

# Advances and challenges in understanding the electrocatalytic conversion of carbon dioxide to fuels

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**The electrocatalytic reduction of carbon dioxide is a promising approach for storing (excess) renewable electricity as chemical energy in fuels. Here, we review recent advances and challenges in the understanding of electrochemical CO<sub>2</sub> reduction. We discuss existing models for the initial activation of CO<sub>2</sub> on the electrocatalyst and their importance for understanding selectivity. Carbon-carbon bond formation is also a key mechanistic step in CO<sub>2</sub> electroreduction to high-density and high-value fuels. We show that both the initial CO<sub>2</sub> activation and C-C bond formation are influenced by an intricate interplay between surface structure (both on the nano- and on the mesoscale), electrolyte effects (pH, buffer strength, ion effects) and mass transport conditions. This complex interplay is currently still far from being completely understood. In addition, we discuss recent progress in in situ spectroscopic techniques and computational techniques for mechanistic work. Finally, we identify some challenges in furthering our understanding of these themes.**

With the growing importance and falling prices of renewable electricity, the issue of electricity storage to deal with the intermittent nature of renewable energy sources is becoming urgent. Storing renewable electricity in chemical bonds ('electrofuels') is particularly attractive, as it allows for high-energy-density storage and potentially high flexibility. While hydrogen is the most likely and realistic candidate for electricity storage in electrofuels, research on the electrochemical conversion of carbon dioxide and water into carbon-based fuels has intrigued electrochemists for decades, and is currently undergoing a notable renaissance<sup>1–4</sup>. In contrast to hydrogen production by water electrolysis, carbon dioxide electrolysis is still far from a mature technology. Significant hurdles regarding energy efficiency, reaction selectivity and overall conversion rate need to be overcome if electrochemical carbon dioxide reduction is to become a viable option for storing renewable electricity.

Many electrocatalysts have been reported for the production of different compounds from the electrocatalytic carbon dioxide reduction reaction (CO<sub>2</sub>RR). Table 1 gives an overview of some of the most active and selective metal or metal-derived electrocatalysts towards specific products in aqueous media. The two-electron transfer products, CO and HCOOH, can be produced with low overpotential and high Faradaic efficiency on suitable electrocatalysts, but substantially higher overpotentials and lower selectivities are observed for multi-electron transfer products such as methane, ethylene and alcohols<sup>5</sup>. For a recent discussion about the economic perspectives of CO<sub>2</sub>RR, the reader is referred to a previous analysis<sup>5</sup>.

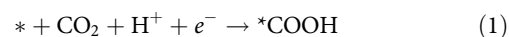
The aim of this Review is not to be exhaustive, but rather to selectively (and subjectively) discuss some recent advances and pertinent challenges in this field, focusing on themes that have recently

witnessed important progress<sup>2,3,6,7</sup>. An overview of some of the themes covered in this Review is shown in Fig. 1. We also discuss two important methodologies used to increase fundamental understanding of CO<sub>2</sub>RR: in situ spectroscopic techniques and computational techniques.

## Initial activation of CO<sub>2</sub>

The first step in the CO<sub>2</sub>RR is the activation of the CO<sub>2</sub> molecule. It is often claimed that activation and reduction of CO<sub>2</sub> is difficult because the first electron transfer to form the CO<sub>2</sub><sup>•−</sup> radical intermediate has a very negative redox potential (−1.9 V versus normal hydrogen electrode), or because CO<sub>2</sub> is a very stable molecule<sup>4</sup>. Neither statement is accurate. Electrocatalysts stabilize the CO<sub>2</sub><sup>•−</sup> radical or reaction intermediate by forming a chemical bond between CO<sub>2</sub> and catalyst, leading to a less negative redox potential. With the right electrocatalyst, it is possible to reduce CO<sub>2</sub> to CO or HCOOH at low overpotential. This low-overpotential reversible catalysis is related to the mechanism of a two-electron process, typically consisting of only one intermediate, which can be optimized using an appropriate catalyst<sup>8,9</sup>. Enzymes such as formate dehydrogenase and carbon monoxide dehydrogenase are indeed effective reversible catalysts for the CO<sub>2</sub>RR to formate and carbon monoxide, respectively, exhibiting negligible overpotentials<sup>10</sup>. In addition, the equilibrium potentials of CO<sub>2</sub>RR are close to 0 V (and sometimes higher), making the thermodynamic stability of CO<sub>2</sub> similar to that of water.

We consider four redox reactions related to the activation of CO<sub>2</sub> (equations (1)–(4)):



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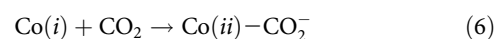
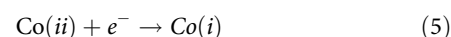
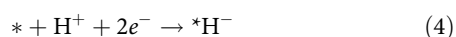
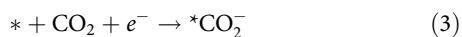
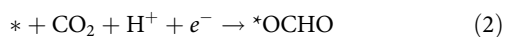
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**Table 1 | Highly selective/active metal and metal-derived electrocatalysts for synthesis of specific CO<sub>2</sub>RR products**

CO <sub>2</sub> RR product	Electrocatalyst	Faradaic efficiency (%)	$\eta$ (V) <sup>a</sup>	$j_{\text{total}}$ (mA cm <sup>-2</sup> )	Electrolyte (CO <sub>2</sub> saturated)	Ref.
HCOOH	Pb	97.4	-1.19 V	5.0	0.1 M KHCO <sub>3</sub> <sup>b</sup>	8
	Sn	88.4	-1.04 V	5.0	0.1 M KHCO <sub>3</sub> <sup>b</sup>	8
	Pd nanoparticles/C	99	-0.15 V	2.4-7.0	2.8 M KHCO <sub>3</sub> <sup>c</sup>	23
	Pd <sub>70</sub> Pt <sub>30</sub> nanoparticles/C	90	-0.36 V	4.0-7.5	0.2 M PO <sub>4</sub> <sup>3-</sup> buffer <sup>d</sup>	9
CO	Au	87.1	-0.64 V	5	0.1 M KHCO <sub>3</sub> <sup>b</sup>	8
	Au nanoparticles	97	-0.58 V	3.49 ± 0.61	0.1 M KHCO <sub>3</sub> <sup>b</sup>	173
	OD-Au nanoparticles	>96	-0.25 V	2-4	0.5 M NaHCO <sub>3</sub> <sup>e</sup>	103
	Ag	94	-0.99 V	~5	0.1 M KHCO <sub>3</sub> <sup>b</sup>	174
CH <sub>4</sub>	Cu poly	40.4	-1.34 V	~7	0.1 M KHCO <sub>3</sub> <sup>b</sup>	55
	Cu(210)	64	-1.29 V	5	0.1 M KHCO <sub>3</sub> <sup>b</sup>	33
C <sub>2</sub> H <sub>4</sub>	Cu poly	26.0	-1.13 V	1-2	0.1 M KHCO <sub>3</sub> <sup>b</sup>	55
	O <sub>2</sub> plasma-treated Cu	60	-0.98 V	-15	0.1 M KHCO <sub>3</sub> <sup>b</sup>	112
	Cu-halide	60.5-79.5	-2.11 V	46.1-39.2	3 M KBr <sup>f</sup>	83
	Graphite/carbon NPs/Cu/PTFE	70	-0.63 V	75-100	7 M KOH <sup>g</sup>	31
CH <sub>3</sub> OH	Cu <sub>2</sub> O	38	-0.43 V	1-2	0.5 M KHCO <sub>3</sub> <sup>h</sup>	121
	HCl-pretreated Mo	84	-0.33 V	0.12	0.2 M Na <sub>2</sub> SO <sub>4</sub> <sup>i</sup>	175
C <sub>2</sub> H <sub>5</sub> OH	Cu poly	9.8	-1.14 V	~0.6	0.1 M KHCO <sub>3</sub> <sup>b</sup>	55
	Cu <sub>2</sub> O	9-16	-1.08 V	30-35	0.1 M KHCO <sub>3</sub> <sup>b</sup>	123
	CuO nanoparticles	36.1	NA <sup>j</sup>	~11.7	0.2 M KI	124
	Cu/CNS	63	-1.29 V	2	0.1 M KHCO <sub>3</sub> <sup>b</sup>	176

<sup>a</sup> $\eta = E - E^0$  with  $E^0$  versus RHE, where  $\eta$  is overpotential,  $E$  is applied potential and  $E^0$  is standard electrode potential<sup>6</sup>. <sup>b</sup>pH ≈ 6.8. <sup>c</sup>pH ≈ 8.2. <sup>d</sup>pH ≈ 6.7. <sup>e</sup>pH ≈ 7.2. <sup>f</sup>pH ≈ 3. <sup>g</sup>pH > 14. <sup>h</sup>pH ≈ 7.6. <sup>i</sup>pH ≈ 4.2. <sup>j</sup>At E = -1.7 V versus saturated calomel electrode (pH not reported).  $j_{\text{total}}$ , total current density; NA, not available.

