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Review Article

Electrochemical hydrogenation of NO and CO: Differences and similarities from a computational standpoint Federico Calle-Vallejo^{a,b}

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Abstract

Electrolyzers can help in restoring the balance to the biogeochemical cycles of carbon and nitrogen while producing valuable chemical compounds. Before that happens on a global scale, various hurdles need to be overcome, some of which are related to the activity and selectivity of the materials used to catalyze electrolysis reactions. For instance, CO and NO are important electrolysis feedstocks and/or reaction intermediates and their hydrogenation is often energetically demanding. Here it is shown how the most favorable hydrogenation product among *CHO or *COH, and *NHO or *NOH on late transition metals can be ascertained by classification methods based on adsorption-energy scaling relations and "catalytic matrices". In particular, late transition metals can be split into weak-binding and strong-binding and there is a noble-nonnoble energy gap between them. Such a simple categorization helps outline the metals and facets that selectively favor the making of O-H, C-H and N-H bonds.

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Keywords

NO hydrogenation, CO hydrogenation, Scaling relation, Catalytic matrix, Classification method, Late transition metal.

Introduction

After more than a decade of focalized research on CO₂ reduction and akin reactions within the carbon cycle [1-4], some electroreduction reactions belonging to the nitrogen cycle are regaining considerable attention [5-9]. This is a timely diversification of the research efforts, as the imbalance of the nitrogen cycle is larger than that of the carbon cycle but far less publicized to this date [10]. In this new wave of nitrogen electrocatalysis it is worth noting that some authors have called for and put forward rigorous experimental protocols for product detection and quantification of reaction products, with the aim of enabling one-to-one comparisons across different laboratories [11-13]. In addition, the co-electrolysis of oxidized C- and N-containing species is an appealing, low-temperature route toward urea and other compounds with C-N bonds, which can help in reaching the much-needed but arduous rebalance of both biogeochemical cycles [4,14–18].

Because CO hydrogenation and NO hydrogenation are both energy-intensive and impact the overall performance of catalysts for CO and NO electroreduction [19–25], it is useful to compare the trends among various materials to establish key differences and similarities. Specifically, it is of great interest for the rational design of electrocatalysts to ascertain whether a given active site drives *CO hydrogenation toward *CHO or *COH, and whether it drives *NO hydrogenation toward *NHO or *NOH (here, an asterisk next to a species indicates that the species is adsorbed), following the reactions shown below.

$$*CO + H^+ + e^- \to *COH \tag{1}$$

$$*CO + H^+ + e^- \to *CHO \tag{2}$$

$$*NO + H^+ + e^- \to *NOH \tag{3}$$

$$*NO + H^+ + e^- \to *NHO \tag{4}$$

Establishing general trends in the selectivity of materials toward those four electrochemical steps is useful for the following reasons:

- It is still widely believed that *CO hydrogenation most often leads to *CHO, and that the persistent scaling relation between those two species is responsible for the large overpotentials of CO and CO_2 electroreduction to methane [23,26].
- It is not yet clear when *NO hydrogenation leads to *NHO or *NOH on late transition metals, and factors such as electrode composition and morphology, and adsorbate coverage seem to play a role [20,21,25,27,28].
- Co-electrolysis pathways to urea may involve *NO, *CO and their most favorable hydrogenated counterparts [16-18].
- It is a widespread practice to represent polycrystalline electrodes and nanoparticles by means of a single surface site, often located at (111) terraces.

As I think that the classifications based on adsorption energies and the scaling relations thereof put forward by Bagger, Rossmeisl and coworkers are intuitive and insightful [9,16,25,29-31], I provide in the following a comparison of *NO and *CO hydrogenation on late transition metals along similar lines and supplement the observations by the structure-sensitive insights of "catalytic matrices" [22,27]. Detailed analyses toward various final products are available elsewhere [9,21,23,32].

