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# Understanding active sites in pyrolyzed Fe-N-C catalysts for fuel cell cathodes by bridging density functional theory calculations and <sup>57</sup>Fe Mössbauer Spectroscopy

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#### Abstract

Pyrolyzed Fe-N-C materials are promising platinum-group-metal free catalysts for protonexchange membrane fuel cell cathodes. However, the detailed structure, oxidation and spin states of their active sites is still undetermined. <sup>57</sup>Fe Mössbauer spectroscopy has identified FeN<sub>x</sub> moieties as the most active sites, with their fingerprint being a doublet in lowtemperature Mössbauer spectra. However, the interpretation of the doublets for such materials has lacked theoretical basis. Here, we applied density functional theory to calculate the quadrupole splitting energy of doublets ( $\Delta E_{OS}$ ) for a range of FeN<sub>x</sub> structures in different oxidation and spin states. The calculated and experimental values are then compared for a reference Fe-N-C catalyst, while further information on the Fe oxidation and spin states was obtained from electron paramagnetic resonance, superconducting quantum interference device and <sup>57</sup>Fe Mössbauer spectroscopy under external magnetic field. The combined theoretical and experimental results identify the main presence of FeN<sub>x</sub> moieties in Fe(II) low-spin and Fe(III) high-spin states while a minor fraction of sites could exist in Fe(II) S = 1 state. From the analysis of the <sup>57</sup>Fe Mössbauer spectrum under external magnetic field and the comparison of calculated and measured  $\Delta E_{QS}$  values, we assign the experimental doublet D1 with mean  $\Delta E_{\rm QS}$  value around 0.9 mm s<sup>-1</sup> to Fe(III)N<sub>4</sub>C<sub>12</sub> moieties in high spin and the experimental doublet D2 with mean  $\Delta E_{OS}$  value around 2.3 mm s<sup>-1</sup> to Fe(II)N<sub>4</sub>C<sub>10</sub> moieties in low and medium spin. These conclusions indicate that D1 corresponds to surface-exposed sites while D2 may correspond either to bulk sites that are inaccessible to O2 or to surface sites that bind O<sub>2</sub> weaker than D1.

#### Keywords

Density functional theory, Mössbauer spectroscopy, quadrupole energy splitting, FeN<sub>4</sub>, Fe-N-C, oxygen reduction, fuel cell, cathode

#### 1. Introduction

<sup>57</sup>Fe Mössbauer spectroscopy, based on the recoil-free emission and resonant absorption of  $\gamma$ rays, has been extensively used to fingerprint the local electronic structure, magnetic properties and coordination of iron nuclei in different classes of important materials ranging from (extra) terrestrial minerals and biomolecules containing Fe in their active site, to industrial catalysts such as those used for Fischer-Tropsch or ammonia synthesis.<sup>1-4</sup> More recently, it has gained growing importance in the characterization of novel platinum-free catalysts for application in fuel cell cathodes for the identification of Fe-based species present in pyrolyzed Fe-N-C catalysts.<sup>5-17</sup>. Due to their synthetic approach involving a high temperature treatment, such catalysts often comprise a plurality of Fe-based structures, including not only different coordination geometries of atomically-dispersed Fe ions covalently bound to the nitrogen-doped carbon matrix (FeN<sub>x</sub>C<sub>y</sub> moieties), but also metallic iron and iron carbides with long-range order. Compared to other spectroscopic methods and to X-ray absorption in particular, <sup>57</sup>Fe Mössbauer spectroscopy allows an easier separation of the signals arising from the different Fe environments. Namely, for spectra recorded in the absence of a strong external magnetic field, metallic iron and iron carbides result in sextets (except for the paramagnetic  $\gamma$ -Fe structure, leading to a singlet) while the fingerprint of FeN<sub>x</sub>C<sub>v</sub> moieties is a quadrupole doublet. Its two Mössbauer parameters are the isomer shift ( $\delta$ ) and the quadrupole splitting energy ( $\Delta E_{OS}$ ).<sup>18-20</sup> These two parameters originate from hyperfine interactions between the iron nucleus and the surrounding electronic environment, and vary therefore with the iron oxidation state, spin state, and its chemical surrounding.<sup>21</sup>

Due to the clear different shape and Mössbauer parameters of the spectral signals arising from different Fe structures, the fitting of the experimental spectrum of any Fe-N-C catalyst with a number of spectral components (singlets, doublets and sextets) is usually relatively straightforward and gives direct quantitative information on the fraction of Fe present in different forms. However, while the spectral parameters found for the singlet and sextet components identified in the spectra of pyrolyzed Fe-N-C catalysts perfectly match with those known for the well-established Fe crystalline structures (metallic Fe, Fe carbides, Fe nitrides), leading to unambiguous assignments, the interpretation of the spectral parameters fitted for the doublets in such materials have so far lacked strong bases, both from the experimental and theoretical sides. The lack of appropriate reference materials (materials with a single type of  $FeN_xC_y$  moieties in a carbon matrix, with the local structure around Fe atoms being

independently determined) prohibits making unambiguous assignments on the experimental side. The Mössbauer spectral parameters of some Fe macrocycles with known structure (iron phthalocyanines and porphyrins, pure or adsorbed on carbon surfaces) have hitherto been used to make assignments of the various doublets typically observed in pyrolyzed Fe-N-C materials to ferrous or ferric iron in different spin states.<sup>6</sup> The assumption that such macrocycles may serve as proper models for all or some of the FeN<sub>x</sub>C<sub>y</sub> moieties present in pyrolyzed Fe-N-C materials is however too speculative, for several reasons. First, the size of these reference molecules is much smaller than the average in-plane size of graphitic crystallites in pyrolyzed Fe-N-C materials (typically 2 nm and above). Second, such macrocycles with FeN4 core moiety involve pyrrolic nitrogen atoms engaged in fivemembered rings, while perfectly graphitized materials comprise only six-membered hexagonal rings. Experimental proof for the existence of atomically-dispersed Fe atoms in a nitrogen-doped carbon matrix has recently been confirmed by high-resolution electron microscopy, both in amorphous carbons (comprising a significant fraction of non-hexagonal rings) and in perfectly ordered graphene sheets (comprising only hexagonal rings).<sup>22-23</sup> Moreover, even for an Fe-N-C model catalyst with amorphous carbon matrix and comprising only atomically-dispersed Fe atoms and whose XANES and EXAFS spectra could be fitted with a single porphyrinic (FeN<sub>4</sub>C<sub>12</sub>) structure, the fitting of its Mössbauer spectrum still required two distinct doublets, at least.<sup>10</sup> Third, the FeN<sub>x</sub>C<sub>y</sub> moieties in pyrolyzed materials are integrated in a conductive carbon matrix, which may completely change the electron density at the Fe nucleus relative to an adsorbed Fe macrocycle, even for a similar local coordination. As discussed below, the electron-density at the Fe nucleus is a key in determining the spectral Mössbauer parameters. Hitherto, all pyrolyzed Fe-N-C catalysts comprising FeN<sub>x</sub>C<sub>y</sub> moieties have shown at least two distinct doublets in their Mössbauer spectra, often labeled D1 and D2. Their reported values of  $\Delta E_{OS}$  at room temperature are in the range of 0.90-1.25 and 2.0-2.8 mm  $\cdot$  s<sup>-1</sup>, respectively, while their isomer shifts are comparable and non-discriminating (0.30-0.45 mm·s<sup>-1</sup>).<sup>24</sup> The doublet D1 has, most frequently, been empirically assigned to an Fe(II) zero spin (S=0) moiety,<sup>6, 9</sup> but also sometime to Fe(III) in high spin (S=5/2).<sup>5, 8</sup> The doublet D2 has been empirically assigned either to an distorted Fe(II) moiety in low spin, Fe(II) medium spin (S=1), Fe(III) low spin (S=1/2) or Fe(III) medium spin (S=3/2) moiety.<sup>6, 8-9</sup> These empirical attributions are however not yet supported by any theory or independent experimental method. This uncertainty casts a doubt on past interpretation of the <sup>57</sup>Fe Mössbauer spectra of such materials and on structureproperty correlations, such as activity or selectivity with respect to the fraction or absolute content of a given doublet component.