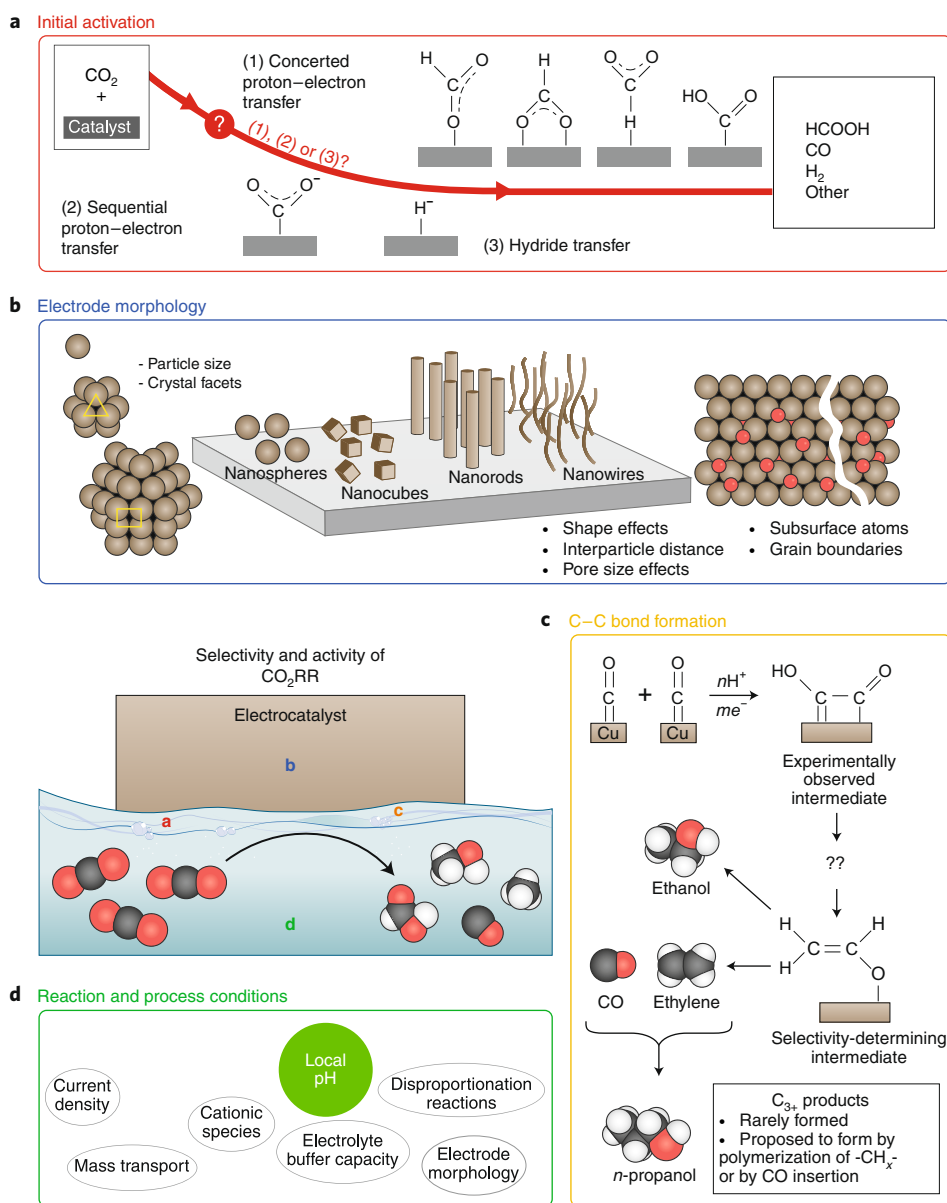


Equations (1) and (2) are so-called concerted proton–electron transfer (CPET) reactions and have been considered computationally for deriving trends in selectivity among (post-)transition metal surfaces<sup>11</sup>. The authors argued that \*COOH is the more likely first intermediate for CO formation, and \*OCHO the more likely intermediate for formic acid production (an assertion that is generally agreed on in the literature). Using calculated binding energies, they generally find good agreement between their predictions and experiment: post-transition metals such as Pb and Sn prefer to bind CO<sub>2</sub> via oxygen and are selective towards formic acid, whereas transition-metal electrodes prefer to bind via carbon. Interestingly, in two instances, their calculations deviate from the experimental observations in Table 1: silver is predicted to be an excellent catalyst for formic acid production, whereas palladium is predicted to have the lowest onset potential for CO production. They ascribe these differences to kinetic effects not included in their calculations.

Interestingly, in the molecular electrocatalysis community, the views on the initial activation of CO<sub>2</sub> appear to be subtly different. The initial binding of CO<sub>2</sub> to the catalyst does not involve a CPET step such as in equations (1) and (2), but rather an electron-transfer mediated CO<sub>2</sub> binding step, as indicated by equation (3). The CO<sub>2</sub><sup>-</sup> anionic adduct is generally bound to the metal centre of the catalyst. For instance, for a cobalt-(proto)porphyrin catalyst, CO<sub>2</sub> binding takes place if the cobalt centre changes oxidation state from Co(II) to Co(I), with the electronic density flowing back onto the \*CO<sub>2</sub> ligand, formally written as in equations (5) and (6).

Subsequent protonation or CPET steps generate \*COOH or \*COOH<sup>-</sup> intermediates<sup>12</sup>. If equation (3) is rate determining or potential determining, the pH dependence of CO<sub>2</sub> activation may differ from the pH dependence of the competing hydrogen evolution reaction (HER). This different pH dependence of the CO<sub>2</sub>RR and HER pathways was used to explain the strong pH dependence of the overall product selectivity on graphite-immobilized Co-protoporphyrin, with H<sub>2</sub> being the primary product at pH 1 but CO being the primary product at pH 3 (refs. 13,14). A similar mechanistic model was proposed for gold-catalysed CO<sub>2</sub>RR, suggesting that also on gold the \*CO<sub>2</sub><sup>-</sup> intermediate, and not \*COOH, is the relevant activated form of CO<sub>2</sub> (ref. 15). Recent computational work has confirmed that on Ag(111) \*CO<sub>2</sub> is highly sensitive to the presence of an electric field, as, for example, modelled by the presence of a cation<sup>16</sup>. Although the authors do not write the formation of \*CO<sub>2</sub> as an electron-transfer step, the resulting \*CO<sub>2</sub> is highly polarizable, and therefore sensitive to pH and cation effects (see ‘Reaction and process conditions’). Similar conclusions regarding the importance of a \*CO<sub>2</sub><sup>-</sup> intermediate in the CO<sub>2</sub>RR reduction to CO on a Ag(110) electrode have been drawn based on kinetic simulations of CO formation using a multiscale model<sup>17</sup>.

A similar situation exists for formate/formic acid production on molecular catalysts. Among metalloporphyrins, Rh, Sn and In porphyrins have a high selectivity towards formic acid in aqueous electrolyte<sup>18</sup>. Density functional theory (DFT) calculations suggest that the key intermediate is an anionic hydride<sup>19</sup>, formed through equation (4), as previously suggested in the molecular catalysis



**Fig. 1 | Overview of themes discussed in this review.** **a**, Initial activation of CO<sub>2</sub>, which can proceed via CPET, SPET or hydride-transfer mechanisms. **b**, Influence of the mesostructure of the electrode on the selectivity and activity of CO<sub>2</sub>RR. **c**, Recent views on C–C bond formation from CO<sub>2</sub>RR, specifically the formation of C<sub>2</sub>H<sub>4</sub> and C<sub>3+</sub> products. **d**, The important role of reaction and process conditions, such as local pH, on CO<sub>2</sub>RR activity and selectivity.

literature<sup>20,21</sup>. The anionic hydride performs a nucleophilic attack on the carbon atom of CO<sub>2</sub>, yielding HCOO<sup>-</sup>. Again, the reaction is triggered by a potential-induced change in the oxidation state of the catalyst, either of the metal centre or the ligand, with the hydride residing on the metal or the ligand (the latter is the most likely pathway for In and Sn porphyrins). The stability of the resulting species is crucial to the subsequent elementary step and the formation of either CO or HCOOH/HCOO<sup>-</sup>. Interestingly, such a (lattice-)hydride mechanism was recently proposed for nanostructured copper-hydride catalysts with a much enhanced selectivity for formic acid ('normal' copper yields primarily CO as a two-electron product)<sup>22</sup>. The importance of a hydride-mediated pathway has also been suggested for formate production on palladium electrodes, as well as in solution<sup>23,24</sup>.