My aim is not to connect the selectivity of *CO or *NO hydrogenation with the product distribution of their overall reduction reactions. Indeed, the C₁ vs C₂ selectivity of CO electroreduction depends on whether *CO is dimerized or hydrogenated, and the ethylene/ ethanol selectivity depends on the product of *CH₂CHO hydrogenation [33,34]. I aim to show that *NO and *CO hydrogenations may generally be energyintensive and potential-limiting. Enhancing their electrocatalysis entails stabilizing the hydrogenation products of *NO and *CO. Because the geometric and electronic structures, adsorption configurations and solvent-adsorbate interactions of *NHO and *NOH are different and the same applies to *CHO and *COH, it is paramount to ascertain the one formed depending on the catalyst structure and reaction conditions.

Trends in CO and NO hydrogenation on late transition metals

The following analysis is based on thermodynamic considerations. The adsorption energies of *CO, *CHO, *COH [22], *NO, *NHO and *NOH [27] on Co, Ni, Cu, Rh, Pd, Ag, Ir, Pt, and Au were assessed by means of density functional theory (DFT) calculations, see Table S1. Both datasets were produced with VASP

[35], making use of the PBE functional [36] and the PAW method [37]. The free energies are based on the DFT total energy (E_{DFT}) , the zero-point energy (ZPE)and include entropic corrections (TS) and adsorbatesolvent stabilization corrections (E_{solv}) : $G \approx E_{DFT} + ZPE - TS + E_{solv}$. The adsorption energies are defined with respect to CO(g), NO(g), and $(H^+ + e^-)$. The total energies of CO(g) and NO(g)include gas-phase corrections [38-40], which ensure that the reaction energies and equilibrium potentials agree with experiments. The energetics of $(H^+ + e^-)$ is calculated using the computational hydrogen electrode [41]. Metal-independent adsorbate-solvent interaction corrections were added to the adsorption energies of *CO, *CHO and *COH (-0.10, -0.10, -0.38 eV) [22,33], while metal-, facet-, and adsorbate-specific corrections obtained using an iterative micro-solvation method were added to the adsorption energies of *NO, *NHO and *NOH [27,42,43].

Before continuing, I stress that incorporating or neglecting the aforementioned gas-phase and adsorbatesolvent corrections may substantially affect the predictiveness of computational models. For instance, significant differences between the slopes and offsets of scaling relations in vacuum and with an implicit solvent have been shown for metalloporphyrins [44]. That activity trends remain untouched in spite of the DFT errors present in the calculations used to establish them is an extended, widely accepted yet inaccurate perception [38,42,45].

Of course, other effects such as reaction kinetics, adsorbate coverage, bulk and local pH, mass transport, cation effects, electrode potential, etc [1,2,11,20,46-49] also ought to be incorporated into computational electrocatalysis models, preferably in simple terms. For example, previous works showed that the adsorption energies of species under an electric field may undergo sizeable shifts depending on the magnitude and sign of the field, and the polarizability and dipole moment of the adsorbates [50]. Hence, adsorption-energy scaling relations might be appreciably modified under electrochemical conditions. Besides, high adsorbate coverages modify scaling relations [51,52] and have a direct impact on the reaction pathway, voltametric profile and catalytic activity of Pt(111) and Pt(100) for NO electroreduction [20,28].

The adsorption sites considered here comprise terraces ((111) and (100)), steps ((211) and (211) kinked), and metal adatoms (3AD @ (111)), as schematized in Figure S1. Those adsorption sites span a range of coordination numbers (*cn*) between 5 and 9. A disclaimer is necessary here: the offsets of adsorption-energy scaling relations on metals tend to vary as a function of *cn*, except when the slope is unity (or $\frac{3}{4}$ for C-bound species) [32,53,54]. Here, however, to simplify the

analysis, I made a single linear fit for all datapoints, which comes at the expense of increasing the mean absolute errors (MAEs) and decreasing the correlation coefficients (r). Anyway, the MAEs in Figures 1–4 are below 0.20 eV, and r is larger than 0.90 in all cases.

