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## 2 Niobium speciation in minerals revealed by *L*<sub>2,3</sub>-edges XANES spectroscopy (Revision 4)

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#### ABSTRACT

22	The systematic mineralogy of niobium (Nb) is complex with more than one hundred species
23	dominated by multicomponent oxides of similar chemistry. The determination of Nb speciation in
24	solids (i.e. the distribution between the phases present and the crystal-chemical environment of Nb)
25	is thus a challenge in geological contexts. Here, we present the first Nb $L_{2,3}$ -edges X-ray absorption
26	near-edge structure (XANES) measurements on a variety of Nb minerals and synthetic oxides with
27	geological relevance. The interpretation of Nb $L_{2,3}$ -edges XANES spectra in the light of crystal-field
28	theory shows the sensitivity of spectra to local site symmetry and electronic environment around Nb
29	atoms. Crystal-field multiplet simulations give estimates of the 10Dq crystal-field parameter values
30	for Nb <sup>5+</sup> , which range from 2.8 to 3.9 eV depending on Nb coordination and Nb–O distances.
31	Rather than a $10Dq$ vs. R <sup>-5</sup> relationship (where R represents the average Nb–O bond distance)
32	expected in a point-charge model, we find a R <sup>-3</sup> dependence with the crystal-field splitting for
33	reference materials with octahedrally-coordinated Nb. Complementary ligand-field multiplet
34	simulations provide evidence of charge transfer between Nb and O. The contribution of the ionic
35	and covalent characters to the Nb–O bonds is equivalent, unlike more ionic 3 <i>d</i> metal–O bonds. This
36	systematic characterization of the $L_{2,3}$ -edges XANES spectral properties of Nb provides information
37	on the mechanisms by which $Nb^{5+}$ substitutes for $Fe^{3+}$ , $Ti^{4+}$ or $Ce^{4+}$ in oxides common in geological
38	contexts. Whereas the substitution of $Nb^{5+}$ for $Ce^{4+}$ does not modify the local structure of the cation
39	site in cerianite, the substitution of Nb <sup>5+</sup> for Ti <sup>4+</sup> in rutile and anatase results in an increase of the
40	cation-ligand distance and a decrease in the symmetry of the cation site. Conversely, the
41	substitution of Nb <sup>5+</sup> for Fe <sup>3+</sup> in hematite and goethite results in a smaller cation site distortion. Our
42	study demonstrates the usefulness of $L_{2,3}$ -edges XANES spectroscopy to determine Nb speciation in
43	minerals in order to understand the processes of enrichment of this critical metal.

44 Keywords: Niobium, XANES, multiplet, 10Dq, local structure, speciation

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#### INTRODUCTION

Niobium (Nb) is a quintessential critical element (European Commission 2020) used to 47 48 manufacture superallovs, superconducting magnets and catalysts (Schulz et al. 2017). Niobium-49 based materials are also valued for the implementation of low-carbon technologies thanks to the 50 unusual properties that arise from defects in their crystal structure (Ismael 2020, Ma et al. 2020). An 51 increasing range of applications is expected to drive the future demand for Nb. This economic 52 importance is exacerbated by the scarcity of Nb deposits. The incorporation of Nb into most 53 common rock-forming minerals is limited by its low concentration on Earth (ca. 12 ppm in the upper continental crust; Rudnick and Gao 2003) and its geochemical properties. Only Nb<sup>5+</sup> occurs 54 under oxygen fugacities relevant to lithospheric and surficial environments (Cartier et al. 2015), 55 with the electronic configuration [Kr]  $4d^0$ . This high valence and small ionic radius (0.64 Å in 56 octahedral coordination; Shannon 1976) makes Nb a high-field-strength elements (HFSE) along 57 58 with Zr, Sn, Hf, Ta, Pb, Th and U.

Niobium concentrates in silicic melts during partial melting and fractional crystallization until 59 60 the precipitation of Nb minerals of the pyrochlore and columbite supergroups, which are among the last phases to form in most crystallization sequences (Linnen and Cuney 2005). When such rocks 61 are exposed to weathering, the resistance of primary Nb minerals to alteration limits Nb leaching, 62 63 making it one of the most immobile elements (Hill et al. 2000). Thus, it is used as a reference 64 element for mass-balance calculations during weathering processes (Kurtz et al. 2000) or in 65 environmental studies (Nabi et al. 2021). The formation of the largest Nb deposits is a consequence of this geochemical behavior, which leads to a significant residual enrichment during lateritic 66 67 weathering of primary deposits, typically by an order of magnitude relative to the parent rock 68 (Mitchell 2015).