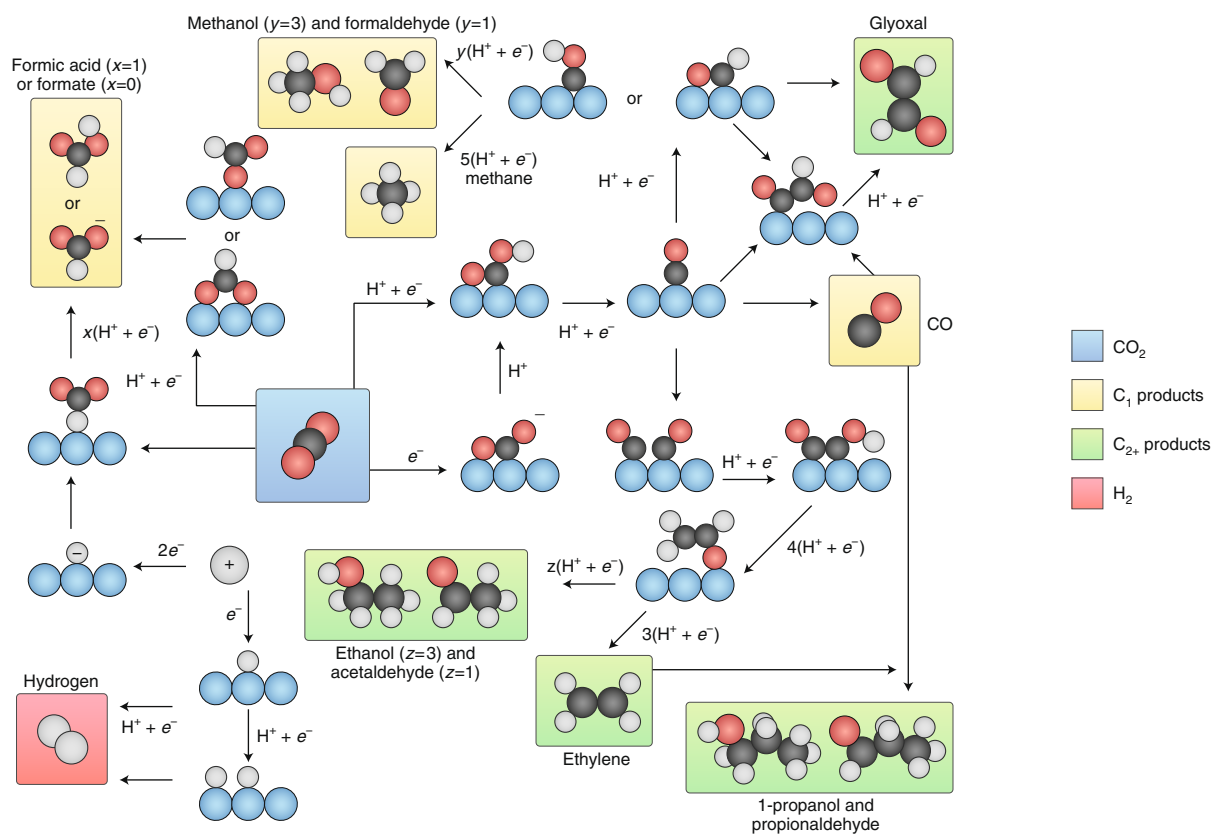
The relevance of considering equations (3) and (4) in the activation of CO<sub>2</sub> as opposed to equations (1) and (2), is that the intermediates involved are charged (or strongly polarizable) and hence

sensitive to pH and cation effects. A summary of the discussed activation routes for CO<sub>2</sub>RR is given in Fig. 2.

### Carbon–carbon bond formation

One of the most interesting observations in the CO<sub>2</sub>RR is the formation of species with one or more carbon–carbon bonds, mostly on copper-based electrodes. Apart from copper-based catalysts, a few others, for example, NiGa, PdAu, NiP and N-doped carbon catalysts, produce compounds with two or more carbon atoms, but not with the same efficiency as copper<sup>25–28</sup>. There have been some remarkable achievements recently in terms of improving selectivity to C<sub>2</sub> compounds by tuning copper structure (for example, using high-surface-area oxide-derived (OD) copper), by adjusting electrolyte composition and by employing organic films on copper<sup>29–32</sup>.

The interest in making more reduced (liquid) products from CO<sub>2</sub> lies in the fact that they have higher energy density and economic value<sup>5</sup>. Therefore, elucidating the pathway(s) from CO<sub>2</sub> or CO to



**Fig. 2 | Overview of reaction pathways for CO<sub>2</sub>RR towards different products.** Black spheres, carbon; red spheres, oxygen; white spheres, hydrogen; blue spheres, (metal) catalyst. The arrows indicate whether proton, electron or CPETs take place.

C<sub>2</sub> products, of which ethylene and ethanol are the most typical examples, has been the subject of several experimental<sup>33–38</sup> and theoretical<sup>39–43</sup> studies. Two separate pathways for ethylene production have been observed experimentally: a high-overpotential pathway involving a shared intermediate with the methane pathway taking place primarily on Cu(111), and a low-overpotential pathway taking place primarily on Cu(100) and which does not yield C<sub>1</sub> products<sup>36</sup>. The two pathways also differ in their pH dependence: the ‘Cu(111) pathway’ is pH dependent (on the normal hydrogen electrode potential scale), whereas the ‘Cu(100) C<sub>2</sub> pathway’ is not. As a result, the latter pathway is favoured over the former pathway, and over hydrogen evolution in alkaline media, making the selectivity of the CO<sub>2</sub> and CO reduction on copper highly sensitive to (local) pH. Several experimental<sup>34,37</sup> and theoretical<sup>39–41</sup> studies have suggested a CO dimer intermediate as the key species in this C<sub>2</sub> pathway. DFT calculations show that at more negative potentials, CO dimerization is disfavoured and that an alternative reaction pathway based on the coupling of \*CO and \*CHO has a lower activation energy<sup>41,44</sup>. Both experiments and DFT calculations suggest that the rate-determining step in C–C coupling involves a decoupled proton–electron transfer<sup>39</sup>, explaining its pH sensitivity. DFT calculations also show that the CO dimer is energetically favoured in the presence of a water layer, a local electric field and alkali cations, and that its formation energy is most favourable on Cu(100) (refs. <sup>40,42</sup>), in agreement with the experimental observation that it is a structure-sensitive and pH-sensitive reaction. Recently, evidence has been provided for a hydrogenated CO dimer intermediate (OCCOH) at low overpotentials in alkaline LiOH electrolyte during CO reduction using Fourier transform infrared spectroscopy, supported by DFT calculations<sup>45</sup>. Its formation was only observed on Cu(100) and not on Cu(111), in agreement with previous studies<sup>35,42</sup>. Interestingly,

ethylene formation is favoured in Cs<sup>+</sup>-containing electrolyte, both during CO<sub>2</sub> and CO reduction, although the alleged dimer intermediate was not observed in CsOH electrolyte, presumably because it is more reactive. Copper modified with certain organic layers also shows improved selectivity to C<sub>2</sub> products<sup>29,30</sup>. These effects are not fully understood yet but may be related to local pH effects. It is well known that ‘designing’ an electrolyte that allows for a high near-electrode pH during CO<sub>2</sub>RR, such as a low buffer strength electrolyte, leads to enhanced C<sub>2</sub> production<sup>46</sup>.

Besides ethylene, other C<sub>2</sub> products observed during CO<sub>2</sub> and CO reduction on copper are acetaldehyde and ethanol. It is normally assumed that these C<sub>2</sub> species are formed through common intermediates on Cu(100) up to a selectivity-determining intermediate, the hydrogenation of which leads to acetaldehyde and subsequently ethanol, and the hydrogenolysis of which leads to ethylene<sup>39</sup>. We have proposed that \*CH<sub>2</sub>CHO could be such an intermediate<sup>47,48</sup>. The structure sensitivity of the further reduction of this intermediate then determines the dominant C<sub>2</sub> product, ethylene or ethanol<sup>47–49</sup>. However, recent computational work suggested that the selectivity-determining intermediate is formed earlier in the mechanism<sup>44</sup>. An alternative pathway for ethanol formation was suggested, claiming that on CuZn or CuAg an insertion-type mechanism (CO reacting with Cu–CH<sub>2</sub> species) is operative<sup>50</sup>. We note that the CO dimerization mechanism can also explain why silver produces small amounts of ethanol (and no ethylene)<sup>47</sup>. Acetate is another frequently observed C<sub>2</sub> product. It has been proposed to form as a by-product in the reaction path towards ethylene via isomerization of a three-membered ring species adsorbed on the surface (\*OCH<sub>2</sub>COH) as well as through the coupling of different adsorbed intermediates<sup>51,52</sup>. However, acetate has been shown experimentally to form in solution as a result of a base-catalysed

disproportionation of acetaldehyde<sup>53</sup>. As far as we know, this is the only pathway that can explain why acetate can be formed also during CO reduction. An overview of reaction pathways towards C<sub>2+</sub> products is shown in Fig. 2, with the important caveat that it seems probable that several competing pathways are operative, in particular at large overpotentials.