Classifications based on scaling relations

According to Figure 1a-b, there exist adsorption-energy scaling relations [53,55] between *CHO, *COH, and *CO, and between *NHO, *NOH and *NO. Figure 1c shows that *NO and *CO also scale. Thus, Figure 1 indicates that, within certain accuracy, all six adsorbates scale with each other, such that linear co-

Figure 1

electrolysis models based on a reduced number of parameters are possible [16]. However, the appreciably different fits in Figure 1a—b attest to specific binding differences. In particular, the slope of the *CHO vs. *CO relation is \approx 1 and that of *COH vs. *CO is \approx 3/2. These values suggest that the valency of *CHO and *CO is nearly identical, whereas that of *COH and *CO differs by one [22]. For *NHO vs. *NO the slope is between $\frac{1}{2}$ and 1, and close to 1 for *NOH vs. *NO [27]. In addition, the slope of *CO vs *NO in Figure 1c is also in the range of $\frac{1}{2}$ and 1, which is indicative of their different valency. In sum, the slopes are in the approximate range between $\frac{1}{2}$ and $\frac{3}{2}$, and it is

2.0 $\Delta G_{CHO} = 0.96 \Delta G_{CO} + 0.68$ 1.54 AG r = 0.97. MAE = 0.20 eV r = 0.97, MAE = 0.13 eV 1.0 ø 0.0 b) a) ∆G2 -1.0 -2.0 $\Delta G_{\rm NOH} = 0.92 \ \Delta G_{\rm NO} + 0.19$ $= 0.79 \Delta G_{NO} - 0.17$ NHO -3.0 r = 0.97, MAE = 0.15 eV r = 0.95, MAE = 0.20 eV -3.0 -2.0-1.0 0.0 -3.0 -2.0 -1.00.0 ∆G, / eV ∆G, / eV 0.5 $\Delta G_{CO} = 0.71 \ \Delta G_{NO} + 0.21$ r = 0.93, MAE = 0.20 eV 0.0 ٩ -0.5 ΔG_{co} -1.0 C) -1.5 -2.0 -3.0 -2.0 -1.0 0.0 $\Delta G_{_{\rm NO}}$ / eV Current Opinion in Electrochemistry

Adsorption-energy scaling relations among C- and N-containing species. a) *CHO vs *CO, and *NHO vs. *NO. b) *COH vs. *CO, and *NOH vs. *NO. c) *CO vs. *NO. In each case, the least-squares linear fit, correlation coefficient (*r*) and mean absolute error (*MAE*) are provided. The adsorption energies in this figure were taken from previous works [22,27] and appear in Table S1.





Selectivity of *NO hydrogenation (left) and *CO hydrogenation (right), as described by the combination of scaling relations and a parity line. Active sites above the parity line are thermodynamically inclined to produce *NOH and *COH, while those below produce *NHO and *CHO. In each case, the least-squares linear fit, correlation coefficient (*r*) and mean absolute error (*MAE*) are provided. The adsorption energies were taken from previous works [22,27] and appear in Table S1.

Figure 3

metal / facet	111 cn = 9	100 cn = 8	211 cn = 7	211k cn = 6	3AD@111 cn = 5	metal / facet	111 cn = 9	100 cn = 8	211 cn = 7	211k cn = 6	3AD@111 cn = 5
Co	СОН	сон	СОН	СОН	сно	Co	NOH	NHO	both (NOH)	NHO	NHO
Rh	СОН	СОН	СОН	СОН	СОН	Rh	both (NOH)	NHO	both (NHO)	NHO	NHO
lr	СОН	СОН	СОН	both (COH)	сон	lr	both (NOH)	NHO	NHO	NHO	NHO
Ni	СОН	сон	СОН	СОН	both (COH)	Ni	NOH	NHO	NOH	both (NHO)	NHO
Pd	СОН	СОН	СОН	СОН	СОН	Pd	NOH	both (NOH)	both (NOH)	NOH	NOH
Pt	СОН	сон	СОН	СОН	both (COH)	Pt	NOH	both (NHO)	NHO	both (NOH)	both (NOH)
Cu	both (COH)	both (CHO)	СНО	СНО	сно	Cu	both (NHO)	NHO	NHO	NHO	NHO
Ag	сно	СНО	СНО	СНО	сно	Ag	NHO	NHO	NHO	NHO	NHO
Au	сно	СНО	СНО	СНО	сно	Au	NHO	NHO	NHO	NHO	NHO
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Catalytic matrices for *CO hydrogenation (left) and *NO hydrogenation (right) on nine late transition metals and five surface facets. Sites for which $abs(\Delta G_{NOH} - \Delta G_{NHO}) < 0.1 \ eV$ and $abs(\Delta G_{COH} - \Delta G_{CHO}) < 0.1 \ eV$ are referred to as "both" and their slight preference is indicated. Left: reprinted (adapted) with permission from Ref. [22], copyright 2017 American Chemical Society. Right: replotted from Ref. [27], licensed under CC BY 4.0 (https:// creativecommons.org/licenses/by/4.0/).