69 Unambiguous identification of Nb minerals is needed to understand geological and
70 geochemical processes concentrating Nb such as magmatic differentiation (Walter et al. 2018; Lee
71 et al. 2006), metasomatic events (Wu et al. 2021) and supergene weathering (Lottermoser and

72 England 1988; Wall et al. 1996). However, the similar crystal chemistry and the frequent 73 metamictization of Nb minerals make the analysis of Nb speciation using X-ray diffraction analyses 74 challenging. The most abundant phases are multicomponent oxides with the general formulas 75 AB<sub>2</sub>O<sub>6</sub> (columbite-group minerals: e.g. columbite, euxenite, aeschynite) and  $A_{2-x}B_2O_7$  (pyrochlore-76 group minerals: pyrochlore, betafite, samarskite). The eight-fold coordinated A-site, a square 77 antiprism, can be occupied by rare-earth elements (REE), Ca, U, Th, Fe, while the octahedral B-site 78 can be occupied by Ti, Nb, Ta and W and forms double chains in a zigzag pattern by sharing at least 79 two edges with neighboring octahedra (Ewing 1975). Due to strong interionic repulsion, most NbO<sub>6</sub> 80 octahedra are distorted (Kunz and Brown 1995). Metamictization is common due to the presence of radioactive elements (Zietlow et al. 2017). This process leads to the formation of local structures 81 82 made of corner-sharing octahedra at the expense of the edge-sharing linkages observed in

**83** crystalline oxides (Ewing 1975).

84 Niobium is also found as a minor or trace element in oxide minerals. Hydrothermal events can 85 produce amorphous Fe oxides containing low amounts of Nb (Wu et al. 2021). In metasomatized mantle peridotites, rutile may host more than 95 % of the Nb budget (Kalfoun et al. 2002). Niobium 86 87 can also be enriched in Fe- and Ti oxides that occur as veinlets or weathering products in laterites 88 (Lottermoser and England 1988; Giovannini et al. 2017). These oxides highlight the capacity of Nb<sup>5+</sup> to substitute for cations such as Ti<sup>4+</sup>, Sn<sup>4+</sup>, W<sup>6+</sup>, Ce<sup>4+</sup> and Fe<sup>3+</sup> in various minerals (Černý and 89 Ercit 1989; Giovannini et al. 2017), which further complicates the determination of Nb speciation in 90 91 such geological contexts.

Here, we report the first systematic analysis of Nb L<sub>2,3</sub>-edges XANES spectra using a selected
set of Nb minerals (fluorcalciopyrochlore, hydropyrochlore, niocalite, Nb perovskite, columbite)
and synthetic oxides (Nb<sub>2</sub>O<sub>5</sub>, lueshite and Nb-substituted hematite, goethite, rutile, anatase and
cerianite). So far, only a few L<sub>2,3</sub>-edges XANES spectroscopic studies have been published on
synthetic Nb oxides and fluorides (Sugiura et al. 1988; Kubouchi et al. 2012; Wang et al. 2018).
The objectives of this work are thus twofold:

98	(1) To relate spectral properties to the local electronic structure of Nb in crystalline materials by
99	means of crystal-field and ligand-field multiplet (CFM and LFM) calculations. Such an
100	approach has proven to be useful to model the bioavailability and mobility of Fe in
101	terrestrial and subsurface environments (Bhattacharyya et al. 2019) and V speciation in
102	fresnoite (Höche et al. 2013).

- 103 (2) To investigate the processes by which Nb substitutes for Fe, Ti and Ce in oxides, which can
   104 serve as models for the major Nb-bearing oxides found in geological contexts and used in
   105 industry.
- 106 Overall, the present study on Nb speciation in geological contexts demonstrates how the
- 107 sensitivity of Nb L<sub>2,3</sub>-edges XANES spectroscopy can be used to better characterize and understand
- 108 Nb mineralogy. In primary and lateritic deposits, deciphering Nb speciation will improve our
- 109 understanding of Nb enrichment and may help to diversify the range of primary sources and to
- 110 upgrade the efficiency of ore processing (Černý and Ercit 1989).
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#### MATERIALS AND METHODS

## 112 Mineral synthesis procedures

113 Niobium-substituted Fe oxides (1 wt% Nb). The synthesis of Nb-bearing goethite ( $\alpha$ -

114 FeOOH) has been adapted from the hydrothermal synthesis of Sc-bearing Fe oxides at 70 °C

115 (Chassé et al. 2017). Nb-bearing goethite was converted into Nb-bearing hematite ( $\alpha$ -Fe<sub>2</sub>O<sub>3</sub>) by

116 dehydroxylation at 300 °C for 2 h. The solid was washed using H<sub>2</sub>SO<sub>4</sub> in order to remove potential

adsorbed Nb species and poorly-crystallized material.

## **118** Niobium-substituted Ti oxides (5 wt% Nb). The synthesis of Nb-bearing anatase (TiO<sub>2</sub>) has

119 been carried out using a sol-gel method at moderate temperature (Dufour et al. 2012). Niobium-

- 120 bearing rutile (5 wt%) was obtained by heating Nb-bearing anatase (5 wt%) at 700 °C for 3 hours.
- 121 Niobium-bearing anatase samples with 1 and 10 wt% Nb were also synthesized following this

122 procedure.

- Niobium-substituted cerianite (1 wt% Nb). Niobium-bearing cerianite was synthesized
  using a high temperature solid-state reaction at 1,300 °C by homogenizing CeO<sub>2</sub>, Nb<sub>2</sub>O<sub>5</sub> and Nd<sub>2</sub>O<sub>3</sub>
  powders (Olegário et al. 2013).
- **126 Lueshite.** This reference material was obtained by following a hydrothermal synthesis
- 127 procedure at 200 °C over 24 h based on the experimental procedure of Gouget et al. (2019).