For all the reasons discussed above, it appears obvious that the detailed analysis of the <sup>57</sup>Fe Mössbauer spectra of Fe-N-C materials cannot lean only on the experimental spectra of known macrocycles and that a complementary theoretical approach is required to interpret the Mössbauer spectra of such materials. No theoretical study has hitherto focused on predicting the two Mössbauer spectral parameters of FeN<sub>x</sub>C<sub>y</sub> moieties in such materials. The first parameter, the isomer shift,  $\delta$ , is in the specific case of <sup>57</sup>Fe inversely proportional to the density of s-electrons at the absorbing nucleus. It can be computed from a molecular orbital method and reported relative to the isomer shift of a reference compound<sup>25-28</sup>. In this work, we focused our DFT efforts in calculating  $\Delta E_{OS}$ , while methodologies to calculate  $\delta$  were not investigated, due to the non-discriminating values of  $\delta$  for the experimental doublets D1 and D2 in Fe-N-C catalysts. The second parameter,  $\Delta E_{QS}$ , can be computed from the nuclear quadrupole moment and the electric field gradient at the absorbing <sup>57</sup>Fe nucleus. In recent years, calculation of the  $\delta$  and  $\Delta E_{OS}$  values for several Fe coordination geometries have become straightforward with computer programs based on the Quantum Chemistry Density Functional Theory (DFT), using either localized molecular orbital (cluster)<sup>27-38</sup> or periodic approaches<sup>39-41</sup>. Despite the apparent easiness of calculating values of  $\delta$  and  $\Delta E_{OS}$ , the use of DFT as a tool for experimental spectral interpretation is hampered by the strong dependence of the calculated values for  $\delta$  and, in particular, for  $\Delta E_{OS}$  on (i) the DFT exchange-correlation (XC) functional and (ii) the chosen parameterized set of wave functions (basis set)<sup>29-38, 40</sup>. Recent DFT studies proposed different combinations of functionals and bases in order to achieve good agreement between experimental and computed Mössbauer parameters in ferrocene<sup>29</sup>, Fe-porphyrin<sup>32</sup>, β-diketiminate<sup>31</sup> derivatives and other iron complexes.<sup>33, 35-36, 38</sup> Failures of DFT to reproduce the experimental  $\Delta E_{OS}$  values were reported for other compounds.<sup>33-35, 38</sup> A study on computed results obtained for a unique Fe coordination but resorting to eight different XC functionals and two basis sets revealed that the mean error between computed and experimental  $\Delta E_{OS}$  was 0.2 mm·s<sup>-1</sup> for  $\Delta E_{OS} < 2$  mm·s<sup>-1</sup>, and 0.4 mm·s<sup>-1</sup> <sup>1</sup> for  $\Delta E_{OS} > 2 \text{mm} \cdot \text{s}^{-1}$ , excluding obvious outliers cases<sup>30</sup>. While no particular issues arise with zero-spin iron entities (S=0), more difficulties may be found in the case of degenerate ground states, or closely spaced low-lying energy states of medium (S=1) or high spin (S=2) iron complexes with square-planar coordination<sup>30, 33</sup>. Other sources of error that have been pointed out are, *e.g.* the adequacy of the geometrical model or the quality of the optimized structures as cluster or extended periodic structures.  $^{31, 33, 40}$ 

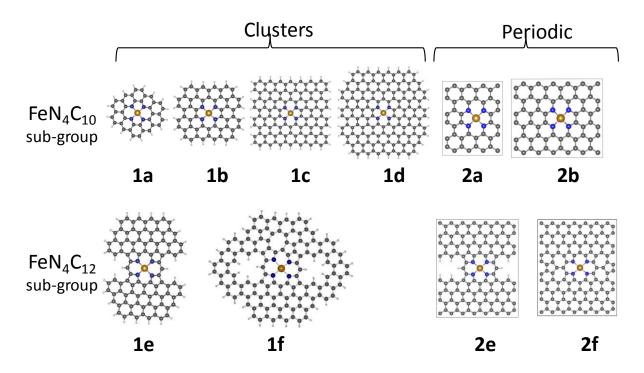
The first object of this study is to explore the ability of DFT methodologies to predict  $\Delta E_{QS}$  values for a range of hypothetical FeN<sub>4</sub> structures with different cluster size, metal-oxidation and spin state. For this purpose, the two most accepted sub-families of ORR-active FeN<sub>4</sub>-moieties present in pyrolyzed Fe-N-C materials were modeled, namely the FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> sub-groups<sup>10, 22, 42</sup>. The results of this theoretical study are then combined with the experimental Mössbauer data recorded for a well-defined Fe-N-C catalyst containing only atomically-dispersed iron species. To better discriminate the spin state and oxidation state of iron moieties, the catalyst was characterized also by Mössbauer spectroscopy in the presence of an external magnetic field, superconducting quantum interference device (SQUID) and electron paramagnetic resonance (EPR).

Mössbauer spectroscopy in the presence of an external magnetic field unambiguously reveals the major presence of low-spin ferrous centers accompanied by high-spin ferric centers in the Fe-N-C catalyst. The presence of high-spin ferric centers is independently supported by EPR measurements. Combined with the theoretical insights, we are able to conclude that the identified high-spin ferric signal can be assigned to Fe(III)N<sub>4</sub>C<sub>12</sub> porphyrinic moieties, corresponding to the experimental doublet D1 ( $\Delta E_{QS}$  in the range 0.6-1.3 mm·s<sup>-1</sup>). The lowspin ferrous signal is assigned to Fe(II)N<sub>4</sub>C<sub>10</sub> pyridinic moieties, corresponding to the experimental doublet D2 ( $\Delta E_{QS}$  in the range 1.7-3.1 mm·s<sup>-1</sup>). A minor fraction of the Mössbauer signal with  $\Delta E_{QS}$  values falling in the intermediate region situated between 1.3 and 1.7 mm·s<sup>-1</sup> is ambiguous and may be assigned either to high-spin ferric moieties (Fe(III)N<sub>4</sub>C<sub>10</sub>) or low-spin ferrous moieties (Fe(II)N<sub>4</sub>C<sub>12</sub>). The combination of the present DFT study with experimental <sup>57</sup>Fe Mössbauer spectroscopy under external magnetic field and other independent methods therefore leads to a detailed and rational interpretation of the spectroscopic signatures and electronic states of FeN<sub>x</sub>C<sub>y</sub> moieties in Fe-N-C materials.

#### 2. Computational and Experimental Methods

#### **2.1 Computational Method**

DFT calculations were carried out with the cluster and periodic approaches using, respectively,  $deMon2k^{43}$  and  $VASP^{44\cdot47}$  computer programs on graphene sheets integrating various moieties from the FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> sub-groups (Figure 1).



**Figure 1.**Cluster and periodic ferrous models of  $FeN_4C_y$  (y = 10 or 12) moieties considered in this work as representative Fe sites in Fe-N-C materials. The optimized structures at PBE/DZVP2 (1a-1f) and PBE-PBC (2a,b,e,f) level of theory are presented. See text for the differences in the optimized geometry parameters with the other methods. The atomic color code is the following: brown for Fe; blue for N; dark grey for C, light grey for H.

The ferrous FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> clusters are modeled, respectively, with **1a** - **1d** and **1e** -**1f** in Figure 1. The dangling bonds in all clusters and also in the periodic 2e system were saturated with hydrogen atoms. To model the respective ferric moieties, OH<sup>-</sup> is adsorbed in *end-on* mode on the ferric site in order to preserve the electric-charge neutrality. The resulting OH<sup>-</sup>Fe(III)N<sub>4</sub>C<sub>y</sub> moieties (labeled *e.g.* as **1a-OH**) are exemplified in Figure S1. The electrons in the C, N and H atoms are described by triple- $\zeta$  basis sets<sup>48</sup>. For the iron electrons we examined the performance of the double- $\zeta$  plus polarization<sup>48</sup> and the original Wachter's<sup>49</sup> bases, contracted to (62111111/331211/3111). Three generalized gradient corrected (GGA) exchange-correlation functionals were tested: (1) the revised Perdew–Burke–Ernzerhof's

exchange<sup>50-51</sup> and the Lee, Yang and Parr correlation<sup>52</sup> (rPBE-LYP); (2) the Perdew–Burke–Ernzerhof's exchange-correlation (PBE) and (3) the OPTX exchange of Handy and Cohen<sup>53</sup> coupled to the Lee, Yang and Parr correlation<sup>52</sup> (OLYP). The geometries of the clusters **1a** and **1e** were fully optimized at every level of theory. Larger models (clusters **1b-1d**, **1f**) up to the size of the experimental graphitic crystallites in high surface-area Fe-N-C materials (~2 nm) were fully optimized with rPBE-LYP/DZVP2, PBE/DZVP2 and PBE/Wachter's. No symmetry constraints were imposed. In deMon2k code, automatically generated auxiliary functions up to 1 = 2 (for the metal atom) and 3 (for H, C and O atoms) were used for fitting the density with the GGA functionals.<sup>54</sup> The GGA functionals were also coupled to an empirical dispersion (D) term.<sup>55</sup> A quasi-Newton method in internal redundant coordinates with analytical energy gradients was used for structure optimization. For the numerical integrations of the XC energy and potential, we used an adaptive grid with tighten threshold (10<sup>-8</sup> a.u.).<sup>56</sup> The convergence was based on the Cartesian gradient and displacement vectors with thresholds of 10<sup>-3</sup> a.u. and the energy convergence was set to 10<sup>-7</sup> a.u.

