and catalytic performance. Beyond this specific case, we suggest a broader applicability of LMSI to heterogeneous catalytic systems containing transition metal-oxide support. The hydrogen spillover can occur on metallic nanoparticles, coupling with the redox circles of other types of transition metal-oxide support, consequently enhancing overall catalytic reactivity. By unveiling the sophisticated spatial and chemical dynamics at the catalyst interface, our research provides a transformative



**Fig. 4** | **Theoretical analysis of the atomic reaction pathway on the NiFe-Fe<sub>3</sub>O<sub>4</sub> catalyst. a** DFT calculated Gibbs free energy diagram for the hydrogen oxidation reaction on NiFe-Fe<sub>3</sub>O<sub>4</sub> (blue solid), and Fe-Fe<sub>3</sub>O<sub>4</sub> (red dashed). Insets show optimized structures of intermediate states. Cyan, pink, red, and pale turquoise balls display Ni, Fe, O, and H atoms, respectively. **b** Amount of accumulated oxygen atoms on NiFe and Fe nanoparticles from NN-MD simulations, showing that NiFe

facilitates the migration of lattice oxygen from the Fe $_3$ O $_4$  to the NiFe nanoparticle. c Side and top view of NiFe-Fe $_3$ O $_4$  after 20 ps NN-MD simulation. d Energy profile for activated Fe atom transfer on Fe $_3$ O $_4$ . e Schematics representation of the mechanisms underlying the LMSI effect in hydrogen oxidation on the NiFe-Fe $_3$ O $_4$  catalyst.

perspective on metal-support interactions, potentially guiding the design of highly efficient heterogeneous catalysts.

#### Methods

#### **Operando TEM setup**

The operando TEM experiments were conducted using a JEM-F200, a DENSsolutions Climate G+ gas supply system, and a quadrupole mass spectrometer (Supplementary Fig. 1). It has been shown that the purity of the gas composition significantly affects the state of nanoparticles, and optimizing the environment in ETEM can closely simulate actual working conditions. To prevent contamination of pipelines, we construct our gas supply system using stainless steel or poly(ether-ether-ketone)–silica, minimizing leakage and moisture adsorption. Gas filters tailored for different gas sources (including hydrogen, oxygen, and

helium) are also implemented to remove various impurities, such as oxygen, moisture, and hydrocarbon contaminants. Additionally, a complete workflow for operando experiments is proposed, including leakage testing and pipeline flushing, to ensure precise control of the microenvironment in the gas-cell nanoreactor.

After completing the preparation procedures, NFO samples are dispersed in ethanol with sonication, then drop-cast onto a micro-electromechanical system (MEMS)-based heating chip. This heating chip is sealed with another chip featuring a large electron-transparent Si<sub>3</sub>N<sub>4</sub> membrane for imaging, forming a nanoreactor capable of encapsulating gas at pressure up to 1 bar, allowing the investigation of structural evolution under working conditions. To enable atomic-scale observation of nanoparticle structural dynamics, a new type of chip featuring thinner membranes (30 nm) is employed. The nanoreactor is

then assembled into the TEM holder and inserted into the TEM chamber. The oxide nanoparticles are initially heated to  $400\,^{\circ}\text{C}$  in 10% O<sub>2</sub>/He to remove contamination. To create a hydrogen oxidation environment, a mixture of 2% O<sub>2</sub>/20% H<sub>2</sub>/He (4% O<sub>2</sub>/20% H<sub>2</sub>/He, and 10% O<sub>2</sub>/20% H<sub>2</sub>/He) is introduced into the nanoreactor, with mass spectrum data collected using the gas released from the nanoreactor. To minimize the influence of water produced during the reaction on structural evolution, we employ a high gas flow rate (0.2 mln/min) to efficiently remove water from the reaction zone.