The formation of higher-order (C<sub>3+</sub>) hydrocarbons has also been observed on copper, with a Faradaic efficiency of up to 20% on a suitable copper catalyst.<sup>54</sup> The main C<sub>3</sub> products are propanol and propionaldehyde, with small amounts of hydroxyacetone, acetone and allyl alcohol<sup>55</sup>. The elementary steps through which these C<sub>3</sub> products are formed have not been well studied yet. C–C coupling between CO and C<sub>2</sub>H<sub>4</sub> precursors has been reported to form *n*-propanol on agglomerates of OD copper nanocrystals<sup>56</sup>. For this reaction, defect sites were proposed to be the active sites. Moreover, polymerization of adsorbed carbon-based species has been proposed as a mechanism for the formation of higher-order hydrocarbons on bimetallic PdAu electrodes<sup>56</sup>. Although CO insertion-type reaction steps seem likely, there is still a lack of mechanistic work on the electrochemical formation of C<sub>3+</sub> hydrocarbons.

### Reaction and process conditions

The nature of the solvent (aqueous or non-aqueous), pH, the identity of ionic species, buffering strength and the exact mass-transport conditions all influence the activity and selectivity of CO<sub>2</sub>RR<sup>57</sup>. However, the interpretation of the individual effects remains poorly understood, and only recently systematic work was performed to elucidate and separate these effects. The importance of reaction and process conditions also implies the importance of proper standard protocols, as discussed recently<sup>58</sup>.

The CO<sub>2</sub>/HCO<sub>3</sub><sup>-</sup>, H<sub>2</sub>CO<sub>3</sub>/HCO<sub>3</sub><sup>-</sup> and HCO<sub>3</sub><sup>-</sup>/CO<sub>3</sub><sup>2-</sup> equilibria in water are sensitive to (bulk) pH, electrolyte composition and buffer capacity, which leads to different concentrations of carbonaceous species in solution (Fig. 3a)<sup>59</sup>. This has led to some controversy about the real active form of CO<sub>2</sub> during CO<sub>2</sub>RR. Most authors acknowledge now that dissolved CO<sub>2</sub> is the active species, though bicarbonate has also been suggested as the active species, especially towards formate<sup>60–62</sup>. Enhanced CO<sub>2</sub>RR activity in bicarbonate electrolyte, compared with other electrolytes under similar conditions, has been proposed to be associated with the formation of a bicarbonate–CO<sub>2</sub> complex. Such a complex is a primary carbon source during CO<sub>2</sub>RR, leading to an increase in CO<sub>2</sub> concentration in the vicinity of the electrode<sup>63</sup>. In situ Fourier transform infrared experiments using isotope labelling have confirmed this role of bicarbonate<sup>64</sup>. However, it was concluded that bicarbonate is not explicitly involved as an active species in the rate-limiting step of CO formation on gold, but rather that bicarbonate is a proton donor in a reaction step after the rate-limiting step<sup>65</sup>. The authors also conclude that the sluggish kinetics of the reaction converting bicarbonate into CO<sub>2</sub> must be considered. More generally, buffering anions in the electrolyte can donate a proton more effectively than water, or compared with other anions, which leads to an anion effect for the HER and formation of CH<sub>4</sub>, but not for CO<sub>2</sub>RR towards CO, HCOO<sup>-</sup>, C<sub>2</sub>H<sub>4</sub> and ethanol<sup>66</sup>.

As soon as Faradaic currents are flowing, the importance of the local pH and local concentration of carbonaceous species must be taken into account<sup>46,57,67,68</sup>. The interpretation of experimental data must invoke the presence of local concentration gradients<sup>68</sup>. During CO<sub>2</sub>RR, a more alkaline pH than the bulk pH is manifested in the vicinity of the electrode, as a result of hydroxide formation from both the HER and CO<sub>2</sub>RR. This local alkaline pH is the result of mass-transport limitations<sup>57</sup>. This local pH change is proportional to the current density<sup>69</sup>, but also depends on the nature and buffer capacity of the electrolyte, and on the morphology of the electrode. Therefore, modelling concentration gradients near the electrode surface during CO<sub>2</sub>RR is crucial to understand the overall reactive system. Recent

model calculations of pH gradients and CO<sub>2</sub> transport within a fixed boundary layer for different electrolytes showed the importance of buffer identity, buffer capacity, buffer pK<sub>a</sub> and CO<sub>2</sub> pressure on the reaction kinetics, as well as the importance of the buffer kinetics<sup>70</sup>. We expect that the combination of such models with surface kinetics models will become increasingly important in designing reactive electrochemical three-dimensional interphases as shown in recent work on pH effects to explain C<sub>1</sub> versus C<sub>2</sub> selectivity<sup>71</sup>.

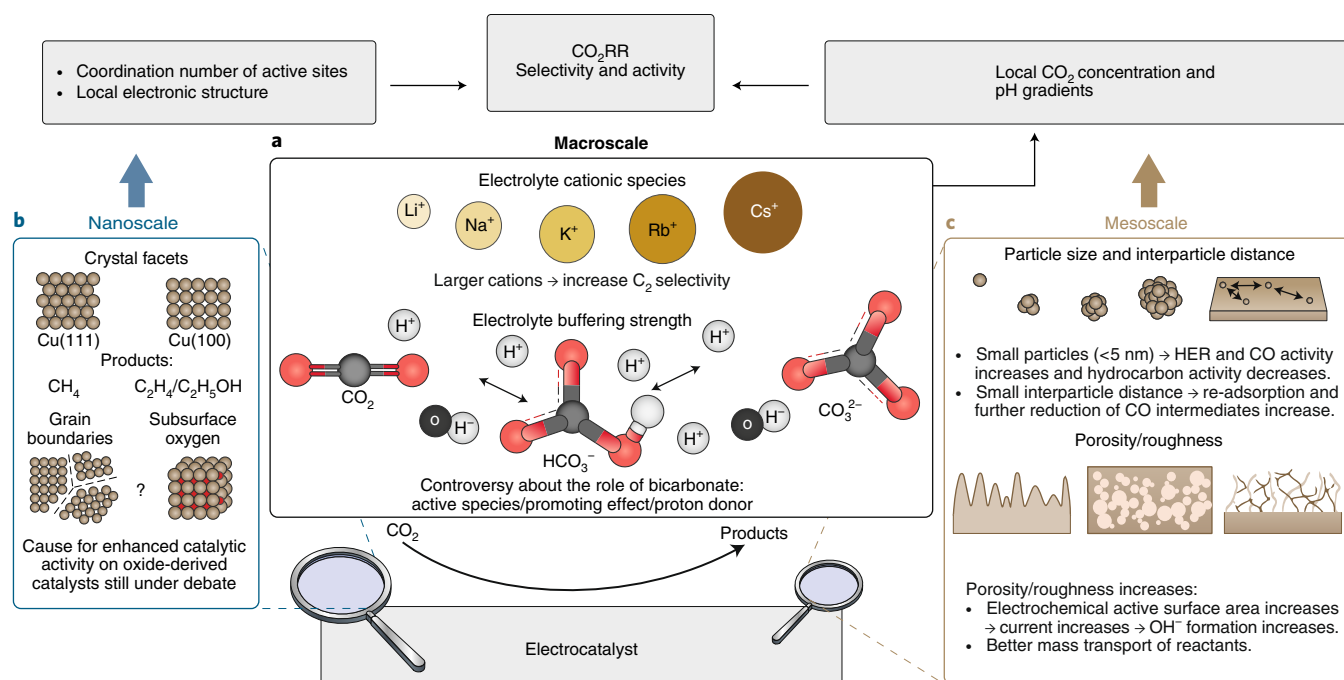
Since the (local) pH near the electrode has such an important role in some of the crucial steps in CO<sub>2</sub>RR (see the previous sections), reactivity and selectivity can be tuned by the electrolyte composition<sup>46,67,70</sup>. A prime example of this effect happens on Cu electrocatalysts, for which the selectivity towards ethylene can be enhanced by lowering the buffer capacity, thereby favouring a higher local pH<sup>46,72</sup>. In addition, the selectivity can be steered towards ethylene by increasing the CO<sub>2</sub> pressure, leading to enhanced local CO concentration and a higher \*CO coverage<sup>71</sup>.

Another parameter influencing the local pH and consequently the product distribution of CO<sub>2</sub>RR is the electrode morphology (Fig. 3c). It has been shown that the increased mesoporosity of silver and gold catalysts alters the selectivity in favour of CO<sub>2</sub>-to-CO conversion, compared with H<sub>2</sub> evolution, which is attributed to enhanced local pH gradients in highly mesoporous films<sup>73,74</sup>. These trends were corroborated by comparison to rotating (cone) electrode experiments, showing that enhanced mass transport is advantageous to hydrogen evolution, but has a neutral or inhibitive effect on CO<sub>2</sub>RR. Using rotating copper cylinder electrodes, it was shown that the CO<sub>2</sub>RR activity decreases with higher rotation rate, related to a change in selectivity from CH<sub>4</sub> to CO as CO is more readily transported away with enhanced convection<sup>75</sup>. Rotating copper disk electrode experiments in mildly acidic media revealed that water reduction is the HER pathway in competition with CO<sub>2</sub>RR, instead of proton reduction<sup>76</sup>. The suppression of water reduction on copper was suggested to be the result of \*CO on the copper electrode, which is more pronounced at low rotation rates (as CO does not diffuse away). Note that one should be careful with the interpretation and comparison of experimental data of high-surface-area electrocatalysts on the reversible hydrogen electrode (RHE) scale, since the local pH may be significantly different compared with the bulk pH, leading to deviations on the RHE scale<sup>58</sup>.