DFT calculations with periodic boundary conditions, carried out with VASP code, used the models 1a and 1e to build the unit cells. In the case of model 1a, two unit cells were considered; one with the size of 9.94 Å x 12.64 Å and the other 14.78 Å x 12.80 Å (models 2a and 2b in Figure 1, respectively). In the case of the cluster model 1e, the corresponding periodic structure was modeled using either a cell size 17.18 Å x 20.87 Å (model **2e**) or 17.17 Å x 21.0Å (model **2f**). Vacuum region of 15 Å was introduced in the z-direction in order to eliminate interactions between the graphene sheet and its periodic images. All the DFT calculations with periodic boundary conditions (PBC) were performed using generalized gradient approximation (GGA) with PBE exchange-correlation functional<sup>50</sup> and VASP 5.2 recommended GW projector augmented-wave pseudopotentials.<sup>57-58</sup> For Fe pseudopotential that treats 3s and 3p states as valence states was used. Electric field gradients at the positions of the Fe nuclei were calculated using the method reported in reference<sup>39</sup> as implemented in VASP. To obtain electric field gradients cut-off energy for the plane wave basis set of 800 eV, break condition for electronic SC-loop of  $10^{-6}$  eV and 8x8x1 gamma centered mesh were used for the model 2a and 4x4x1 mesh for the model 2b and 2e-2f. In all cases, the Fermi-Dirac smearing method with sigma set to 0.03 was used. In addition, all the calculations included support grid for the evaluation of the augmentation charges.

The quadrupole splitting energy is computed as the coupling between the nuclear quadrupole moment (*Q*) of the non-spherical nucleus and the principal components  $V_{ii}(i = x, y, z)$  of the electric field gradient (EFG) tensor at <sup>57</sup>Fe nucleus using the equation:

$$\Delta E_Q = \frac{1}{2} e Q V_{ZZ} \sqrt{1 + \frac{\eta^2}{3}} \tag{1}$$

In the  $\Delta E_Q$  equation, *e* is the charge of the electron and the asymmetry parameter  $\eta$  is computed as  $\eta = (V_{xx} - V_{yy})/V_{zz}$ , where  $|V_{zz}| \ge |V_{yy}| \ge V_{xx}$ . The nuclear quadrupole moment, *Q*, for the *J*=3/2 state is taken to be 0.16 barn. Computation of  $\Delta E_Q$  and  $\eta$  therefore becomes a question of computing the EFG tensor, which is readily obtained as an expectation

value of the EFG operator,  $V_{ij} = \left\langle \Psi_0 \left| \frac{3ij - r^2}{r^5} \right| \Psi_0 \right\rangle$ , for the electronic ground state  $\Psi_0$  and i, j =

*x*,*y*,*z* being the components of the electron radius vector *r*. In the remainder, the calculated value of  $\Delta E_Q$  are reported in units of mm·s<sup>-1</sup> (labeled as  $\Delta E_{QS}$ ), for a direct comparison to experimentally reported values.

#### **2.2 Experimental Methods**

#### Synthesis of the Fe<sub>0.5</sub> -NC catalyst

The Fe-N-C catalyst, labelled  $Fe_{0.5}$ -NC, was prepared from  $Fe^{II}$  acetate, 1,10-phenanthroline and a  $Zn^{II}$  zeolitic imidazolate framework (ZIF-8 with formula  $ZnN_4C_8H_{12}$ , purchased from BASF under trademark Basolite Z1200). One gram of a catalyst precursor containing 0.5 wt% Fe with a mass-ratio phen/ZIF-8 of 20/80 was prepared by dry ball-milling. The milling was carried out in a  $ZrO_2$  crucible with 100  $ZrO_2$  balls of 5 mm diameter using a planetary ballmiller (FRITSCH Pulverisette 7 Premium) for 4 cycles of 30 min at 400 rpm. The resulting catalyst precursor was then pyrolyzed at 1050 °C in Ar for 1 h, leading to Fe<sub>0.5</sub>-NC. This synthesis has been previously shown by Mössbauer spectroscopy and XANES-EXAFS to result in an ORR-active catalyst that comprise only atomically-dispersed FeN<sub>x</sub>C<sub>y</sub> moieties.<sup>10</sup> A reference sample free of iron or only with trace iron, labelled NC, was prepared identically as Fe<sub>0.5</sub>-NC except that no Fe<sup>II</sup> acetate was added in the catalyst precursor.

#### Measurement of the Mössbauer spectra

 $^{57}$ Fe Mössbauer spectra of Fe<sub>0.5</sub>-NC were measured with a  $^{57}$ Co:Rh source kept at ambient temperature (294 K). Spectra in the absence of external magnetic field were collected with the

absorber at variable temperatures in the range 5.5-296 K using a Janis CCR 5 K cryostat. Additional measurements were performed in the presence of an external magnetic field applied either parallel or perpendicular to the  $\gamma$ -rays with the absorber at 4.5 K on a strong-field Mössbauer spectrometer equipped with an Oxford Instruments Spectromag 4000 cryostat containing an 8 T split-pair superconducting magnet. Both spectrometers were operated with a triangular velocity waveform, in a constant acceleration mode in transmission geometry, and were calibrated at 295 K with an  $\alpha$ -iron foil. The isomer shift scale is referred to metallic  $\alpha$ -Fe at room temperature.

#### Analysis of the Mössbauer spectra

The broadened quadrupole components of the Mössbauer spectra measured in the absence of a magnetic field were fitted with appropriate superposition of Lorentzian lines (fixed linewidth of 0.25 mm·s<sup>-1</sup>), assuming Gaussian distributions of the electric quadrupole interaction for each spectral component. Up to three independent components were sometimes necessary to fit coherently the series of spectra acquired on Fe<sub>0.5</sub>-NC at different temperatures.

In order to fit the complex experimental spectra observed in the presence of an external magnetic field (shown later), simple histogram distributions of magnetic sextets with hyperfine fields up to 50 T were employed. Mössbauer spectra of the same Fe-N-C sample measured with a magnetic field applied parallel or perpendicular to the gamma rays were fitted simultaneously with a single distribution of hyperfine fields. For each hyperfine field considered in the distribution, the only difference being theoretically expected when changing from a parallel to a perpendicular external magnetic field is the relative intensity of the six Mössbauer lines, which is 3:0:1:1:0:3 or 3:4:1:1:4:3, respectively, for the lines 1 to 6, as labelled from the lowest to the highest position of the lines on the x-axis velocity range of Mössbauer spectra. Therefore, during the fitting, only the relative intensity of the lines 2 and 5 were fitted as a function of the direction of the external magnetic field, since it is known that the relative intensity of the lines 1, 3, 4 and 6 do not vary with the direction of the external magnetic field. As will be shown later, this fitting approach can however not result in a perfect fit in all regions of the spectra, since species characterized by low magnetic fields and high quadrupole splittings, the quadrupole interaction cannot be physically treated as a perturbation of the Zeeman magnetic interaction, and thus the Mössbauer components cannot be rigorously fitted simply using magnetic sextets.<sup>59</sup>

#### **SQUID characterisation**

The molar magnetic susceptibility  $\chi_m$  was measured from 2 to 300 K for Fe<sub>0.5</sub>-NC and NC with a Superconducting QUantum Interference Device (SQUID) (MPMS XL-7T, Quantum Design) at a magnetic field of 5,000 Oe. A mass of 16 mg of powder sample was introduced in a polymer straw. The average effective magnetic moment of iron atoms ( $\mu_{eff}$ ) was then obtained by fitting the plot of  $1/\chi_m$  (in mol of iron atoms per emu) vs. 1/T with a linear law.

#### **Electron paramagnetic resonance (EPR)**

EPR spectra were acquired at 9.65 GHz. A few mg of the sample  $Fe_{0.5}$ -NC was introduced in a glass capillary. The spectra were acquired at 10 K for different power/amplitude ratios. The optimum power and amplitude were found to be 3 mW and 0.3 mT, respectively.

#### 3. Results

#### 3.1. Theoretical study

We first discuss the impact of various exchange correlation functionals and basis sets on calculated values of  $\Delta E_{QS}$ . This analysis is carried out for two ferrous moieties representative for the FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> sub-groups. Subsequently, the effects of the cluster size and iron oxidation state on  $\Delta E_{QS}$  are investigated and discussed.

#### Effect of exchange-correlation functionals and basis sets on calculated values of $\Delta E_{OS}$

In this section, we focus on the smallest **1a** and **1e** clusters and their periodic **2a** and **2e**,**f** analogs, with Fe in oxidation state II, in low or medium spin state. The high spin state S = 2 was not considered since it is well known to result in an isomer shift  $\geq 0.9 \text{ mm} \text{ s}^{-1}$ ,<sup>60</sup> a value that has never been unambiguously experimentally observed in pyrolyzed Fe-N-C catalysts hitherto<sup>6</sup>. Note that the geometries were optimized without imposing any broken D<sub>4h</sub> symmetry.<sup>10</sup> All the DFT methods reveal that the electronic state with spin S = 0 is slightly less favored from an energy viewpoint, as follows from the positive values of the relative energy,  $\Delta E_{S=0}$ , in Table 1. In the cluster calculations of  $\Delta E_{QS}$ , the closed-shell electronic structures (S = 0) have a relatively low sensitivity toward a particular DFT method. For the **1a** cluster,  $\Delta E_{QS}$  is in the range 2.4-3.1 mm s<sup>-1</sup> (Table 1, row No. 1-6) and for cluster **1e** in the range 1.6-2.0 mm s<sup>-1</sup> (row No. 8-13). The differences between  $\Delta E_{QS}$  values obtained with the three functionals for a given basis set is within 0.4 mm s<sup>-1</sup>, and between the two bases for a given functional is within 0.3 mm s<sup>-1</sup>. Accepting that differences of 0.4 mm s<sup>-1</sup> for  $\Delta E_{QS} \ge 2$ 

mm·s<sup>-1</sup> and 0.2 mm·s<sup>-1</sup> for  $\Delta E_{QS} \leq 2 \text{ mm·s}^{-1}$  are within the computational error,<sup>30</sup> we conclude on a good agreement between the different methods in calculated  $\Delta E_{QS}$  values for the low-spin clusters. A good agreement is also observed between the low-spin cluster and periodic (PBE/PBC) approaches (*e.g.* for structure **2a**, compare row No. 7 to rows 1-6).