## 128 Analytical methods

129 Powder X-ray diffraction (XRD) analyses. The successful completion of the syntheses was 130 verified by X-ray diffraction analysis. X-ray diffraction was performed using a PANALYTICAL 131 X'pert Pro MPD diffractometer. Measurements were carried out in Bragg-Brentano geometry using a Co Kα anode in order to minimize the X-ray absorption of Fe in hematite and goethite. Data were 132 133 recorded with an X'Celerator detector between 3 °20 and 90 °20 with 0.017 ° steps. The incident 134 beam mask was fixed at 20 mm and the Soller slits at 0.04 rad. Total counting time of measurement 135 was 3 hours per sample. The crystal structure of synthetic compounds was checked using the 136 International Centre for Diffraction Data (ICDD) references (PDF-2 database). No secondary 137 niobian phase was detected on the XRD patterns of Nb-bearing Fe, Ti and Ce oxides confirming 138 that the Nb ions were incorporated into the crystal lattice and substituted for Fe, Ce and Ti 139 (Supplemental Figs. S1 and S2).

140 Single-crystal XRD. Single-crystal X-ray diffraction data were acquired on natural Nb 141 reference materials using an Agilent Diffraction Xcalibur-S diffractometer equipped with a 142 Sapphire CCD-detector with Mo K- $\alpha$ 1 radiation ( $\lambda = 0.71073$  Å, graphite monochromator) at 143 293 K. Data reduction, cell refinement and space group determination were performed using the 144 CrysAlisPro software.

145 Electron microprobe (EMP) analyses. Electron microprobe (EMP) analyses were used to
146 determine the crystal chemistry of the Nb reference materials sourced from mineralogical
147 collections. Analyses were conducted on a CAMECA SX Five electron probe at the CAMPARIS
148 facility (Sorbonne Université, Paris). After checking the homogeneity of the samples, two to seven

149 spots were probed on each sample at 15 kV and 40 nA for the major elements and at 15 kV and 150 299 nA for minor and trace elements. Wavelength-dispersive spectroscopy analyses were performed 151 using the following standards: albite for Na, diopside for Mg, Si and Ca, orthoclase for Al and K, 152 MnTiO<sub>3</sub> for Mn and Ti, hematite for Fe, BaSO<sub>4</sub> for Ba, topaz for F, LiNbO<sub>3</sub> for Nb, metallic Ta for 153 Ta, SrSi for Sr, zircon for Zr, galena for Pb, monazite for Th, uraninite for U and allanite-(Y) for Y, 154 La, Ce, Nd. 155 Acquisition of X-ray absorption spectra. Niobium L<sub>3</sub>-edge (2360–2390 eV) and L<sub>2</sub>-edge 156 (2455–2485 eV) XANES spectra were recorded on LUCIA beamline at SOLEIL synchrotron 157 radiation facility (Gif-sur-Yvette, France) operating with a storage ring current of 450 mA and 158 energy of 2.75 GeV (Vantelon et al. 2016). A Si(111) double-crystal monochromator was used with 159 an energy resolution of 0.25 eV at 2400 eV (Schaefers et al. 2007). The monochromator was 160 calibrated at the energy of the Nb L3-edge using Nb2O5. Due to the high Nb content of Nb minerals, 161 spectra were recorded on cellulose-diluted pellets before being mounted on a holder. Pure pellets 162 were used for synthetic Nb-substituted samples. Data were collected between 2300 and 2550 eV at 163 room temperature, under vacuum, in fluorescence mode. Energy steps were (2, 0.2, 1, 0.2, 1) eV for 164 energy ranges of (2300–2350), (2350–2400), (2400–2455), (2455–2490) and (2490–2550) eV, 165 respectively, with a 1 s integration time. Two measurements per sample were sufficient to obtain a 166 good signal-to-noise ratio and check the reproducibility of the edge features. 167 Data processing and simulations 168 **Processing of X-ray absorption data.** Data were processed using the Larch software (Newville 2013). The MBACK normalization algorithm was applied to prevent distortion in the 169 170 XANES data and preserve the branching ratio (Weng et al. 2005). This method applies a single

- 171 smooth background function over the entire  $L_{2,3}$ -edges data range rather than normalizing each edge
- 172 independently. The normalization function is a first order Legendre polynomial (Supplemental Fig.
- 173 S3) and the edge energy chosen as the input parameter of the MBACK function implemented in
- 174 Larch is 2371 eV. The spectra of Nb-substituted hematite, Nb-substituted goethite, lueshite and

175 niocalite were trimmed beyond 2475 eV because the S *K*-edge hides the high-energy features of the176 Nb *L*<sub>2</sub>-edge.