Another consequence of a local alkaline pH as a result of the concomitant HER during CO<sub>2</sub>RR is the occurrence of homogeneously catalysed chemical reactions, which may seriously affect the overall product spectrum<sup>53,77</sup>. Cannizzaro-type reactions can take place during CO<sub>2</sub>RR, in which intermediate aldehydes disproportionate into their corresponding carboxylic acid and primary alcohol<sup>53</sup>. This phenomenon is enhanced by the alkaline pH near the electrode, and is therefore more important in poorly buffered or unbuffered electrolytes, and on electrodes with high porosity. The obtained products (acids and alcohols) should be distinguished from direct CO<sub>2</sub>RR products.

The nature of the electrolyte cations and anions has been shown to have a significant effect on the activity and selectivity of the CO<sub>2</sub>RR. Larger cations usually lead to higher CO<sub>2</sub>RR rates and a higher C<sub>2</sub>/C<sub>1</sub> ratio (on copper electrodes)<sup>78–80</sup>. A cation hydrolysis effect has been suggested to lead to an enhanced buffering near the electrode for larger cations, which in turn increases the local concentration of dissolved CO<sub>2</sub> (refs. <sup>79,81</sup>). An alternative rationalization of the cation effect is the lesser stabilization of 2 \*CO compared with \*OCCO and \*OCCOH (refs. <sup>16,32,82</sup>). The onset potential for ethylene depends on the cation nature, while for methane no correlation with cation size was found<sup>82</sup>.

The effect of anions on the CO<sub>2</sub>RR has been investigated, although less extensively compared with cations, and these studies generally deal with halide effects on copper<sup>83–87</sup>. Anion effects are generally explained in terms of halide adsorption on the catalyst



**Fig. 3 | Schematic of the different length scales involved in the understanding of CO<sub>2</sub>RR and of the influence of relevant parameters. a, Macroscale:** electrolyte composition and buffering strength. **b, Nanoscale:** crystal facets, grain boundaries or subsurface oxygen. **c, Mesoscale:** influence of particle size, interparticle distance and porosity.

surface, altering the electronic structure and subsequently the CO<sub>2</sub>RR activity and selectivity, which are also dependent on the halide size and concentration<sup>85</sup>. Moreover, specifically adsorbed halide anions can suppress proton adsorption, favouring CO<sub>2</sub>RR with respect to the HER<sup>84</sup>. Halide ions can also aid in the formation of well-defined copper nanocrystals by nanostructuring of the copper catalyst<sup>86</sup>. As mentioned before, buffering anions have also been shown to have a role in the formation of H<sub>2</sub> and CH<sub>4</sub> (ref. <sup>66</sup>).

### Electrode morphology and (sub)surface atoms

The effect of electrode morphology on CO<sub>2</sub>RR performance should be understood on different length scales, a schematic illustration of which is shown in Fig. 3. On one end of the spectrum is the atomic-level structure of the surface, which can be studied with different single-crystal surfaces (Fig. 3b)<sup>33</sup>. Nanostructured<sup>88–92</sup> and mesostructured<sup>74,93–96</sup> catalysts and OD electrodes<sup>97–105</sup> have been shown to influence the CO<sub>2</sub>RR activity and selectivity through the variation of the coordination number of the active sites, local electronic structure by the presence of subsurface oxygen, catalyst particle size and re-adsorption of intermediates by the interparticle distance. The electrode's mesostructure also substantially affects the mass transport of reactants (Fig. 3c). Rough or high-surface-area surfaces, such as OD copper electrodes, exhibit improved hydrocarbon selectivity compared with smooth surfaces. This is typically attributed to the increased population of undercoordinated sites<sup>88</sup>, but as discussed in the previous section, high-surface-area mesoporous catalysts also tend to suppress hydrogen evolution due to the poorer mass transport in porous systems. Cubic-shaped copper nanocrystals steer the selectivity towards ethylene with respect to methane<sup>89,90</sup>, in agreement with the observation that Cu(100) facets favour C–C coupling.

A particle size effect of Cu nanoparticles has been reported<sup>92</sup>, showing that the activity for H<sub>2</sub> and CO is increased with decreasing particle size (<5 nm), while the selectivity towards hydrocarbons is decreased. This observation was attributed to a higher number of undercoordinated sites (coordination number < 8), which promote HER and CO formation due to stronger chemisorption of \*CO.

Paradoxically, \*CO is difficult to be reduced further, which was ascribed to lower surface mobility. Particle-size effects of CO<sub>2</sub>RR activity on gold nanoparticles have also been observed, leading to a drastic increase in the H<sub>2</sub>/CO ratio for very small nanoparticles, which was attributed to the increase of specific edge sites that enhance \*COOH stabilization with respect to \*H stabilization<sup>106,107</sup>.

Investigation of mesoscale phenomena has also demonstrated the effects of particle size and particle distance on the product selectivity for well-defined Cu catalysts<sup>95</sup>. Re-adsorption of CO intermediates, followed by their further reduction, was found to be associated with small interparticle distance and larger nanoparticle sizes, whereas small nanoparticles suffer from active-site poisoning by CO.

Various authors have suggested pre-treatments of (metallic) catalysts to enhance their activity for CO<sub>2</sub>RR. Increased efficiency, selectivity and stability of CO<sub>2</sub>RR were revealed on OD electrocatalysts, which were obtained by reducing metal-oxide films<sup>97,103</sup>. Improved CO<sub>2</sub>RR activity has been reported for OD-Au, OD-Cu, OD-Ag and OD-Pb<sup>97,98,103–105</sup>. Many papers have been published regarding CO<sub>2</sub>/CO reduction on OD-Cu electrodes<sup>99–102</sup>, but the key factors responsible for the improved selectivity and activity of OD electrocatalysts are still debated. In this respect, increased stabilization of the CO<sub>2</sub> anionic adsorbate (CO<sub>2</sub><sup>•-</sup>) by grain boundaries as well as the presence of (sub)surface oxygen have been reported to play a role, although no consensus has been reached yet<sup>108–110</sup>.

On OD-Au, a high selectivity to CO at low overpotential was found, which was ascribed to improved stabilization of CO<sub>2</sub><sup>•-</sup> on OD-Au compared with polycrystalline Au<sup>103</sup>. Grain boundaries have also been shown to have enhanced activity for CO<sub>2</sub>RR activity on Au<sup>111</sup>. Similar conclusions have been drawn regarding CO production on OD-Cu<sup>100</sup>. In addition, on oxide-derived copper the enhanced activity and stability compared with polycrystalline copper depend on the initial thickness of the Cu<sub>2</sub>O layers and is not significant for thin films (<3 μm)<sup>97,101</sup>. Remarkable improvements of the selectivity towards ethanol, acetate and *n*-propanol for CO reduction on similar OD electrodes have been reported<sup>102</sup>, with the improved selectivity attributed to grain boundaries.

Oxygen plasma activation is another form of pretreatment that yields significantly enhanced CO<sub>2</sub>RR activity<sup>112,113</sup>. The treatment is suggested to yield highly defect-rich surfaces. In the case of plasma-treated copper, subsurface oxygen and the presence of Cu<sup>+</sup> have been suggested as key for the reactivity and selectivity enhancement. Following up on the potential involvement of subsurface oxygen, it was proposed that it modifies the electrocatalyst's electronic structure by reducing  $\sigma$ -repulsion, leading to increased \*CO binding energies, primarily near grain boundaries<sup>110</sup>. Another explanation is that subsurface oxygen facilitates neutral and charged copper sites at the surface, leading to chemisorbed CO<sub>2</sub> in presence of water and consequently enhanced CO<sub>2</sub>RR activity<sup>114</sup>. DFT calculations have indeed shown that interstitial oxygen species are stable at the Cu(111) subsurface, contrary to Cu(211), and are capable of improving CO<sub>2</sub> binding to the surface<sup>115</sup>. In contrast, recent DFT-based work concluded that diffusion barriers for subsurface oxygen are low and hence it is unlikely that subsurface oxygen is stable during the negative potentials at which CO<sub>2</sub>RR takes place<sup>116</sup>. From experiments employing <sup>18</sup>O labelling, it was also concluded that residual (subsurface) oxides should be unstable under CO<sub>2</sub>RR conditions<sup>117</sup>. Moreover, theoretical work has shown that subsurface oxygen is not a prerequisite for CO<sub>2</sub> adsorption<sup>118</sup> and that coordinatively unsaturated Cu atoms facilitate C–C bond formation<sup>12,119,120</sup>.