In contrast, for the open-shell cluster structures (S = 1), the distribution of  $\Delta E_{QS}$  values is significantly larger. In the **1a** cluster,  $\Delta E_{QS}$  varies between 1.5 and 3.3 mm·s<sup>-1</sup> (Table 1, row No. 1-6) while  $\Delta E_{QS}$  in the corresponding periodic structure **2a** is 3.3 mm·s<sup>-1</sup> (row 7). In the medium-spin **1e** cluster (FeN<sub>4</sub>C<sub>12</sub>),  $\Delta E_{QS}$  varies between 0.1 and 1.6 mm·s<sup>-1</sup> (rows 8-13) while  $\Delta E_{QS}$  in the periodic structures **2e-2f** is 1.8 mm·s<sup>-1</sup> (rows 14-15). The main outliers are however obtained with rPBE-LYP functionals (rows 1-2; 8-9), whereas the other two functionals (PBE and OLYP) result in much closer  $\Delta E_{QS}$  values (row No. 3-6 and 10-13). The PBE and OLYP functionals with the DZVP2 basis set result in an excellent agreement of  $\Delta E_{QS}$  with the periodic approach, in the range of 2.9-3.3 mm·s<sup>-1</sup> for models **1a** and **2a** (row No. 3, 5, 7) and in the range of 1.6-1.8 mm·s<sup>-1</sup> for models **1e** and **2e-2f** (row No. 10, 12, 14-15).

**Table 1.** Quadrupole splitting energy  $\Delta E_{QS}$  (in mm·s<sup>-1</sup>) and relative energy  $\Delta E$  (in eV) computed with three DFT-GGA functionals and two basis sets for Fe(II)N<sub>4</sub>C<sub>10</sub>cluster(**1a**) and periodic (**2a**) models, and Fe(II)N<sub>4</sub>C<sub>12</sub> cluster (**1e**) and periodic (**2e** and **2f**) models. The models structures are shown in Figure 1. Low (S=0) and medium (S=1) spin states are considered. The relative energies are computed from the total energies ( $E_{tot}$ ) as  $\Delta E_{S=0} = E_{tot}(S=0) - E_{tot}(S=1)$ .

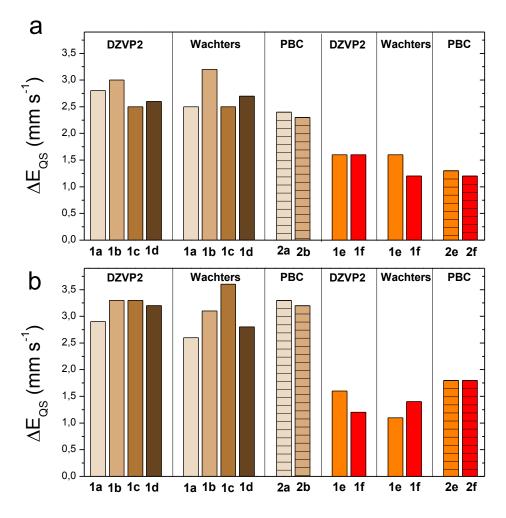
Row No.	Functional / Basis set	Model	$\Delta E_{ m QS}$	$\Delta E_{ m QS}$	$\Delta E_{\rm S=0}$
			(S = 0)	(S = 1)	
1	rPBE-LYP / DZVP2	1a	2.7	2.2	0.38
2	rPBE-LYP / Wachter's	1a	2.4	1.5	0.41
3	PBE / DZVP2	1a	2.8	2.9	0.64
4	PBE / Wachter's	1a	2.5	2.6	0.73
5	OLYP / DZVP2	1a	3.1	3.3	0.65
6	OLYP / Wachter's	1a	2.8	3.1	0.89
7	PBE-PBC (VASP)	2a	2.4	3.3	0.63
8	rPBE-LYP / DZVP2	1e	2.0	0.7	0.61
9	rPBE-LYP / Wachter's	1e	1.7	0.1	1.20
10	PBE / DZVP2	1e	1.6	1.6	0.73
11	PBE / Wachter's	1e	1.6	1.1	1.09
12	OLYP / DZVP2	1e	1.6	1.6	1.16
13	OLYP / Wachter's	1e	1.6	1.2	1.24
14	PBE-PBC (VASP)	2e	1.3	1.8	0.86
15	PBE-PBC (VASP)	2f	1.2	1.8	0.81

The larger discrepancy in the S = 1 state relative to low-spin state is not unexpected, since the EFG values depend on the ground-state electronic structure, namely on the occupation of the 3*d* orbitals of Fe<sup>33</sup>. The large  $\Delta E_{QS}$  differences seen for DFT methods in the medium-spin states are often attributed to the capability of a XC functional to yield the true ground-state

electronic structure in iron compounds<sup>29, 32-33</sup>. When the symmetry is not imposed, as in our calculations, the degeneracy of 3*d*-spin-orbitals is removed and the occupation of the 3*d* orbitals becomes highly dependent on the particular XC functional and on the chosen basis sets<sup>9,12</sup>. In the present study, this general finding is evidenced through the comparison of the occupation of the 3*d* orbitals below the Fermi level in cluster **1a** and periodic **2a** models (see Table S1). A significantly lower occupation of the  $dz^2$  orbital in cluster **1a** with rPBE-LYP/Wachters than that with all other functionals/basis sets is observed. On the other hand, these different Fe electronic states are in geometrically-equivalent structures (see supporting Tables S2-S3 and related text). Thus, we conclude that the larger discrepancy for S = 1 spin state is due to the difficult description of the occupation of the 3*d* orbitals, in agreement with previous theoretical studies<sup>29-38</sup>.

#### Influence of cluster size on calculated values of $\Delta E_{\rm QS}$

To gain understanding in the importance of the edge or in-plane location of the iron center in a graphene plane, we calculated  $\Delta E_{QS}$  for larger cluster sizes than those of structures **1a** and **1e**, up to 2.5 nm (models **1b,c,d** and **1f** in Figure 1). This value resembles the typical size of graphene crystallites in Fe-N-C materials<sup>61</sup>. Periodic boundary conditions were also imposed to the corresponding larger unit cells (models **2b** and **2f** in Figure 1) in order to evaluate the effect of the distance between two adjacent iron sites. The PBE functional was chosen because it performs similarly to OLYP and is also used in the periodic computations. The changes of  $\Delta E_{QS}$  values with cluster size are depicted in Figure 2 while the exact values are reported in Table S4.



**Figure 2.** Quadrupole splitting energies,  $\Delta E_{QS}$ , as a function of cluster size, **1a-1f**, and unit cells, **2a-2b,2f**, of FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> ferrous models with low (S = 0) spin (Fig. 2a) and medium (S = 1) spin (Fig. 2b). The results are obtained with PBE functional in the periodic (PBC) and cluster (with DZVP2 or Wachters basis) approaches. Columns for periodic approaches are hatched.

The magnitude of changes in  $\Delta E_{QS}$  with cluster size is close to the computational error bar for the FeN<sub>4</sub>C<sub>10</sub> (0.4 mm·s<sup>-1</sup>) and FeN<sub>4</sub>C<sub>12</sub> groups (0.2 mm·s<sup>-1</sup>), and only slightly above the error bar for few cases. This finding correlates well with the very small changes in the Fe-N bond distances and N-Fe-N bond angles in models **1a** to **1d** (Table S5). Indeed, the fluctuation of the bond distances with cluster size is restrained to a maximum of 0.05 Å for all considered methods and spin states. Regarding bond angles, for S = 0, the trends with cluster size from **1a** to **1d** are similar with the PBE/Wachters and PBE/DZVP2 methods, showing a reduced spreading of the four N<sub>i</sub>-Fe-N<sub>j</sub> bond angles relative to 90°. Thus, as the cluster size is increased, the FeN<sub>4</sub> core becomes closer to a D<sub>4h</sub> symmetry group. We also note that FeN<sub>4</sub>C<sub>12</sub> structures with hydrogen (**2e**) and without hydrogen (**2f**) in the third coordination sphere have a nearly identical  $\Delta E_{QS}$  (see Figure 2, two last columns). Therefore one may conclude that  $\Delta E_{QS}$  is mainly sensitive to the spatial arrangement of nitrogen and carbon atoms in the two first coordination spheres, while the ordering of atoms at longer distances negligibly impacts  $\Delta E_{QS}$ .