177 Niobium  $L_{2,3}$ -edges XANES features were fitted using three pseudo-Voigt functions in order to quantitatively compare and retrieve differences in the three features between the spectra. The 178 179 continuum background was removed using an error function with fixed inflection points (2373.0 180 and 2467.0 eV) and large width (ca. 8 eV) to reproduce the slow onset of the electronic continuum 181 (Brotton et al. 2007). No agreement or convention exists regarding the parameters of the 182 background functions (Henderson et al. 2014) but similar procedures have been applied to Fe L2.3-183 edges (Bourdelle et al. 2013) and Zr L<sub>2,3</sub>-edges (Jollivet et al. 2013). An error function was preferred over the commonly-used arctangent because its width is related to the instrumental 184 185 resolution rather than to the lifetime of the excited state, which is not known a priori. Because the 186 best mathematical fits were obtained for a relative weight of Lorentzian to Gaussian components 187 between 0.8 and 1.0 depending on the spectra, this parameter was fixed to 0.9 in all fits for 188 comparative purposes.

Calculations of crystal-field and ligand-field multiplets. Simulations of the Nb L<sub>2,3</sub>-edges 189 190 spectra were performed using the Crispy software as implemented in the Quanty library (Haverkort 191 2016; Retegan 2019). Two approaches were tested to reproduce the spectral features. The first is a 192 CFM calculation which takes into account the crystal-field effects acting on Nb. Ligand-field 193 multiplet calculations offer a more comprehensive model by including ligand-to-metal charge transfer, i.e. by mixing in the ground state the  $4d^0$ ,  $4d^1L^1$ ,  $4d^2L^2$ ,  $4d^3L^3$  configurations through a 194 195 hybridization Hamiltonian (more details on this notation are provided in Supplemental Material). 196 Crystal- and ligand-field multiplet calculations both require specific input parameters. To 197 account for the lifetime broadening, Lorentzian functions with a full width at half-maximum of 1.66 eV and 1.87 eV for the L<sub>3</sub> and L<sub>2</sub>-edges were used to simulate the features (Krause and Oliver 198 199 1979). The experimental Gaussian broadening was set to ca. 1.5 eV to best reproduce the experimental spectra. The simulations of the experimental spectra were carried out by finding the 200

201 best scaling factors for the Slater-Condon integrals that best account for direct and exchange 202 interactions between the 2*p*-4*d* orbitals ( $F_{pd}^2 = 2.680 \text{ eV}$ ,  $G_{pd}^1 = 1.627 \text{ eV}$  and  $G_{pd}^3 = 0.946 \text{ eV}$  for 203 the free ion). The reduction of these values modifies the relative intensity of the features. The values 204 of the 4d and 2p spin-orbit coupling parameters were kept close to the atomic values of 0.124 eV 205 and 63.97 eV. The crystal-field splitting parameter (10Dq) was chosen to best reproduce the energy 206 difference between the two features, which corresponds to the splitting of the final state of the d 207 orbitals. The extra parameters required for LFM calculations are the hybridization strength  $V_{mix}$  $(V_{t2g}, V_{eg})$ , the configuration-averaged energies of the charge transfer configuration (E(4 $d^{1}L^{1}$ )-208 209  $E(4d^0)$   $\Delta$ , the core-hole potential  $U_{dc}$  and the average Coulomb interaction energies of a 210 corresponding electron pair  $U_{dd}$ . Detailed explanations of these parameters and their influence on 211 the spectral shapes are given in Supplemental Material (Supplemental Fig. S7).

212

#### **RESULTS**

## 213 Characteristics of niobium *L*<sub>2,3</sub>-edges XANES spectra

The Nb L<sub>2,3</sub>-edges XANES spectra (Fig. 1) are characterized by a split edge feature with two 214 peaks (A and B features) followed by a peak of lower intensity, ca. 10 eV after the edge (C feature), 215 216 as reported for other Nb-bearing materials (Sugiura et al. 1988; Wang et al. 2018). The energy of 217 the L<sub>3</sub>-edge features (A<sub>3</sub>, B<sub>3</sub>, C<sub>3</sub>) varies around ca. 2372, 2376 and 2387 eV, respectively (Fig. 1a). The energy of the L<sub>2</sub>-edge features (A<sub>2</sub>, B<sub>2</sub>, C<sub>2</sub>) varies around ca. 2466, 2470 and 2481 eV, 218 219 respectively (Fig. 1b). At the  $L_3$ -edge, the energy position and width of the A<sub>3</sub> feature are stable. For 220 the B<sub>3</sub> features, these characteristics are prone to variations depending on the reference materials. 221 The spectra of niocalite, Nb-substituted hematite and Nb-substituted goethite show narrower B<sub>3</sub> 222 features than the other reference materials. In contrast, the wide B<sub>3</sub> feature of Nb perovskite spectra 223 shows a shoulder at high energy (B'3 at 2379–2380 eV, Fig 2h). In all compounds, C3 is of lower 224 intensity than A<sub>3</sub> and B<sub>3</sub> with limited variation in position and width. Similar trends are observed at the L<sub>2</sub>-edge. 225