#### Sample preparation

NiFe<sub>2</sub>O<sub>4</sub> nanoparticles ( $\geq$ 99.5%) used for operando TEM experiments were purchased from Alfa Aesar, and the TEM characterization results are shown in Supplementary Figs. 2 and 3. NiFe<sub>2</sub>O<sub>4</sub> has an inverse spinel structure similar to Fe<sub>3</sub>O<sub>4</sub>, with half of the trivalent ions (Fe<sup>3+</sup>) occupying tetrahedral sites, while divalent ions (Ni<sup>2+</sup>, Fe<sup>2+</sup>), and the remaining trivalent iron ions (Fe<sup>3+</sup>) occupy octahedral sites<sup>53</sup>. Upon heating in hydrogen, NiFe<sub>2</sub>O<sub>4</sub> is reduced to NiFe-Fe<sub>3</sub>O<sub>4</sub>, which can be used to catalyze the hydrogen oxidation reaction.

#### TEM characterization

TEM images and movie series are recorded by a Gatan Rio camera at a  $2048 \times 2048$  pixel resolution under an exposure time of  $0.05 \, \mathrm{s}$ . The elemental composition, as well as distribution, are studied on the microscope equipped with an energy-dispersive X-ray analyzer. Electron energy loss spectroscopy (EELS) is collected with a Gatan Imaging Filter (GIF) Quantum Model 1077 spectrometer.

#### Dynamic analysis based on the optical flow field

To quantitatively analyze the LMSI within the in-situ data, we compute the mean displacement vector to measure the extent of the changes between successive frames. The Farnebäck Dense Optical Flow algorithm<sup>49</sup> is utilized to establish the motion field for individual frames. Given our emphasis on the scale of change, the angles of the motion vectors are not considered in this investigation. Consequently, the magnitudes of these motion vectors are leveraged to assess the degree of motion (Fig. 3i–m). The magnitudes of the motion vectors of the NiFe catalysts exhibit similar trends of change as the catalytic activity (Fig. 3a).

#### **In-situ SAED spots tracking**

We apply automatic center identification on in-situ SAED data (Supplementary Movie 10) using the MS-Trans model<sup>54</sup>. The diffraction spots are detected utilizing a Laplacian of Gaussian blob detection algorithm (Supplementary Movie 11). The elliptical distortion is measured on the first frame using peak finding and an ellipse fitting algorithm as mentioned in ref. 50. The resulting fitted maximum and minimum semi-axes are 422.5 pixels and 421.5 pixels, respectively. The one-pixel discrepancy is likely due to the quantification effects. Therefore, elliptical distortion is neglected in the data processing stage. We monitor the diffraction spots, recording the time each spot appears and disappears to calculate its lifespan. In Fig. 3n, we plot the diffraction spots as a function of temperature (x-axis) and reciprocal spacing (y-axis). These spots are indexed to either the Fe<sub>3</sub>O<sub>4</sub> phase or the NiFe phase, with corresponding crystal planes labeled on the right side of Fig. 3n. The spots' different colors and sizes indicate their respective lifespans. As the nanoreactor is raised to reaction temperature, a noticeable decrease in the lifespan of diffraction spots highlights the reaction-related structure dynamics. We select the Fe<sub>3</sub>O<sub>4</sub> (113) diffraction spots to calculate the average lifespan and assess the structural dynamics of the NiFe-Fe<sub>3</sub>O<sub>4</sub> catalyst (Fig. 30).

#### **Density functional theory (DFT)**

The spin-polarized calculations with the projector-augmented wave (PAW) method are performed based Vienna Ab Initio Simulation