When Cu<sub>x</sub>O is used directly for CO<sub>2</sub>RR, methanol<sup>121,122</sup>, ethanol<sup>123,124</sup> and ethylene<sup>123</sup> are observed as major products. It is often assumed that during CO<sub>2</sub>RR, the Cu<sub>x</sub>O electrocatalyst should be completely converted to metallic Cu. However, a residual oxide layer was shown to remain present on the surface during CO<sub>2</sub>RR and the surface oxide and OD metallic layer were proposed as key reaction sites for catalysis<sup>125</sup>. The formation of C<sub>3</sub>–C<sub>4</sub> products was also reported, supposedly due to a synergistic effect between Cu<sub>2</sub>O and Cl adsorption, which resulted in a higher population of Cu<sup>+</sup> species<sup>126</sup>. In an interesting pulse voltammetry experiment, it was shown that a freshly oxidized copper electrode obtained by repeated anodic pulsing has enhanced selectivity towards oxygenated hydrocarbons<sup>127</sup>.

In conclusion, the exact nature of the active sites of OD CO<sub>2</sub>RR catalysts remains controversial and as yet unresolved. Apart from chemical or materials-related aspects such as those discussed, some researchers have argued that the activity and selectivity follow rather simple and consistent trends with current and potential<sup>128</sup>. Reliable methods to measure accurately the electrochemically active surface area<sup>129</sup> of copper electrodes (beyond surface capacitance measurements, which may sometimes be inaccurate<sup>130</sup>) will be paramount in clarifying such effective-surface-area effects.

### In situ spectroscopic investigation of CO<sub>2</sub> reduction

There has been a number of recent in situ (or operando) spectroscopy studies of the CO<sub>2</sub>RR, based on (surface-enhanced) infrared adsorption spectroscopy ((SE)IRAS) or surface-enhanced Raman spectroscopy (SERS). Such studies typically aim at identifying surface-adsorbed intermediates, and their observation or evolution as a function of parameters such as electrode potential, electrode surface and electrolyte composition.

SEIRAS was utilized to measure adsorption profiles of CO on copper electrodes<sup>38</sup>. \*CO was observed at potentials  $< -0.60$  V versus SHE, with a maximum coverage at ca.  $-1.2$  V versus SHE, independent of pH. \*CO was observed to be in dynamic equilibrium with CO in solution, and \*CO is assumed to serve as a pool of intermediates for further reduction. In addition to \*CO, other researchers also observed \*H using SEIRAS, and demonstrated that the two species show an asymmetric blocking effect: \*H can displace \*CO, but \*CO cannot displace \*H (ref. 131). Using isotope labelling and in situ SEIRAS, it was shown that carbonate is an important source of CO<sub>2</sub> near the electrode surface, implying a dynamic equilibrium between bicarbonate and dissolved CO<sub>2</sub> (ref. 64). The authors also

observed (very) weak bands possibly due to other surface-adsorbed intermediates such as \*CHO or \*COOH. Using both SEIRAS and SERS, the potential dependence of two different \*CO bands was analysed, from which it was concluded that the copper surface undergoes a reversible morphological change during potential cycling<sup>132</sup>. The role of metastable surface oxides for CO<sub>2</sub>RR was investigated on tin, indium, lead and bismuth electrodes, by means of attenuated total reflectance SEIRAS<sup>133</sup>. The results indicate the competition between CO<sub>2</sub> and H<sup>+</sup> for reaction sites (oxidized or metallic), depending on the nature of the electrode. Regarding the formation of C<sub>2</sub> species, our group used in situ IRAS on copper single-crystal electrodes to provide evidence for a (hydrogenated) dimer intermediate (\*COCO) with two different C–O stretching frequencies on Cu(100) in alkaline media, coinciding with the conditions under which CO reduction on copper yields C<sub>2</sub> products such as ethylene<sup>45</sup>. A recent theoretical work attributes those frequencies to different intermediates<sup>134</sup>.

Following the previous discussion on the importance of local pH, in situ SEIRAS was used to probe the local pH by comparing the band intensities of HCO<sub>3</sub><sup>-</sup> and CO<sub>2</sub>, showing that the local pH near gold electrodes depends on the nature of the electrolyte cation<sup>135</sup>. SEIRAS was used on gold electrodes to study the production of CO (by adsorbing the CO generated at higher potentials) and showed the importance of HCO<sub>3</sub><sup>-</sup> in effectively increasing the CO<sub>2</sub> concentration<sup>63</sup>, as later confirmed for copper electrodes<sup>64</sup> (see previous paragraph).

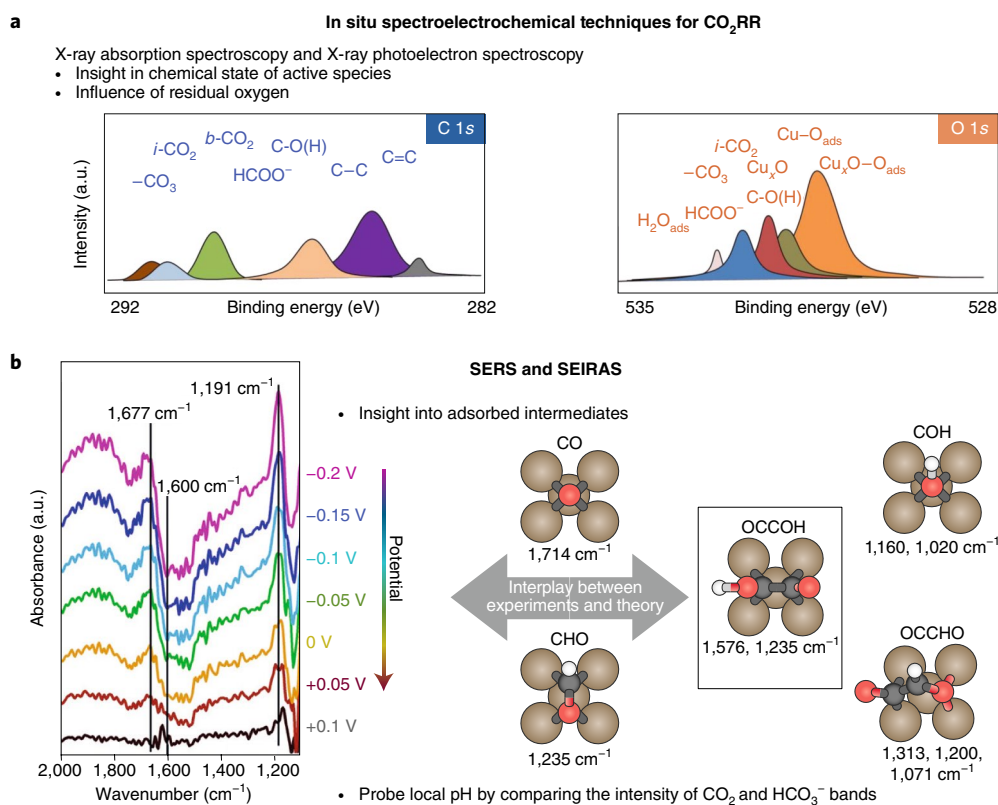
Using in situ IRAS and SERS, a high sensitivity of CO<sub>2</sub>RR in non-aqueous solvents to the presence of residual water has been observed<sup>136</sup>. In non-dry conditions, \*CO is the major product at low overpotentials, and (bi)carbonates are formed at Cu, Pt, Au, Pd and Ag electrodes from the chemical reaction of CO<sub>2</sub> with OH<sup>-</sup> species generated by water reduction. As a consequence, (bi) carbonate formation was found to be related to the water content. The formation of oxalate was observed only for Pb electrodes at high overpotentials.

As is customary with steady-state spectroscopy, identifying (low-coverage) reactive intermediates is difficult, and there is little consistent and widespread evidence for carbon-based intermediates other than \*CO. Hyphenation of in situ spectroscopy with online product identification techniques would be a next instrumental challenge in furthering our understanding of CO<sub>2</sub>RR, as it would enable the establishment of direct relationships between observed adsorbed intermediates and product selectivity. Moreover, in situ synchrotron-based techniques such as X-ray absorption spectroscopy<sup>112,137</sup> and ambient-pressure X-ray photoelectron spectroscopy<sup>110</sup> are promising in understanding interfacial electrochemistry, and have recently been employed to gain insight into the chemical state of the active (Cu) species on OD catalysts for CO<sub>2</sub>RR. An overview of typical spectroelectrochemical techniques used for the understanding of CO<sub>2</sub>RR is depicted in Fig. 4. For more elaborate reviews of in situ spectroelectrochemical techniques applied to CO<sub>2</sub>RR research, the reader is referred to specialized recent reviews<sup>138–140</sup>.

### Computational approaches for CO<sub>2</sub> reduction

DFT calculations applied to the electrode/electrolyte interface are a far from simple endeavour, but much progress has been made in improving models. A recent detailed review of the computational modelling of CO<sub>2</sub> and CO reduction to (oxygenated) hydrocarbons can be found elsewhere<sup>141</sup>. Here we limit ourselves to the foundations, recent advances and key scientific challenges of descriptor-based analyses, which are the most widespread computational approaches for CO<sub>2</sub>RR. An overview of the fundamentals of the method is depicted in Fig. 5.