## 226 Analysis of the niobium *L*<sub>2,3</sub>-edges XANES spectra

227 **Variation of the edge splitting.** The  $\Delta E$  parameter, corresponding to the energy splitting between the A and B features, ranges from ca. 2.6 to 4.0 eV at the L<sub>3</sub>-edge and from ca. 2.3 to 228 229 4.0 eV at the L<sub>2</sub>-edge (Table 2). Lueshite, Nb perovskite, fluorcalciopyrochlore and 230 hydropyrochlore spectra have the largest  $\Delta E$  values (ranging from ca. 3.6 to 4.0 eV). Most spectra 231 have  $\Delta E$  values between ca. 3.1 and 3.5 eV except for Nb-substituted cerianite spectra (ca. 2.6 and 2.3 eV at the  $L_3$ - and  $L_2$ -edges, respectively). Overall, the energy splitting at the  $L_3$ -edge follows the 232 same trend ( $R^2 = 0.94$ ) as the energy splitting at the L<sub>2</sub>-edge (Supplemental Fig. S6a). 233 234 Variation of the intensity ratio. The intensity ratio between the A and B features (I<sub>A</sub>/I<sub>B</sub>) 235 varies between ca. 0.8 and 2.1. It is higher at the  $L_2$ -edge (1.43) than at the  $L_3$ -edge (1.07). In most 236 compounds, it ranges between ca. 1.0-1.2 and 1.4-1.6 at the  $L_3$ - and  $L_2$ -edges, respectively (Table 237 2). Intensity ratios of Nb-substituted cerianite and Nb<sub>2</sub>O<sub>5</sub> spectra are below 1 at the  $L_3$ -edge (Fig. 238 2g). There is a strong positive correlation of this parameter between the two edges ( $R^2 = 0.95$ , 239 Supplemental Fig. S6b).

240 Variation of the bandwidth. The ratio of the full width at half maximum of feature B with respect to feature A (FWHM<sub>B/A</sub>), ranges between ca. 1.0 and 2.2 for both edges. The spectra of Nb-241 substituted goethite and hematite (Fig. 2c, 2d) have the lowest FWHM<sub>B/A</sub> values (ca. 1.1 and 1.4 at 242 243 the  $L_3$ - and  $L_2$ -edges, respectively). Most spectra exhibit intermediate FWHM<sub>B/A</sub> values (ca. 1.4–1.7 and ca. 1.6–1.9 at the  $L_3$ - and  $L_2$ -edges, respectively). The spectra of Nb perovskite (Fig. 2h) stands 244 out by its high FWHM<sub>B/A</sub> value (ca. 2.1 and 2.4 at the  $L_3$ -and  $L_2$ -edges, respectively). Niobium-245 246 substituted anatase spectra (Fig. 2f) are also characterized by high FWHM<sub>B/A</sub>, especially at the L<sub>2</sub>-247 edge (ca. 1.8–1.9 eV). On average, the width ratios at the  $L_3$ -edge (1.54) are smaller than those at the L<sub>2</sub>-edge (1.73). The FWHM<sub>B/A</sub> parameter is correlated between the two edges ( $R^2 = 0.93$  when 248 249 the lueshite spectra are excluded as they deviate from the general trend, Supplemental Fig. S6c)

- 250 Multiplet calculations
- 251 Crystal-field multiplet calculations. The spectral features of Nb-substituted cerianite and

252 hematite are well reproduced by considering Nb in a regular polyhedron  $(O_h)$  (Figs. 3a and 3b) with 253 crystal field values of 2.8 and 3.7 eV, respectively (Table 3). The spectra of hydropyrochlore and 254 Nb perovskite are best modeled with a 10Dq value of 3.9 eV, which reproduces the splitting between the features (Figs. 3c and 3d). Nonetheless, the B' features of low intensity at 2379-255 256 2380 eV are absent. The good reproduction of the intensity ratios of the spectra for Nb-substituted 257 cerianite, hematite and hydropyrochlore results from the reduction of the Slater-Condon integrals to 50 %, an indication that the contribution of the ionic and covalent characters to the Nb–O bonds is 258 equivalent. The high intensity ratios of Nb perovskite spectra (Table 2) are reproduced with Slater-259 260 Condon integrals reduced to 35 %.

261 Ligand-field multiplet calculations. We calibrated our calculations using Nb-substituted 262 hematite spectra, which exhibit the simplest spectral features. Charge-transfer parameters ( $U_{dc}$ ,  $U_{dd}$ ,  $\Delta$ . V<sub>mix</sub>, Table 4) were chosen according to calculations done on Ti<sup>4+</sup> (3d<sup>0</sup>)-compounds (Okada and 263 264 Kotani 1993). The intensity of the features of Nb-substituted hematite spectra is improved and the C 265 feature at ca. 2385 eV is reproduced when charge transfers are considered (Fig. 4). We also 266 attempted to reproduce the B' features in the spectra of hydropyrochlore and Nb perovskite by 267 investigating the influence of the hybridization strength ( $V_{mix}$ ) on the spectral shapes. Using the 268 same charge-transfer parameters, the LFM calculation fails to explain the coexistence of B' and C features visible on these spectra (Fig. 5). 269

270

#### DISCUSSION

## 271 L<sub>2,3</sub>-edges XANES spectroscopy mirrors the electronic environment of niobium

272 Spectral energy splitting, interatomic distances and site symmetry. Niobium  $L_{2,3}$ -edges 273 correspond to transitions to empty 4*d* states, making them sensitive to crystal-field effects. In the 274 framework of crystal-field theory and given that O<sup>2-</sup> is the ligand of Nb<sup>5+</sup> in all of our reference 275 materials,  $\Delta E$  is correlated with the 10*Dq* crystal-field parameter, and therefore mirrors Nb<sup>5+</sup> site 276 geometry and ligand distances.