package (VASP 5.4.4)<sup>55</sup>. The exchange and correlation effects are described by the Perdew-Burke-Ernzerhof functional (PBE)<sup>55,56</sup>. The DFT + U method is used to accurately simulate electron strong correlation in the transition-metal oxide systems<sup>57</sup>. The Hubbard parameters (U) are introduced for the Fe 3d and Ni 3d electrons with the Ueff (= U - I) values of 3.80 eV and 5.77 eV according to previous theoretical work<sup>58,59</sup>. The optimization calculations are employed with a cutoff energy of 400 eV and an atomic force convergence of 0.02 eV/Å. To accurately characterize the magnetic properties of this system, we systematically reference the theoretical studies by Jiao and Wen et al. on Fe<sub>3</sub>O<sub>4</sub> to appropriately set the spin of octahedral and tetrahedral Fe<sup>60,61</sup>. Among the six possible terminations of the Fe<sub>3</sub>O<sub>4</sub> (111) surface, the Fe<sub>oct2</sub>-terminated surface is the most stable as hypothesized by STM experiments<sup>62</sup> as well as previous theoretical studies<sup>63</sup>. Therefore, we choose the Fe<sub>oct2</sub>-terminated surface as the model for our studies. For the (111)-Fe $_{oct2}$  model, a p (1 × 1) supercell slab model with 4 atomic-layer thickness is selected. In order to save computer time, 2 atomic layers at the bottom are fixed to simulate the bulk phase, and the top 2 atomic layers are allowed to relax. We apply Monkhorst-Packmesh k points of  $(3 \times 3 \times 1)$  for this surface. For NiFe-Fe<sub>3</sub>O<sub>4</sub> and Fe-Fe<sub>3</sub>O<sub>4</sub> models, we use a four-layer p  $(2 \times 2)$ model with a supported NiFe/Fe nanorod, referencing the modeling of interfaces in previous work by Chandler et al.64. Because of the relatively large cell size, the sampling of the Brillouin zone was restricted to the gamma point. To avoid the interaction between periodic layers, the vacuum layer thickness of both models is 15 Å.

The free energy for the intermediate is calculated as  $\Delta G = \Delta E + \Delta ZPE - T\Delta S$ , where  $\Delta E$  is the reaction energy change from DFT calculations,  $\Delta ZPE$  is the change of zero-point energies (ZPE), which is calculated with the vibrational frequencies of adsorbates and molecules, and  $\Delta S$  is the entropy change in the reaction. T is the reaction temperature. Furthermore, all barrier calculations are performed by using the climbing-image nudged elastic band method (NEB) and further improved by the dimer method<sup>65</sup>. The activation energy is calculated by ( $E_{TS} \cdot E_{IS}$ ), where  $E_{TS}$  is the energy of the transition state, and  $E_{IS}$  is the energy of the initial state.

## Molecular dynamics simulations based on neuron network potential

To provide information on LMSI over a larger time and spatial scale, we perform molecular dynamics simulations using a global stochastic surface walking neural network (NN) potential by a commercial software named LASP developed by Zhipan Liu group (LASP 3.4.5)<sup>66</sup>. We construct a NiFe/Fe nanoparticle of 1.5 nm × 1.5 nm (containing 82 atoms), supported by a 5 nm × 4 nm Fe<sub>3</sub>O<sub>4</sub> (111) substrate (containing 720 Fe atoms and 960 O atoms), to investigate the migration of oxygen in a large-scale model, in total 1762 atoms, through theoretical calculations. Molecular dynamics simulations with neural network potential (NN-MD) are performed at a constant temperature ( $T = 673 \, \text{K}$ ) within the NVT ensemble. We conduct a 20 ps simulation of the NiFe-Fe<sub>3</sub>O<sub>4</sub> system, which demonstrates that NiFe facilitates the migration of lattice oxygen from the Fe<sub>3</sub>O<sub>4</sub> to the NiFe nanoparticle. However, in our longer 1000 ps simulation of the Fe system, we observe no migration of lattice oxygen from the Fe<sub>3</sub>O<sub>4</sub> substrate to the Fe nanoparticle. In our model, the z-axis coordinates of the top-layer oxygen atoms of Fe<sub>3</sub>O<sub>4</sub> are approximately 19.5 Å. Considering the migration effect, we define oxygen atoms with z-axis coordinates greater than 20 Å as oxygen atoms on the nanoparticle, which is consistent with our observations from the MD frames.

#### Data availability

All data generated in this study are provided in the main text and the Supplementary Information. All data are available upon request from corresponding authors.

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#### **Author contributions**

Y.P. and D.S. designed the project. Y.P., X.L., and D.Z. performed the operando experiments. J.Z. helped with the sample preparation. Y.P., X.L., M.G., D.Z., and D.S. carried out the data analysis. S.Z. and L.Z. performed the theoretical calculations. Y.P., S.Z., L.Z., L.G., and D.S. cowrote the paper. D.S. supervised the project. All authors discussed the results and contributed to the paper.

#### **Competing interests**

The authors declare no competing interests.

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