The computational hydrogen electrode (CHE) is widely employed in computational electrocatalysis<sup>142</sup>. In combination with DFT-calculated adsorption energies of the intermediates (Fig. 5a), one



**Fig. 4 | In situ spectroelectrochemical techniques used in the understanding of CO<sub>2</sub>RR.** **a**, X-ray absorption spectroscopy and (ambient-pressure) X-ray photoelectron spectroscopy to gain insight into the active species. **b**, SERS and (SE)IRAS for understanding the mechanism by observation of adsorbed intermediates (data reproduced from ref. <sup>45</sup> for the detection of OCCOH at low overpotentials during CORR in LiOH solutions), or to probe the local pH. Figure adapted from ref. <sup>45</sup>, Wiley.

can gain insight into the coverage of surface species at specific pH and potentials by means of surface Pourbaix diagrams (Fig. 5b)<sup>143</sup>, and possible reaction pathways and the potentials at which the redox reactions take place (Fig. 5c)<sup>39,144,145</sup>. Studies combining these approaches can also be found in the CO<sub>2</sub>RR literature<sup>146,147</sup>.

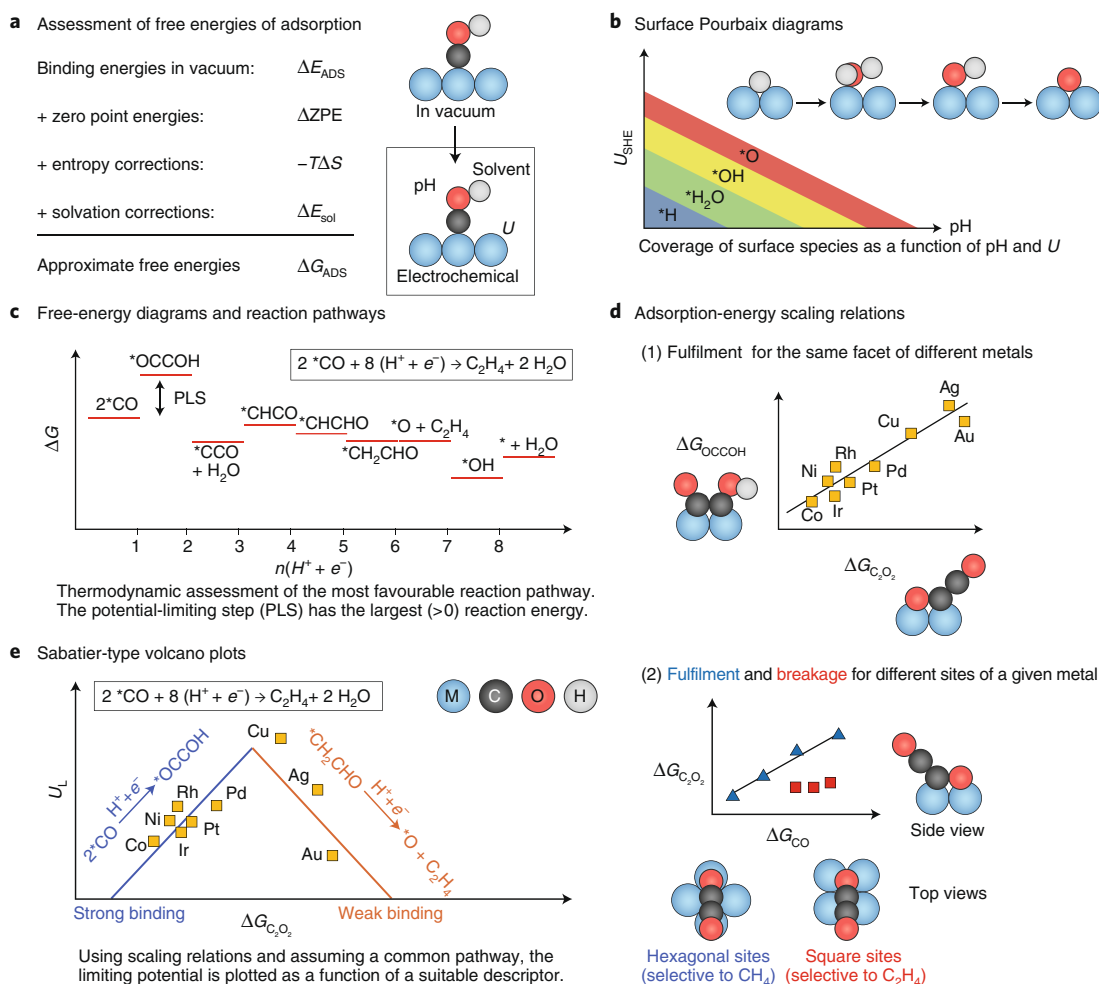
CHE-based models typically assume CPET steps, and are therefore not straightforwardly applicable for reaction pathways where decoupled proton–electron transfer steps are involved. Sequential proton–electron transfer (SPET) steps have been observed on molecular, oxide and metal electrocatalysts, and manifest experimentally through pH effects on the RHE scale<sup>6,148,149</sup>. Recently, a simple methodology was introduced that allows the transition between coupled and decoupled proton–electron transfer pathways to be predicted<sup>12</sup> based on first-principles calculations of acid–base equilibrium constants. Using this methodology, the experimental pH dependence of CO<sub>2</sub>RR on immobilized cobalt protoporphyrins was rationalized, as discussed in the section about initial activation of CO<sub>2</sub> (ref. <sup>13</sup>).

The presence of linear correlations between adsorption energies of similar adsorbates, known as scaling relations (Fig. 5d)<sup>150</sup>, reduces the complexity of DFT-based catalytic models and facilitates the simultaneous analysis of numerous materials through Sabatier-type activity plots (Fig. 5e). Such correlations per se do not carry information on the effect of applied potential, so it might be advisable to ascertain first the relevant surface coverage using surface Pourbaix diagrams<sup>146,147</sup>. Scaling relations might pose extra constraints for finding optimal electrocatalysts with low overpotentials, and have therefore been extensively studied<sup>151–153</sup>. Recent efforts were directed to break or circumvent scaling relations, especially between the intermediates of the electrocatalytic oxygen evolution

and reduction reactions and CO<sub>2</sub>RR<sup>42,154,155</sup>. The strategy is clear, although difficult to implement experimentally: one of the problematic intermediates needs to be significantly stabilized with respect to the other(s). For instance, the preference of Cu(100) for the production of ethylene and ethanol over methane has been explained on the basis of the breaking of scaling relations between \*CO and \*CO dimers (\*C<sub>2</sub>O<sub>2</sub>) on that facet due to strong ensemble effects for the CO dimerization step (Fig. 5d, top)<sup>42</sup>. Another example is the nearly reversible reduction of CO<sub>2</sub> to CO on CODH enzymes, the active site of which does not obey the scaling relationship between \*CO and \*COOH<sup>156</sup>. Furthermore, several strategies for breaking scaling relations in CO<sub>2</sub>RR have been discussed: alloying, tethering, addition of promoters, creation of low-coordination sites and introduction of p-block dopants or oxophilic sites.<sup>145,157</sup> Other ways to depart from scaling relations are altering adsorbate solvation via modification of the electrolyte composition/dielectric constant<sup>154,158</sup>, anchoring active ligands on the surface or at the active sites<sup>159</sup>, strain effects<sup>160</sup> and the study of transition-metal-free electrocatalysts<sup>147</sup>.

However, a word of warning is provided here. Recent studies have pointed out that breaking scaling relations is a necessary yet insufficient condition for the optimization of electrocatalysts. In other words, materials that break scaling relations are not necessarily active, while high activities can be achieved by materials that do not break them<sup>153</sup>. Furthermore, scaling-relation-based volcano plots for CO<sub>2</sub>RR assume that a single mechanism is operative on all materials and facets (Fig. 5c,e)<sup>145,157</sup>. However, recent studies have shown that the CO<sub>2</sub>RR reaction mechanism is both material and structure sensitive. For instance, while it is typically assumed that \*CO hydrogenation leads only to \*CHO, structure-sensitive scaling relations show that it may lead to \*COH, \*CHO, or both, depending





**Fig. 5 | Fundamentals of descriptor-based analyses for CO<sub>2</sub>RR.** **a**, Assessment of free energies of adsorption starting from DFT calculations and adding zero-point energy, entropy and solvation corrections. **b**, Surface Pourbaix diagrams, which predict the thermodynamically most stable adsorbed species and their coverage as a function of pH and the potential versus the standard hydrogen electrode ( $U_{\text{SHE}}$ ). **c**, Free-energy diagrams and most favourable reaction pathways for CORR to C<sub>2</sub>H<sub>4</sub> on Cu(100). **d**, Various types of scaling relations between adsorption energies. **e**, Sabatier-type volcano plots based on scaling relations and the most favourable reaction pathway found in **c** for CORR to C<sub>2</sub>H<sub>4</sub> on (100) surfaces of transition metals. The colour code is provided as an inset and M is a surface metal atom. Panels adapted from: **c**, ref. <sup>39</sup>, Wiley; **d**, ref. <sup>42</sup>, American Chemical Society; **d,e**, ref. <sup>47</sup>, American Chemical Society.

on the active sites (Fig. 6a)<sup>161</sup>. Thus, such assumptions may sometimes lead to erroneous design principles.