interesting that the relationships with a slope close to unity are *CHO vs. *CO and *NOH vs. *NO.

The classifications by Bagger, Rossmeisl and coworkers are usually based on a vertical line that intersects a horizontal one. The lines are not arbitrarily set but rather correspond to equilibrium adsorption energies. Metals to the left or below the lines bind strongly, whereas those to the right or above the lines bind weakly. Figure S2 shows that the positions of the metals Figure 4

metal / facet	111 cn = 9	100 cn = 8	211 cn = 7	211k cn = 6	3AD@111 cn = 5
Co	O-H	N.S.	O-H	N.S.	C/N-H
Rh	O-H	N.S.	N.S.	N.S.	N.S.
lr	O-H	N.S.	N.S.	N.S.	N.S.
Ni	O-H	N.S.	O-H	N.S.	N.S.
Pd	O-H	O-H	O-H	O-H	O-H
Pt	O-H	N.S.	N.S.	O-H	O-H
Cu	N.S.	C/N-H	C/N-H	C/N-H	C/N-H
Ag	C/N-H	C/N-H	C/N-H	C/N-H	C/N-H
Au	C/N-H	C/N-H	C/N-H	C/N-H	C/N-H
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Catalytic matrix illustrating the preference of various active sites on transition metals upon hydrogenation. O–H: active sites inclined toward the formation of O–H bonds. C/N–H: active sites inclined toward the formation of C–H and N–H bonds. N.S.: Not selective, namely, active sites that may indistinctively form O–H or C–H and N–H bonds.

with respect to the equilibrium binding energies do not play a role in their selectivity toward *NHO/*NOH and *CHO/*COH. Alternatively, overall selectivity trends can be inferred from the intersection of scaling relations and the parity line (y = x), as in Figure 2. Datapoints above the parity line correspond to *NOH- and *COHproducing materials, while those below the line are selective to *NHO and *CHO. Both scaling relations in Figure 2 can be divided into two parts: a weak-binding region and a strong-binding region. The two regions are separated by a "noble-nonnoble gap" or "3n gap", which is the region between the red and blue rectangles. In it, no materials are observed when analyzing trends for late transition metals. Although I cannot currently justify the existence of such a gap, it can also be noticed in previous works for other C-containing species adsorbed on metals [32] and materials such as single-atom catalysts and metalloporphyrins [56,57]. As the gap tends to be relatively wide, it may facilitate the making of alternative activity and selectivity classifications.

Ag and Au are always in the weak-binding region, whereas Co, Ni, Rh, Pd, Ir and Pt are always in the strong-binding region. Interestingly, Cu switches sides: it is a weak-binding metal for *CO hydrogenation and a strong-binding metal for *NO hydrogenation and is close to the 3*n* gap in both cases. In terms of selectivity, Figure 2 indicates that weak-binding metals are selective to *NHO and *CHO. Conversely, strong-binding metals are selective to *COH but have mixed selectivity toward *NOH and *NHO.