277 The  $\Delta E$  values range between 3.3 and 4.0 eV for octahedrally-coordinated Nb<sup>5+</sup>. The  $\Delta E$ 

variability among reference materials with Nb in octahedral environment is correlated with the 278 average interatomic distances ( $R^2 = -0.80$ ), as expected from the relationship between 10Dg and the 279 inverse fifth power of the average interatomic distance (i.e. R<sup>-5</sup>) (Fig. 6) in a point-charge model 280 281 (Burns 1993). Nonetheless, the experimental data are best fitted with a function proportional to R<sup>-3</sup>  $(\chi^2 = 0.17)$ , rather than a function proportional to R<sup>-5</sup> ( $\chi^2 = 0.26$ ). Other studies indicate similar 282 deviation from the expected theoretical R<sup>-5</sup> dependence with crystal-field splitting (R<sup>-8.3</sup> in 283 Lebernegg et al. 2008; R<sup>-2</sup> in Wang et al. 2018). The energy splitting in the spectra of Nb-284 substituted Ti oxides deviates from both R<sup>-3</sup> and R<sup>-5</sup> models, reflecting the difference between 285 286 probed Nb–O distances and theoretical Ti–O distances (Fig. 6). 287 Among reference materials with octahedral Nb, the spectra of Nb<sub>2</sub>O<sub>5</sub> show the lowest  $\Delta E$ values (3.06 and 3.28 eV at the  $L_2$ - and  $L_3$ -edges, respectively), slightly higher than previously 288 289 reported (2.6 and 2.8 eV; Sugiura et al. 1988). Nb<sub>2</sub>O<sub>5</sub> powders may differ from each other in the nature and proportion of the polymorphs they contain (Pilarek et al. 2017). Unfortunately, the 290 291 material investigated by Sugiura et al. 1988 was not characterized by XRD. Our Nb<sub>2</sub>O<sub>5</sub> reference 292 consists of several polymorphs in equivalent proportions, with two monoclinic structures (ca. 90 % 293 of NbO<sub>6</sub> octahedra and 10 % NbO<sub>5</sub> polyhedra: Andersson 1967) and an orthorhombic one (NbO<sub>5</sub> 294 and NbO7 polyhedra; Waring et al. 1973) (Supplemental Fig. S2c). The presence of these different 295 structures leads to variations in the local environment of Nb which may explain a lower splitting as compared to the other octahedrally-coordinated Nb reference materials. 296 297 The  $\Delta E$  value of cerianite spectra, in which Nb occupies a cubic site, is 6/9-7/9 times smaller 298 than in reference materials containing octahedral Nb (Table 2). Indeed, crystal-field splitting values 299 are lower than expected in cubic coordination  $(10Dq_c \text{ is } 8/9 \text{ of } 10Dq_o)$ . Though not detected by 300 XRD (Supplemental Fig. S2b), the synthesis of Nb-substituted cerianite can also result in the 301 formation of trace amounts of tetrahedrally-coordinated fergusonite-(Ce) ([Ce, REE]NbO4) due to 302 the low solubility of Nb in cerianite (Kolodiazhnyi et al. 2016). The theoretical crystal-field splitting parameter of tetrahedral Nb<sup>5+</sup> is even lower ( $10Dq_t$  is 4/9 of  $10Dq_o$ ) possibly explaining the 303

**304** small  $\Delta E$  value of spectra from cubic Nb-substituted cerianite.

The splitting of the main edge of  $4d^0$  elements increases with increasing cation charge. For Zr<sup>4+</sup>, Nb<sup>5+</sup> and Mo<sup>6+</sup> coordinated to oxygen ligands in weakly distorted octahedra, it is 3.2 eV (Galoisy et al. 1999), 3.5–3.9 eV (this study) and 4.5 eV (Bare et al. 1993), respectively. This trend highlights the decrease of the ionic radius with increasing cation charge (<sup>[6]</sup>Zr<sup>4+</sup> = 0.72 Å, [<sup>6]</sup>Nb<sup>5+</sup> = 0.64 Å, <sup>[6]</sup>Mo<sup>6+</sup> = 0.59 Å; Shannon 1976) demonstrating the high sensitivity of *L*<sub>2,3</sub>-edges

**310** XANES spectroscopy to the speciation of  $4d^0$  elements.

311 Spectral broadening, charge transfer and site distortion. It is necessary to consider the C 312 features in the fitting procedure in order to avoid an overestimation of the broadening of the B 313 features. Unlike their assignment to  $2p \rightarrow 5s$  transitions (Sugiura et al. 1988), our LFM calculations 314 show that this feature results from hybridization between the 4*d* orbitals of Nb<sup>5+</sup> and the 2*p* orbitals 315 of O<sup>2-</sup>, in agreement with the work of Okada and Kotani (1993) on Ti compounds.