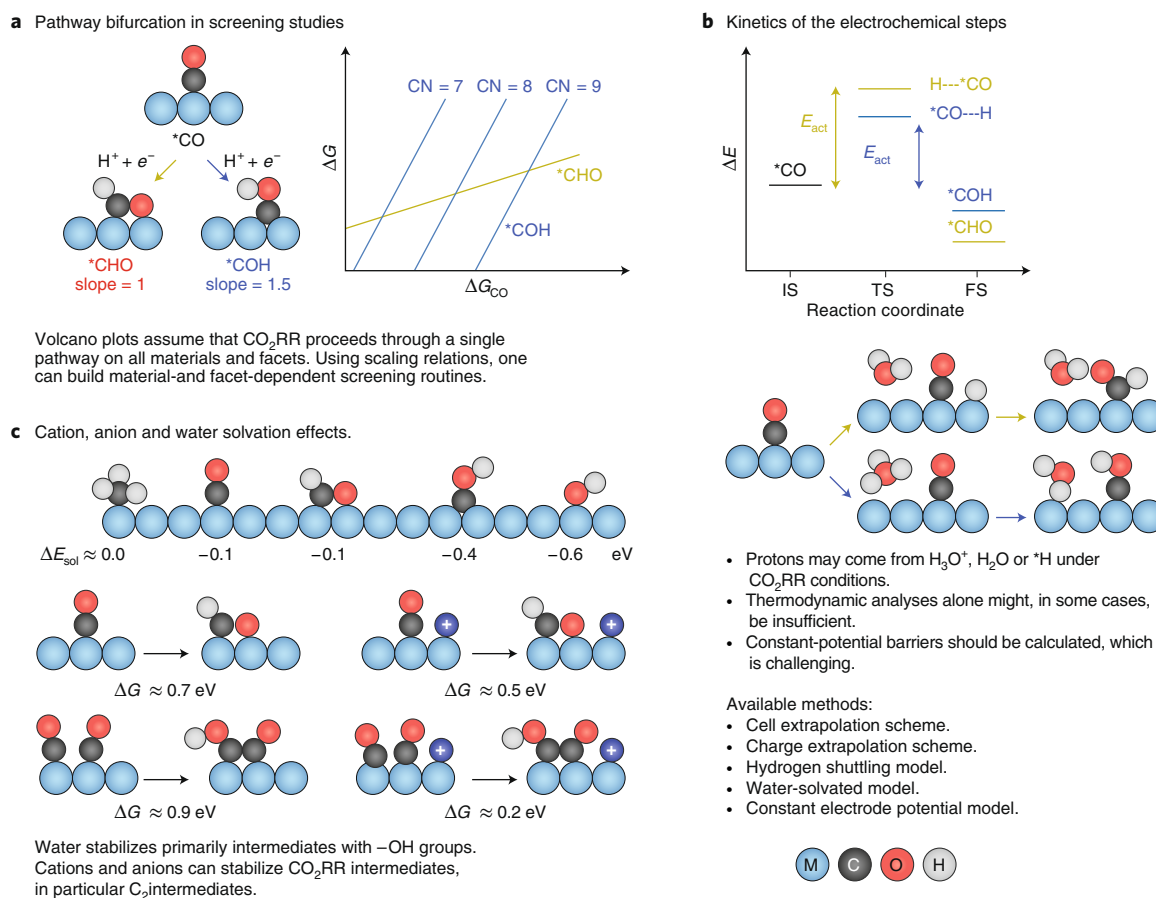
CHE-based models do not generally incorporate reaction barriers, which is another important topic under study in CO<sub>2</sub> and CO electroreduction models (Fig. 6b)<sup>162–164</sup>. An elementary-step kinetics study on the CO<sub>2</sub>RR mechanism to C<sub>1</sub> products showed the formation of either \*CHO or \*COH from \*CO hydrogenation, which determines the selectivity on Cu(111)<sup>43</sup>. \*CH<sub>x</sub> species are formed via the more kinetically favourable \*COH intermediate, which eventually leads to methane and ethylene. Cell<sup>164</sup> and charge<sup>162,163</sup> extrapolation schemes, and constant electrode potential models<sup>44</sup> are also available for the evaluation of energy landscapes, and recent studies have shed light on the intricacies of those methods and the important role of solvation on them<sup>165</sup>.

Recently, it was argued<sup>166</sup> that adsorbate solvation had not been (sufficiently) taken into account in previous studies<sup>40,43</sup>, and a mechanism on Cu(111) was proposed in which surface water influences the selectivity towards hydrocarbons compared with alcohol products. Although solvation is crucial when attempts are made to break scaling relations, it is often overlooked or taken into account as a constant correction to the adsorption energies calculated in vacuum

(Fig. 6c)<sup>39,142,144,145</sup>. It was recently found that solvation restores the scalability broken under vacuum<sup>154</sup> and that it strongly depends on the geometry and chemical nature of the surface sites<sup>167–169</sup>.

Apart from the effects discussed so far, the electrolyte has been shown to alter the activity and selectivity of metal electrodes (Fig. 6c). There are two ways of incorporating ion effects in DFT simulations: implicitly and explicitly. Implicit ion effects are accounted for by means of an electric field that modifies the adsorption energies<sup>170</sup>. In explicit calculations, the ions are introduced and relaxed in the calculations, together with the adsorbates<sup>82,171</sup>. Both approaches show that CO<sub>2</sub>RR intermediates such as \*CO<sub>2</sub>, \*CO, \*OCCO and \*COCO are stabilized by alkaline cations, and that this stabilization is related to their polar/charged character<sup>30,80</sup>.

In short, significant progress has been made in the past decade yet numerous challenges still lie ahead, which currently prevent the development of accurate screening routines for the design of new CO<sub>2</sub> and CO reduction materials<sup>172</sup>. While we need comprehensive fundamental studies that incorporate more features of real interfaces at which CO<sub>2</sub>RR takes place, we also need to make less problematic assumptions in screening studies aimed at designing novel materials. To date, reports of in silico-designed catalysts for



**Fig. 6 | Recent progress in descriptor-based analyses.** **a**, Material- and facet-dependent elaboration of reaction pathways for screening studies on the example of \*CO hydrogenation, which leads to \*CHO or \*COH depending on the type of metal and its coordination. CN, coordination number of the adsorption sites. The slopes reported are those of the scaling relations versus \*CO (ref. <sup>161</sup>). The colour code is provided as an inset. Panel adapted from ref. <sup>161</sup>, American Chemical Society. **b**, Kinetics of the electrochemical steps, which can be assessed using different approaches<sup>43,44,162–165</sup>. IS, TS and FS are the initial, transition and final states, respectively. The example shown considers \*CO hydrogenation on Cu(111): while \*CHO is more stable, the barrier to produce \*COH is lower<sup>43</sup>. **c**, Effects of water solvation and ionic species on the relative stability of CO<sub>2</sub>RR intermediates. Adsorbates are differently stabilized by water depending on their chemical structure. CO hydrogenation to \*CHO is made 0.2 eV more favourable by cations, while CO dimerization and hydrogenation is made 0.7 eV more favourable by the same cations. Values taken from refs. <sup>39,82,144,161,167</sup>.

CO<sub>2</sub>/CO reduction to hydrocarbons and/or oxygenates successfully implemented experimentally are rare. Hopefully, future advances in the treatment of pH- and potential-dependent reaction barriers, inclusion of solvation and electrolyte effects, and a deeper understanding of scaling relations, how and when to break or avoid them, will enable such developments. To enhance the theory–experiment interplay, more single-crystal-based onset potentials and the detection of more CO<sub>2</sub>RR intermediates would help in the validation or reformulation of DFT-based reaction pathways.

### Future directions

In recent decades, significant progress has been made mainly regarding the design of highly active or selective electrocatalysts, and their CO<sub>2</sub>RR mechanism. However, it is crucial to realize the importance of other aspects, such as electrode morphology, (sub)surface structure, and reaction and process conditions, not only from a mechanistic standpoint but also from a system perspective. Specifically, not only the electrode/electrolyte interface should be studied but also transport phenomena, catalyst stability and electrolyte/solvent effects should be optimized. In this endeavour, it is desirable and even necessary to combine computational and in situ spectroelectrochemical techniques. Ideally, one would like to combine all the different aspects in a (computational) model instead of a collection

of theoretical models providing only (mechanistic) information for specific cases. This would require a more rigorous standardization of experimental setups and procedures, more dedicated efforts to understand electrocatalysis beyond what happens at the catalyst surface, and a multiscale computational modelling approach encompassing all these aspects. We believe that future research should deviate from solely finding or improving highly active/selective electrocatalysts, and focus on the joint action of all relevant aspects for CO<sub>2</sub>RR to become a viable option for the production of electrofuels.

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### Competing interests

The authors declare no competing interests.

### Additional information

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