Catalytic matrices

Although scaling relations are rather insightful, there is a limit as to how much they can visually display before a given figure looks cluttered. In such a case, one can resort to "catalytic matrices", which help in identifying structure-sensitive activity and selectivity patterns [22,27]. In those, adsorption-energy datasets are presented as a matrix in which the entries depend on the element and its surface coordination. Moreover, catalytic matrices can be approximated by means of simple multivariate regressions [27].

As shown in Figure 3, catalytic matrices condense all the selectivity data present in the scaling relations of *CHO vs. *COH and *NHO vs. *NOH in an organized manner. I often find valuable the ascertainment of how representative of an entire electrode is a specific facet. For instance, it is common to represent polycrystalline electrodes of fcc metals by their (111) facet, allegedly because it is the most stable one. Catalytic matrices give hints on the suitability of this simplification.

According to Figure 3, (111) terraces are an acceptable qualitative approximation of a polycrystalline electrode for *CO hydrogenation, as the selectivity does not vary strongly as a function of cn. This is clear in Figure 2 (right), where the intersection between the parity line and the scaling relation takes place within the 3n gap, such that the selectivity depends only on whether a material binds strongly or weakly. However, for *NO hydrogenation this approximation is only advisable for Pd, Cu, Ag, and Au, as the intersection of the parity line and the scaling relation occurs within the red rectangle in Figure 2 (left).

For comparison, the two matrices in Figure 3 are combined in Figure 4, which allows one to extract some overall conclusions for late transition metals. Specifically, Cu, Ag and Au tend to produce species with C-H and N-H bonds (*CHO/*NHO). In turn, Pd is inclined to produce species with O-H bonds (*COH/ *NOH). This is also true for the (111) facet of strongbinding metals. For all those specific elements and facets, the trends in *NO and *CO hydrogenation are certainly analogous. Nevertheless, there are various sites in Figure 4 predicted to produce *COH and *NHO and classified as "not selective (N.S.)". Interestingly, no active site in the matrix produces *CHO and *NOH.

Finally, based on Figures 2 and 3, it is not advisable to assume that the preferred hydrogenation product of *CO is always *CHO, as often assumed in the literature [23,26]. In fact, kinetic analyses using single-crystal electrodes have shown that the preference for *CHO or *COH is facet- and potential-dependent on Cu electrodes [46].

Concluding remarks

Scaling relations are one of the cornerstones of contemporary computational electrocatalysis, and catalytic matrices help summarize and analyze large datasets. Both tools are useful in materials screening studies, the accuracy of which might increase if the effects of various parameters are probed, understood and routinely considered. Catalytic matrices should in the future incorporate information on *H, as hydrogen evolution usually competes with numerous electrochemical reactions [25].

Delving into *CO and *NO hydrogenation with the help of these two tools, I conclude that, although those two adsorbates may at first sight seem similar, their adsorption energies and hydrogenation products on late transition metals differ qualitatively and quantitatively. The main features of *NO and *CO hydrogenation from a computational standpoint are:

- *CO and *NO scale linearly but not with a unity slope, so their valency is different. *CO scales with *CHO with a slope close to 1. Conversely, *NO does so with *NOH.
- Late transition metals can be classified into strongand weak-binding. There is a noble-nonnoble gap (or 3*n* gap) separating the two groups. Only Cu moves between groups, while Ag and Au are in both cases weak-binding, and Co, Ni, Rh, Pd, Ir and Pt are in both cases strong-binding.
- Catalytic matrices show that the (111) facet of strongbinding metals and all facets of Pd favor O–H bond formation during *NO and *CO hydrogenation. Conversely, Cu, Ag, and Au favor the formation of C–H and N–H bonds.
- Qualitatively, it is fair to assume that the (111) facet of late transition metals approximates well the selectivity of polycrystalline electrodes for *CO hydrogenation. Nevertheless, this is true only for weakbinding metals and Pd for *NO hydrogenation. Except for weak-binding metals, assuming that *CO hydrogenation always leads to *CHO is not a good approximation.

Declaration of competing interest

The author declares that he has no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

Data availability

All the data are provided in the Supplementary Material.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.coelec.2023.101409.

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