316 The spectra of Nb minerals have a high-energy shoulder of varying intensity at 2378 eV. The high degree of distortion of NbO6 octahedra in columbite and niocalite (Table 1) is not obvious 317 from the fit of their XANES spectra. However, both compounds have a shoulder (labelled B') of 318 319 limited intensity (Fig. 1). Furthermore, spectra of Nb perovskite and pyrochlore display the most 320 intense B' shoulder yet these reference materials are composed of regular octahedra. The intensity 321 of the shoulder is therefore not directly related to the distortion of the NbO<sub>6</sub> octahedra. Spectra of 322 Nb perovskite exhibiting the most intense C feature are also those with the largest B' shoulder. We 323 therefore ascribe the B' shoulder to orbital hybridization. The failure of ligand-field multiplet calculations to reproduce both B' and C features (Fig. 5) may be due to the differences between the 324 Ti<sup>4+</sup> charge-transfer parameters used here and those of Nb<sup>5+</sup>, which are unknown (Okada and Kotani 325 1993). 326

327 The distortion of the cation site causes a broadening of the XANES features for  $Ti^{4+}$  and  $Zr^{4+}$ 328 (De Groot et al. 1992; Ikeno et al. 2013; Jollivet et al. 2013). In contrast, the broadening of the Nb 329  $L_{2,3}$ -XANES features, probed by the FWHM<sub>B/A</sub> parameter, is determined by charge-transfer effects

and does not correlate with the degree of distortion of the NbO<sub>6</sub> octahedra. We conclude that the significant contribution of charge-transfer effects to Nb  $L_{2,3}$ -XANES spectra is related to the covalent character of the Nb–O bonds (Ikeno et al. 2011).

333 The spectra of Nb-substituted anatase and rutile display the poorest fit quality ( $\gamma^2 = 0.2-0.5$ ) 334 due to poor fitting of the wide B features characterized by slightly convex downward slopes. These 335 compounds have a weak shoulder at 2378 eV, suggesting the limited effect of charge transfer on the 336 spectra. In addition, another type of broadening is observed at the B feature (2376–2377 eV) which 337 could reflect the distortion of the Nb sites (Fig. 2f). In contrast, only the spectra of Nb-substituted 338 hematite and goethite exhibit A and B features of similar widths, suggesting a symmetrical Nb site rather than the low symmetry of  $Fe^{3+}$  expected in the highly distorted FeO<sub>6</sub> octahedra. This 339 340 hypothesis is supported by the good reproduction of the spectra of Nb-substituted hematite in  $O_h$ 341 symmetry using LFM calculations. Despite the different Fe environments and crystal structures of 342 hematite and goethite, their spectral similarities indicate that the effect of distinct ligands (OH vs 343 O<sup>2-</sup>) or changes in the octahedra arrangements (face-, edge- or corner-sharing) are negligible 344 compared to those of the site symmetry and average Nb–O distances.

345 **Spectral intensity variations and bond covalence.** The intensity ratios (I<sub>A</sub>/I<sub>B</sub>) exhibit low 346 standard deviations in our dataset ( $\sigma = 0.13$  and 0.20 at the L<sub>3</sub>- and L<sub>2</sub>-edges, respectively). The low 347 intensity ratio of the  $L_3$ -edge spectrum of Nb-substituted cerianite (0.75) stands out from the other 348 reference materials (1.10 on average for references with octahedrally-coordinated Nb). This can be 349 explained by approximating the intensity ratio to the number of unoccupied states, i.e., 2/3 or 3/2 in 350 regular cubic and octahedral coordination, respectively (Ogasawara et al. 2001). The intensity ratios 351 retrieved from the fitting procedure are not equal to the statistical values because of ligand-field 352 multiplet effects (Ogasawara et al. 2001). However, the intensity ratio at the L<sub>2</sub>-edge of the reference materials with octahedrally-coordinated Nb is close to the statistical value of 3/2 (1.46 on 353 354 average) because this edge is less affected by multiplet effects (De Groot, 1994).

**355** The significance of multiplet effects can be estimated from our simulations through the

reduction factor of the Slater-Condon integrals. The range of values of the reduction factor (0.35-0.54) indicates a major contribution from the covalent nature of the Nb–O bonds. These values are remarkably low compared to those around 0.7–0.8 observed in most oxides of 3*d* elements (De Groot 2005). The modeling of other Nb compounds, such as CsNbF<sub>6</sub>, requires similar reduction of these parameters down to 40 % (De Groot et al. 1994). Therefore, the reduction of the Slater-Condon parameters mirrors the covalent nature of the bonds formed by 4*d* elements relative to 3*d* elements (Singh et al. 2017).

363 Why combine  $L_2$ - and  $L_3$ -edges XANES spectroscopy? As the spectral features are 364 correlated between the L<sub>2</sub>- and L<sub>3</sub>-edges (Supplemental Fig. S5), the in-depth analysis of only one edge is sufficient to determine the coordination number of Nb<sup>5+</sup> and characterize the Nb local 365 366 environment. However, the simulation of XANES spectra using CFM and LFM calculations cannot 367 be carried out on a single edge. The lower sensitivity of the  $L_2$ -edge to atomic-multiplets effects 368 involves several pairs of solutions of the 10Dq value and the reduction of Slater integrals that 369 satisfactorily reproduce the L<sub>2</sub>-edge spectra. Only the joint modeling of both edges constrains the 370 reduction of the Slater integrals, because of their higher sensitivity to atomic-multiplet effects (De 371 Groot et al. 1994). The choice for the acquisition and analysis of one or combined edges depends on 372 the precision of the crystallographic information one wants to extract from the spectra.