#### Effect of Fe oxidation state on calculated values of $\Delta E_{OS}$

Operando X-ray absorption spectroscopy studies systematically evidenced that pyrolyzed Fe-N-C catalysts contain a significant fraction of ferric moieties in their resting state,<sup>14</sup> including the model Fe-N-C catalyst further experimentally characterized in the present study<sup>10</sup>. Therefore, ferric clusters were considered, and modeled by adsorbing an hydroxide anion to Fe(III). The models are presented in Figure S1, labeled 1a-OH and 1d-OH (FeN<sub>4</sub>C<sub>10</sub>) and 1e-OH**OH** and **1f-OH** clusters (FeN<sub>4</sub> $C_{12}$ ). The quadrupole splitting energies are computed with the PBE and rPBE-LYP functionals. The latter was included because it resulted in the main outliers for the ferrous clusters 1a and 1e in medium spin (Table 1) and we wanted to examine its performance in the ferric compounds. Table 2 reports  $\Delta E_{OS}$  values and relative energies for these four clusters and two periodic models (2a-OH, and 2e-OH), at three different spin states. For each cluster, the agreement between the DFT methods is excellent (see rows 1-3; 4-5; 7-9; 10-11). The rPBE-LYP and PBE functionals, therefore, lead to similar results for ferric models, in contrast to the case with ferrous models. For the low-spin ferric structures, the three DFT methods agree well and give  $\Delta E_{QS}$  between 2.1-2.5 mm·s<sup>-1</sup> in **1a-OH**, **1d-OH**, **2a-OH** (FeN<sub>4</sub>C<sub>10</sub> sub-group) and  $\Delta E_{OS}$  between 1.8-2.1 mm·s<sup>-1</sup> in **1e-OH**, **1f-OH** and **2e-OH** (FeN<sub>4</sub>C<sub>12</sub> sub-group). However, the spread of the results is very large in the medium-spin state.  $\Delta E_{QS}$  values are between 0.9-2.5 mm·s<sup>-1</sup> in **1a-OH**, **1d-OH**, **2a-OH** and between 0.7-2.0 mm·s<sup>-1</sup> in **1e-OH**, **1f-OH** and **2e-OH**. In particular, the significant difference in the calculated  $\Delta E_{QS}$  value for the large 1d cluster (2.5 or 2.3 mm·s<sup>-1</sup>) and the periodic 2a model (1.1 mm·s<sup>-1</sup>) is surprising. For the high-spin state, the agreement for the 1a-OH and 1d-OH clusters is excellent but a discrepancy again occurs with the periodic 2a-OH model. While more restrained compared to the case with the medium spin-state, some spreading of the results remains among 1e-OH, 1f-OH and 2e-OH (porphyrinic sub-group), with  $\Delta E_{OS}$  values in the range of 0.6-1.1 mm  $\cdot$  s<sup>-1</sup>.

**Table 2.** Quadrupole splitting energy  $\Delta E_{QS}$  (in mm·s<sup>-1</sup>) and relative energy  $\Delta E$  (in eV) computed with two DFT-GGA functionals and two basis sets for Fe(III)N<sub>4</sub>C<sub>10</sub> and Fe(III)N<sub>4</sub>C<sub>12</sub> cluster and periodic models. The model structures are shown in Figure S1. Low (S=1/2), medium (S=3/2) and high (S=5/2) spin states are considered. The relative energies are computed from the total energies ( $E_{tot}$ ) as  $\Delta E_{n/2} = E_{tot}(S=n/2) - E_{tot}(S=1/2)$  with n=3/2 and 5/2.

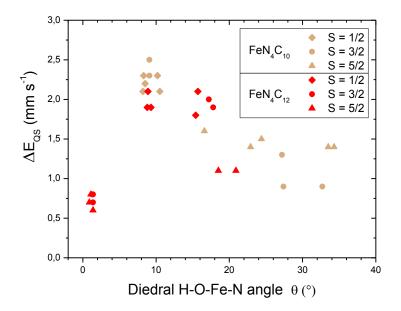
Row	Functional / Basis set	Model	$\Delta E_{QS}$	$\Delta E_{QS}$	$\Delta E_{QS}$	$\Delta E_{3/2}$	$\Delta E_{5/2}$
No.			(S = 1/2)	(S = 3/2)	(S = 5/2)		
1	rPBE-LYP / DZVP2	1a-OH	2.2	1.3	1.5	0.41	1.14
2	PBE / DZVP2	1a-OH	2.3	0.9	1.4	0.28	1.05
3	PBE / Wachter's	1a-OH	2.1	0.9	1.4	0.83	0.96
4	PBE / DZVP2	1d-OH	2.3	2.5	1.6	0.67	1.27
5	PBE / Wachter's	1d-OH	2.1	2.3	1.4	0.31	1.12
6	PBE-PBC (VASP)	2a-OH	2.5	1.1	0.7	0.30	0.70
7	rPBE-LYP / DZVP2	1e-OH	1.9	0.8	0.8	0.24	0.60
8	PBE / DZVP2	1e-OH	1.9	0.7	0.6	0.19	0.52
9	PBE / Wachter's	1e-OH	2.1	0.8	0.7	0.12	0.45
10	PBE / DZVP2	1f-OH	1.8	1.9	1.1	-0.03	0.14
11	PBE / Wachter's	1f-OH	2.1	2.0	1.1	0.02	0.21
12	PBE-PBC (VASP)	2e-OH	2.0	0.9	0.7	0.01	0.18

We therefore examined if OH adsorption led to distinct geometric changes as a function of the structural models and functional/basis set chosen, in particular for the ferric models in medium spin state. It is first noted that OH adsorption on Fe leads to a non-planar geometry. In all cases, Fe(III) is situated above the graphene plane by 0.2-0.3 Å (calculated, but not reported in Tables). The geometric parameters of the ferric FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> groups are reported in Tables S6 and S7, respectively. While the spreading of the Fe-N bond distances and N-Fe-N angles in the ferric models is larger than in the corresponding ferrous models, the structural disorder caused by the OH adsorption is comparable for all models (see for example

**1a-OH** and **1d-OH** in medium spin state in Table S6), Thus, the large  $\Delta E_{QS}$  differences obtained for **1a-OH** and **1d-OH** on one hand, and **1e-OH** and **1f-OH** on the other hand, cannot be attributed to the slight structural changes induced by OH-adsorption. In contrast, there might be a distinct OH orientation, depending on the model and spin-state, which could influence the electric field gradient components at the iron nucleus. Analyzing the minimum energy ferric structures, we could distinguish different OH orientations with respect to the N-Fe-N plane. This can be quantified through the dihedral H-O-Fe-N angle,  $\theta$ , which defines the angle between the H-O-Fe and the N-Fe-N planes (Figure S2). For O-H pointing above the N atom, the H-O-Fe-N dihedral angle is 0° and for O-H pointing above the N-Fe-N bisector, the H-O-Fe-N dihedral angle is ~45°, as exemplified in Figure S2. The calculated  $\theta$  values are summarized in Tables S6, S7.

For the ferric FeN<sub>4</sub>C<sub>10</sub> clusters in low-spin,  $\theta$  varies only between 8-11°, in line with the similar  $\Delta E_{QS}$  values calculated for all those structures. In contrast, in medium spin a large difference is observed for **1a-OH** and **1d-OH** models. The  $\theta$  values are between 27°-33° in **1a-OH** and 9° in **1d-OH**. The comparison with trends for  $\Delta E_{QS}$  values evidences a clear correlation between the  $\theta$  and  $\Delta E_{QS}$  values for these medium-spin ferric models. For the high spin models,  $\theta$  spans between 17 and 34°. We therefore identify an inverse correlation between  $\theta$  and  $\Delta E_{QS}$  for FeN<sub>4</sub>C<sub>10</sub> models in any spin state. Structures with  $\theta$  values between 8-11° have high  $\Delta E_{QS}$  in the range 2.0-2.5 mm·s<sup>-1</sup>, whereas those with larger  $\theta$  have low  $\Delta E_{QS}$  in the range 0.9-1.6 mm·s<sup>-1</sup>.

A correlation between OH orientation and  $\Delta E_{QS}$  is established also for the porphyrinic FeN<sub>4</sub>C<sub>12</sub> moieties (Table S7). In this case, the correlation between  $\theta$  and  $\Delta E_{QS}$  is seemingly inversed. The structures with low  $\theta$  (~1° in **1e-OH**, medium- and high-spin states) have low  $\Delta E_{QS}$  values between 0.6 - 0.8 mm·s<sup>-1</sup> and the structures with high  $\theta$  (~9-21° in **1e-OH**, low spin, and **in 1f-OH** in all spin states) have high  $\Delta E_{QS}$  values in the range 1.1 - 2.1 mm·s<sup>-1</sup>.



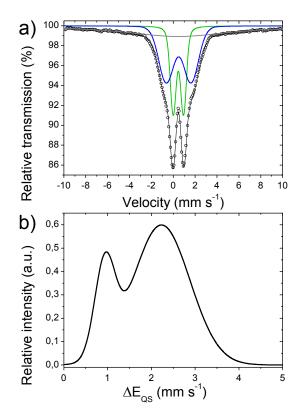
**Figure 3.** Calculated  $\Delta E_{QS}$  values for ferric moieties as a function of the dihedral O-H-Fe-N angle ( $\theta$ ) for the low, medium and high spin-states in the ferric FeN<sub>4</sub>C<sub>10</sub> (**1a-OH** and **1d-OH**) and FeN<sub>4</sub>C<sub>12</sub> (**1e-OH** and **1f-OH**) cluster models. The rPBE-LYP / DZVP2, PBE/DZVP2 and PBE/Wachters methods were used for cluster models, and PBE/PBC used for periodic models.

The trend of  $\Delta E_{QS}$  as a function of OH orientation for the three spin-states and all considered ferric structures is presented in Figure 3. Three distinct regions appear: (1) for  $\theta \approx 1$ ,  $\Delta E_{QS} < 1$  mm·s<sup>-1</sup>; (2) for ~8 <  $\theta$  < ~12°,  $\Delta E_{QS} > 1.8$  mm·s<sup>-1</sup> and (3) for  $\theta > ~12°$ ,  $\Delta E_{QS}$  linearly decreases from ~2 to 1 mm·s<sup>-1</sup> with increasing  $\theta$  from 12° to 35°. This graph unifies all the results for the ferric FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> models, demonstrating that the calculated  $\Delta E_{QS}$  value rather depends on the orientation of the OH group, and not much on the model geometry or spin state. For the spin 5/2, the calculated  $\theta$  is however always outside the 8 -12° region, leading to  $\Delta E_{QS}$  values in restricted ranges of 1.4-1.6 mm·s<sup>-1</sup> for FeN<sub>4</sub>C<sub>10</sub> clusters and 0.6-1.1 mm·s<sup>-1</sup> for FeN<sub>4</sub>C<sub>12</sub> clusters (Table 2). As we will see below, experimentally and for the ferric species, only the high-spin is unambiguously identified in Fe<sub>0.5</sub>-NC, which eases the assignments.

#### **3.2. Experimental results**

The experimental Mössbauer spectrum of  $Fe_{0.5}$ -NC recorded at 80 K, in the absence of external magnetic field, is shown in Figure 4a. The fitting was performed using two broad doublets with a Gaussian distribution of quadrupole splitting, and with an additional relaxed

component to take into account the large background signal. We initially suspected this broad signal to come from Fe oxide nanoparticles, but it was almost unmodified at low and high temperature (5 K and 296 K, Figure S3). This excludes its assignment as Fe oxide clusters, since such phases would show a sextet signal at 5 K and a doublet signal at 296 K. While the fitting shown in Figure 4a could also have been performed without Gaussian distribution of the quadrupole splitting, this would have led to unusually high linewidths for D1 and D2, typically 0.7 and 1.3 mm  $\cdot$  s<sup>-1</sup>, respectively, as reported by us for a similar catalyst, see Figure 1 and Table S1 in Ref. 10. We believe these high linewidths previously reported with such a simpler fitting approach arise from the electronic, chemical and structural disorder existing in pyrolyzed Fe-N-C catalysts. Here, we therefore opted for a fitting with a Gaussian distribution of quadrupole splittings, in order to more accurately compare all quadrupole splitting values experimentally observed to those calculated for a broad family of active sites. The results of the fitting are shown in Table S8. The two quadrupole doublet distributions have similar isomer shifts of 0.46 and 0.49  $\text{mm}\cdot\text{s}^{-1}$ , but are distinguished by their average quadrupole splittings, centered at 0.94 and 2.25 mm·s<sup>-1</sup> for D1 and D2, respectively. Such values are typically observed in Fe-N-C catalysts.<sup>5-10, 14-15, 24</sup> While these two doublets in pyrolyzed Fe-N-C materials were clearly correlated to FeN<sub>4</sub>-type moieties with the help of X-ray absorption spectroscopy and HR-TEM<sup>10, 14-15, 22-23, 62</sup> their experimental values of isomer shift and quadrupole splittings do not allow an unambiguous assignment to a specific oxidation state or spin state of iron in such moieties. The isomer shift is in the range expected for both Fe(II) moieties in low and medium spin state, and for Fe(III) moieties in any spin state.  $\Delta E_{OS}$  values in the range 0.8 to 1.5 mm  $\cdot$  s<sup>-1</sup> can be assigned either to Fe(II) S = 0 or Fe(III) S = 5/2 species (Figure 2.32 in Ref <sup>24</sup>). From this result, only Fe in high oxidation states above +III ( $\delta$  value  $\leq$ 0.3 mm s<sup>-1</sup>) and Fe(II) in high spin state (S = 2) can be excluded ( $\delta > 0.9$  mm s<sup>-1</sup>).<sup>21</sup> The exclusion of Fe in +IV or higher oxidation state is also and more clearly supported by XPS, showing only Fe in +II or +III oxidation states for atomically-dispersed Fe-N-C catalysts.



**Figure 4.** <sup>57</sup>Fe Mössbauer spectrum at 80 K of Fe<sub>0.5</sub>-NC measured in air in the absence of external magnetic field (Fig. 4a) and corresponding distribution of the quadrupole splitting (Fig. 4b). The doublets D1 and D2 (and their fitted distribution of  $\Delta E_{OS}$  values) are highlighted in green and blue, respectively.

In order to gain more insights on the spin state of moieties present in this catalyst, we first characterized Fe<sub>0.5</sub>-NC with EPR. Figure S4 shows the X-band EPR spectra for Fe<sub>0.5</sub>-NC and for the corresponding blank measurement (no catalyst in the tube). The signal at circa 160 mT (g=4.28) in Figure S4b can be unambiguously assigned to a rhombic S = 5/2 Fe(III) center.<sup>63</sup> The six lines at 300-370 mT are assigned to Mn impurities. No specific signal is observed for Fe(III) in other spin states, nor for Fe(II), which is a non-Kramer ion and is normally EPR-silent. This information facilitates the further analysis of the Mössbauer spectrum, since we now can assume that FeN<sub>4</sub> moieties are mainly present either as Fe(III) S = 5/2 high spin state, or as Fe(II) in the S = 0 or S = 1 spin states. The Fe(II) S = 2 state can be excluded, based on the above mentioned high isomer shift value expected for such a configuration, not experimentally observed.

The average molecular susceptibility of Fe<sub>0.5</sub>-NC was then measured by SQUID as a function of temperature (Figure S5a). The data could be fitted with a Curie-Weiss law, Eq. 2 (Figure S5b) with slightly negative  $\theta_{c}$ -value, corresponding to a weak antiferromagnetic coupling.

The constant C can be then further analyzed assuming two different types of Fe centers in Fe<sub>0.5</sub>-NC, knowing that their  $\chi$  values are additive, using Eqs. 2 and 3:

$$\chi_{m}^{-1} = (T - \theta_{C})/C$$

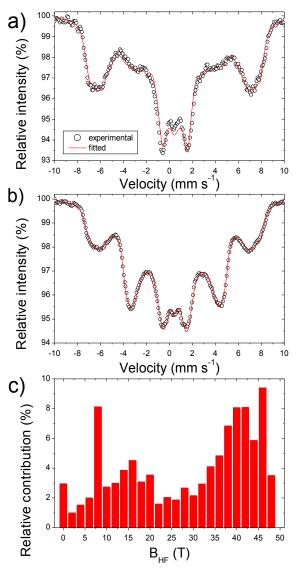
$$\mu_{eff}^{2} = \mu_{B}^{2} \left[ a_{1}(s_{1}^{2} + s_{1}) + a_{2}(s_{2}^{2} + s_{2}) \right]$$
(2)
(3)

where  $a_1$  and  $a_2$  are the molar fractions of Fe in the two types of sites,  $s_1$  and  $s_2$  are their corresponding spin states,  $\mu_{eff}$  the average effective magnetic moment of iron atoms. With the fitted value of constant C (2.566), the second term in Eq. 3 should be equal to 20.4 to match the experimental fitting. Assuming Fe<sub>0.5</sub>-NC contains a mix of iron centers with only Fe(II) in S = 0 state and Fe(III) in S = 5/2 state, the value of 20.4 is obtained with a relative fraction of 58% of high spin Fe(III). Assuming a mix of only Fe(II) in S = 1 state and Fe(III) S = 5/2 state, a match is obtained with a relative fraction of 46% high spin Fe(III). These results are consistent with the relative fraction from Mössbauer (Table S8), if one assumes that both D1 and the broad relaxation background are in high-spin ferric state, and D2 a ferrous center in zero-spin state.

To obtain further information on the spin state of the doublets D1 and D2, Mössbauer spectroscopy measurements were then performed in the presence of an external magnetic field. The behavior of the Mössbauer nuclei under an applied field is strongly dependent on their spin state. In the case of diamagnetic nuclei, *i.e.* with S = 0, the measured field is equal to the applied external field, whereas in the case of paramagnetic ions the effective measured field is equal to the applied field plus the hyperfine field which is created by the magnetization.<sup>59</sup> In the case of high spin Fe(III), due to the large magnetic moment corresponding to the S = 5/2 state, very high effective fields exceeding 50 T can be obtained. Figure 5 shows the spectra of Fe<sub>0.5</sub>-NC measured with an external magnetic field of 7 T applied either parallel or perpendicular to the  $\gamma$ -rays as well as the corresponding distribution of hyperfine magnetic fields obtained by the common fit of the two spectra. Interestingly, two maxima centered at about 7 T and 45 T are observed in the distribution. The second value unambiguously underlines the presence of high spin Fe(III), confirming both SQUID and EPR results. While hyperfine fields exceeding 50 T are commonly measured for slowly relaxing Fe(III) ions, the external magnetic field usually couples antiferromagnetically to the paramagnetic relaxation field, thus decreasing the observed value of the hyperfine field. This explains the strong signal observed at 45 T. On the other hand, the component centered around 7 T could derive from the presence of diamagnetic low spin Fe(II). In fact, a value of the hyperfine field equaling the value of the applied field is a rather clear sign of the presence of a diamagnetic ion, since no additional fields caused by the magnetization of unpaired electrons are experienced by the Fe ions.

It must also be said that the fit shown in Figure 5, obtained using a distribution of magnetic sextets, does not describe precisely the structure of the two spectra acquired at low values of external magnetic fields (not shown). This is not unexpected since, for low values of hyperfine field and relatively high values of quadrupole splitting, the quadrupole interaction cannot be treated anymore as a perturbation of the Zeeman effect caused by the magnetic field, and the full Hamiltonian including both interactions must be solved.<sup>64</sup> In this case, the experimental spectrum strongly depends upon the mutual orientation of the  $V_{zz}$  component of the EFG and of the magnetic field, which is virtually impossible to determine in such broadened multicomponent spectra. However, in the absence of a local magnetic moment on the absorbing ions, which are randomly oriented in the sample, one can assume a random orientation of the magnetic field with respect to the EFG.<sup>64</sup> The theoretical spectrum of such a system, calculated assuming a hyperfine field of 7 T and a EFG of 2.3 mm  $\cdot$  s<sup>-1</sup>  $(V_{zz} = 2.3 \text{ mm} \cdot \text{s}^{-1}, \eta = 0$ , simulating doublet D2 in the spectrum without applied external magnetic field), is shown in Figure S6. As it can be clearly seen, the features of the central part of the spectrum (central peak, slight asymmetry and intensity of the two central lines) correspond rather well to the calculated spectrum.

This detailed analysis of the Mössbauer spectrum under external magnetic field supports i) the presence of a substantial fraction of diamagnetic Fe(II) ions in the sample, with a EFG close to 2.3 mm·s<sup>-1</sup> and ii) its assignment to the experimentally observed D2 signal in the spectrum without applied external field. This in turn implies that D1 can, on the other hand, be assigned in majority to Fe(III)N<sub>4</sub> sites with high spin. In spite of these main attributions, the presence of other Fe sites in minor content cannot be excluded. If no additional signal typical of other Fe(III) sites in S = 3/2 or  $\frac{1}{2}$  states is detected by EPR, a minor amount of Fe(II) S =1 species cannot be experimentally excluded.



**Figure 5.** <sup>57</sup>Fe Mössbauer spectra of Fe<sub>0.5</sub>-NC measured at 4.5 K with an external magnetic field of 7 T applied in the direction a) parallel or b) perpendicular to the  $\gamma$ -rays, and c) the corresponding distribution of hyperfine fields from the common fit of the two spectra using a distribution of magnetic sextets (with a same isomer shift). The fits in a) and b) were obtained with the single distribution of hyperfine magnetic fields shown in c) (the common fitted isomer shift was  $\delta = 0.47 \text{ mm} \cdot \text{s}^{-1}$ ), and with line intensity ratios of 3:2x:1:1:2x:3 with fitted xvalues of 0.29 and 1.90 for the parallel and perpendicular field spectrum, respectively.

#### Discussion

To compare experimental and theoretical insights gained in this study, we focus here on the DFT results obtained on the **1a**, **1d**, **1e** and **1f** clusters with the PBE/DZVP2 and PBE/Wachters methods. The main conclusions would not be changed if all DFT results are considered, including those obtained with the periodic approaches. Figure 6 shows the calculated  $\Delta E_{QS}$  values for the above mentioned combinations of clusters and DFT methods, with the FeN<sub>4</sub> clusters in three possible combinations of oxidation and spin state, namely Fe(II) S = 0, Fe(II) S = 1 and Fe(III) S = 5/2. These combinations correspond to those identified as major (Fe(II) S = 0, and Fe(III) S = 5/2) or possible minor species (Fe(II) S = 1) for the present Fe-N-C catalyst by experimental Mössbauer spectroscopy, SQUID and EPR.

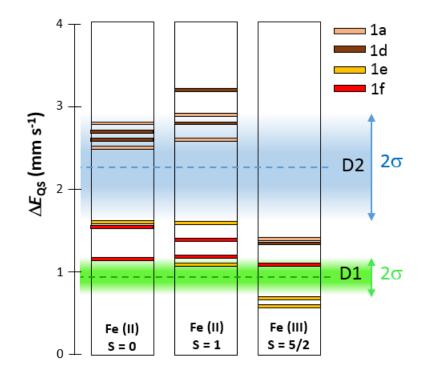


Figure 6. Comparison between DFT-calculated and measured quadrupole splittings for FeN<sub>x</sub> sites.  $\Delta E_{QS}$  values calculated with the PBE/DZVP2 and PBE/Wachters methods for the **1a**, **1d**, **1e** and **1f** clusters are presented. The green and blue areas correspond to the experimentally measured distribution of the doublets D1 and D2, and the dashed lines correspond to the center of the fitted Gaussian distribution for each of them (0.94 and 2.25 mm·s<sup>-1</sup> respectively). The colored D1 and D2 areas expand  $\sigma$  (where  $\sigma$  is their standard deviation, see Table S8) above and below the mean  $\Delta E_{QS}$  value fitted for D1 and D2, thereby representing 68% of the entire D1 and D2 signal fitted with the broad doublet Gaussian distribution in figure 4.

From the comparison of experimental and calculated  $\Delta E_{QS}$  values only, Figure 6 shows that the experimental doublet D1 can only be assigned to FeN<sub>4</sub>C<sub>12</sub> sites (1e and 1f clusters, represented by red and orange horizontal bars), but in any of the three above-mentioned oxidation/spin combinations. The center of the D1 distribution (0.94 mm·s<sup>-1</sup>, dashed green line) best corresponds however to  $Fe(III)N_4C_{12}$  sites (1e and 1f in Figure 6) with high spin. When considering periodic DFT calculations, it should be noted that high spin  $Fe(III)N_4C_{10}$ and Fe(III)N<sub>4</sub>C<sub>12</sub> have identical  $\Delta E_{OS}$  values (0.7 mm s<sup>-1</sup>), that can be assigned to the lower end of the D1 signal. All this supports the main assignment of D1 to Fe(III) S =5/2 moieties earlier in this work, that we derived from the analysis of the experimental Mössbauer spectrum under external magnetic field. The **1a** and **1d** clusters (FeN<sub>4</sub>C<sub>10</sub> sites) in Fe(III) S = 5/2 state fall in-between the D1 and D2 regions shown in Figure 6 and that correspond to the mean  $\Delta E_{QS}$  value of D1 and D2 ±  $\sigma$ , *i.e.* representing 68% of the total D1 and D2 signal as fitted in Figure 4a. Thus, they may contribute to the broadening of the D1 and D2 doublets in the region 1.2-1.4 mm s<sup>-1</sup>. The overlap in this region is clearly seen in the complete  $\Delta E_{QS}$ distributions for D1 and D2 shown in Figure 4b. In contrast, D2 can mostly be assigned to  $Fe(II)N_4C_{10}$  sites, in either S = 0 or S = 1 spin state. The center of the D2 distribution (2.25) mm  $\cdot$  s<sup>-1</sup>, dashed blue line) slightly better corresponds however to Fe(II)N<sub>4</sub>C<sub>10</sub> sites with low spin. This also supports the main assignment of D2 to Fe(II) S =0 moieties earlier in this work, that was derived from the analysis of the experimental Mössbauer spectrum under external magnetic field. We however do not exclude the presence of a minor content of Fe(II) S =1 sites, and such sites would, according to our DFT results, either clearly contribute to the D2 experimental signal (FeN<sub>4</sub>C<sub>10</sub> sites), or to D1 and the intermediate region overlapping D1 and D2 (FeN<sub>4</sub>C<sub>12</sub> sites), see Figure 6, central column.

It can thus be concluded from this comparison between calculated and experimental  $\Delta E_{QS}$  values, and from EPR, SQUID and from the analysis of the Mössbauer spectrum under external magnetic field, that the D1 and D2 experimental signals can mostly be assigned to Fe(III)N<sub>4</sub>C<sub>12</sub> sites with high spin and Fe(II)N<sub>4</sub>C<sub>10</sub> sites with low spin, respectively. Because of the high relative content of Fe(II) S = 0 and Fe(III) S = 5/2 species experimentally identified, and in view of Figure 6, it is difficult to propose other main assignments. For example, while from Figure 6 alone, D1 could be assigned mostly to Fe(II)N<sub>4</sub>C<sub>12</sub> sites with S = 0 and D2 mostly to Fe(II)N<sub>4</sub>C<sub>10</sub> sites with S = 1, there is then no main assignment for an Fe(III) S = 5/2 species. However, the latter is identified experimentally by Mössbauer under external

magnetic field and EPR, while SQUID also supports the presence of a high relative fraction of high spin ferric species.

These main assignments of D1 and D2 are important novel insights, and in strong contrast to previous empirical assignments of D1 and D2.<sup>5-10, 24</sup> It is here recalled that the ambiguity and lack of evidence of those previous assignments was generally recognized by those involved in the field. It also implies that the D1 signal must be located on the top surface of the carbon matrix, thereby accessible to gas-phase, leading to ferric species as soon as the sample is exposed to air. The D2 signal, assigned to ferrous species, may then be explained by the inaccessibility of such sites to the ambient air, *i.e.* such sites might be viewed as being buried underneath the surface, or on the surface but with weaker oxygen binding. These assignments are well supported by recent results obtained by Kneebone et al on the effect of NO adsorption on the Mössbauer spectrum of another Fe-N-C catalyst.<sup>65</sup> In that study, the doublet with lowest  $\Delta E_{OS}$  in the pristine catalyst ( $\Delta E_{OS} = 0.83 \text{ mm} \cdot \text{s}^{-1}$ ,  $\delta = 0.30 \text{ mm} \cdot \text{s}^{-1}$  and labelled D4 in that work but corresponding to D1 label in the present work) was found to explain most of the spectral changes observed upon the electrochemical reduction of the catalyst, and then upon NO adsorption on the surface ferrous sites. That study and the present one agree then in identifying the D1 signal in the Mössbauer spectrum of Fe-N-C catalysts exposed to air as a ferric, surface-located species, which can be reduced to ferrous form when the applied electrochemical potential is lower than that of the Fe(III)/Fe(II) redox couple of such FeN4 sites. The ferric state of D1 sites when exposed to air and their ability to be reduced to ferrous state when the electrochemical potential is lowered in the ORR range indicates that such sites are likely the ORR active sites in Fe-N-C catalysts. Again, this is supported by previous positive correlations between the absolute or relative amount of D1 signal and the ORR activity for different series of Fe-N-C catalysts obtained by varying one single experimental synthesis parameter (e.g. Fe content, pyrolysis duration, pyrolysis temperature, etc).9, 66 The assignment of the D1 signal to high-spin Fe(III)N<sub>4</sub>C<sub>12</sub> moieties is also in agreement with similar  $\Delta E_{OS}$  and  $\delta$  values as D1 observed for a monolayer coverage of Fe-phthalocyanine (FePc) on Vulcan carbon black ( $\Delta E_{QS} = 0.96$  and  $\delta = 0.40$ , Table 1 in Ref<sup>67</sup>. In that work, the author assigned this new doublet (different from that of crystalline FePc) to the binding of FePc to the carbon substrate through an oxygen atom of a carbon functional group. But it appears simpler now to assign this "new" spectral feature of FePc to the fact that all Fe centers in this monolayer coverage configuration are exposed to O<sub>2</sub> from ambient air, which is impossible in crystalline FePc. Following our thinking, the D2 signal in pyrolyzed Fe-N-C catalysts has similar Mössbauer parameters to bulk crystalline FePc ( $\Delta E_{QS} = 2.61$  and  $\delta =$ 0.39, Table 1 in  $^{67}$ . This supports the idea that D2 may be assigned either i) to similar FeN<sub>4</sub> sites as D1, but located in the bulk of the carbon matrix and thus inaccessible to the gas-phase (and the liquid electrolyte) impeding their oxidation by  $O_2$ , or ii) to FeN<sub>4</sub> surface sites with a Fe(III)/Fe(II) redox potential sufficiently high that their stable form is Fe(II), even when exposed to air in open circuit conditions. Last, the assignment of D1 to, mostly, a ferric high spin moiety is also in line with a recent study from Kramm's group, involving experimental <sup>57</sup>Fe Mössbauer spectroscopy at 5 K with and without perpendicular applied magnetic field, as well as EPR and nuclear inelastic spectroscopy.<sup>68</sup> The major presence of a high-spin ferric moiety (28 % of the absorption signal) was evidenced, and correlated with a doublet with  $\Delta E_{OS}$  of 1.0 mm s<sup>-1</sup> (Table 2 in that work), corresponding to our D1 component, while a doublet with even smaller  $\Delta E_{QS}$  value (0.72 mm s<sup>-1</sup>) was assigned to a ferrous low-spin moiety, but representing only 12 % of the absorption signal. This is coherent with our Figure 6, showing that porphyrinic moieties (1e-1f clusters) can result in low  $\Delta E_{QS}$  values of ca 1 mm s<sup>-1</sup> either in ferric high-spin or ferrous low spin states.

This work thus identifies D1 as surface sites which, combined with a precise measurement of the Fe bulk content and applying correct Lamb-Mössbauer factors for D1 and D2 and any other Fe species present in a given Fe-N-C catalyst,<sup>13</sup> can directly yield the absolute number of Fe(D1) surface sites. Due to the  $\Delta E_{QS}$  distribution within the broad D1 signal, it may however be that not all D1 sites are similarly active toward ORR, and some may be unstable, at least in acidic medium. Following the fate of D1 signal during electrochemical operation will be necessary to more closely connect it to the ORR activity after short break-in of the Fe-N-C electrode in electrolyte, and then also after longer operation in liquid-electrolyte or in fuel cell.

The experimental and theoretical methods reported here to study in detail  $FeN_x$  sites embedded in graphene for fuel cell application are also of interest for other electrochemical applications such as  $CO_2$  electro-reduction<sup>69</sup>, nitrite and nitric oxide electroreduction<sup>70</sup> but also for the broader field of heterogeneous catalysis, where similar sites have been reported to catalyze a range of interesting reactions for high added-value products.<sup>71-73</sup>

### Conclusions

- Calculated quadrupole splitting values for ferrous moieties (S = 0 or S = 1 spin state) clearly differentiate  $\text{FeN}_4C_{12}$  (< 1.8 mm·s<sup>-1</sup>) from  $\text{FeN}_4C_{10}$  moieties (> 2.4 mm·s<sup>-1</sup>)
- No significant effect of cluster size on calculated quadrupole splitting value for ferrous FeN<sub>4</sub>C<sub>y</sub> moieties (S = 0 or S = 1 spin state)
- Calculated quadrupole splitting value for ferric  $FeN_4C_y$  moieties in S = 3/2 spin state mainly depends on OH-orientation, less on model structure
- Calculated quadrupole splitting values for ferric moieties in S = 5/2 spin state weakly differentiate FeN<sub>4</sub>C<sub>12</sub> (< 1.2 mm·s<sup>-1</sup>) from FeN<sub>4</sub>C<sub>10</sub> moieties (> 1.3 mm·s<sup>-1</sup>)
- Experimental identification of the presence of Fe(II) S = 0 and Fe(III) S =5/2 centers in Fe-N-C catalyst with Mössbauer spectroscopy under strong external magnetic field, EPR and SQUID
- Assignment of experimental doublet 1 (with mean quadrupole splitting value at 0.94 mm·s<sup>-1</sup>) to mostly Fe(III)N<sub>4</sub>C<sub>12</sub> sites with S = 5/2 and of the doublet 2 (with mean quadrupole splitting value at 2.25 mm·s<sup>-1</sup>) to mostly Fe(II)N<sub>4</sub>C<sub>10</sub> sites with S = 0, through combined experimental and theoretical results
- Identification of experimental doublet 1 as  $FeN_x$  sites located on top surface and as a major contributor of ORR activity

## **Supporting information**

Examples of structures optimized with PBE/DZVP2 level of theory (Figure S1), table of population of orbitals for 1a and 2a ferrous models in S = 1 spin state (Table S1) and their structural parameters for S = 0 and S = 1 (Table S2), table of structural parameters for ferrous 1e and 2e models for S = 0 and S = 1 optimized with different DFT methods (Table S3), effect of cluster size on quadrupole splitting, relative energies and structural parameters for ferrous models (Table S4-S5), scheme of possible OH orientation on a ferric FeN<sub>4</sub>C<sub>y</sub> model site (Figure S2), structural parameters of ferric FeN<sub>4</sub>C<sub>10</sub> and FeN<sub>4</sub>C<sub>12</sub> clusters for different spin states and with different DFT methods (Table S6-S7), results of fitting of experimental Mössbauer spectra (Table S8), effect of temperature on Mössbauer spectra (Figure S3), X-band EPR spectra (Figure S4), SQUID measurement (Figure S5), experimental Mössbauer spectra with external magnetic field applied parallel or perpendicular to  $\gamma$ -rays and theoretical simulation for randomly oriented Fe(II) ions creating a quadrupole splitting of 2.3 mm s<sup>-1</sup> (Figure S6),

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