## 373 Mechanisms of niobium substitution in oxides

Niobium-substituted Ti oxides. The discrepancy between the average Ti–O distance in the 374 375 host structure and the observed Nb-O distances points out specific mechanisms of substitution in Nb-substituted TiO<sub>2</sub> oxides (Fig. 6). Estimation of the Nb–O distances in Ti oxides by interpolation 376 of the correlation between  $\Delta E$  and  $R^{-5}$  gives values of ca. 2.03 Å for Nb-substituted anatase and 377 378 ca. 2.01 Å for Nb-substituted rutile. Such an increase of the Nb–O distances is expected from the larger ionic radius of Nb with respect to Ti ( $^{[6]}Nb^{5+} = 0.64$  Å and  $^{[6]}Ti^{4+} = 0.605$  Å; Shannon 1976). 379 Moreover, the symmetry of the Nb<sup>5+</sup> site in TiO<sub>2</sub> is reduced as evidenced by the broadening of the 380 B<sub>3</sub> and B<sub>2</sub> features (Fig. 2f and Table 2). Increasing Nb substitution leads to lower  $\Delta E$  and higher 381

**382** FWHM<sub>B/A</sub> (Table 2), indicating an increased distortion of the Nb sites and increased Nb–O

**383** distances. Such distortion of Nb sites and an increase in Nb–O distances with increasing amounts of

384 Nb were also evidenced using EXAFS (1.98 Å and 1.99 Å for Ti0.97Nb0.03O2 and Ti0.92Nb0.08O2,

**385** respectively; Gardecka et al. 2015). The mechanism allowing the incorporation of Nb<sup>5+</sup> in rutile and

**386** anatase is the formation of one  $Ti^{4+}$  vacancy for every four Nb<sup>5+</sup> (Sheppard et al. 2006) following

387 conditions of equilibrium and electroneutrality as illustrated by the Kröger-Vink notation:

**388** 
$$5[Ti_{Ti}^{x}] + 2[Nb_2O_5] = 4[Nb_{Ti}^{\bullet}] + [V_{Ti}^{\prime\prime\prime\prime\prime}] + 5[TiO_2] (1)$$

In geological environments, the substitution of Nb<sup>5+</sup> for Ti<sup>4+</sup> in Ti oxides is also expected to be accommodated by interstitial Fe<sup>3+</sup> in oxidized environments following the substitution  $2Ti^{4+} = Fe^{3+} + 2Nb^{5+}$  (Ruck et al. 1986) and by Fe<sup>2+</sup> in reducing environments, according to  $3Ti^{4+} = Fe^{2+} + 2Nb^{5+}$  (Giovannini et al. 2020).

Recent EXAFS analyses have highlighted the splitting of the first shell into two Nb-O
contributions at 1.88 and 2.01 Å in Nb-substituted anatase (Ribeiro et al. 2020). The increase of
Nb–O distances up to ca. 2.01 Å in the latter study and this work could reflect the presence of
Nb<sub>2</sub>O<sub>5</sub> clusters in Nb-substituted anatase and rutile (Atanacio et al. 2014), as the values of Nb–O
distances in Nb<sub>2</sub>O<sub>5</sub> are also 2.01 Å (Table 1). Even if the formation of Nb<sub>2</sub>O<sub>5</sub> clusters cannot be
excluded, the differences between the spectra of Nb<sub>2</sub>O<sub>5</sub> and Nb-substituted TiO<sub>2</sub> (Table 2) indicate
that Nb clustering is not an important process.

**Niobium-substituted Fe oxides.** Octahedral Fe<sup>3+</sup> and Nb<sup>5+</sup> have similar ionic radii, 0.645 Å 400 and 0.64 Å. respectively. The substitution of Nb<sup>5+</sup> for Fe<sup>3+</sup> in goethite is isormorphous (Oliveira et 401 al. 2008). Charge balance may be maintained by substituting 5Fe<sup>3+</sup> for 3Nb<sup>5+</sup>, which induces cation 402 403 vacancies. Our study shows that Nb-substituted Fe oxides can be reproduced by CFM and LFM calculations in regular  $O_h$  site symmetry even though the initial Fe site has a C<sub>3</sub> symmetry (Figs. 3b 404 405 and 4b). The regularity of the NbO<sub>6</sub> octahedra is also supported by the absence of broadening of 406 features B<sub>3</sub> and B<sub>2</sub> (Fig. 2c). The alignment of their experimental  $\Delta E$  values on the trend with respect to theoretical Fe-O distances (Fig. 6) indicates that the average Nb-O distances are not 407

**408** significantly modified with respect to the average Fe–O distances.

However, EXAFS data on Nb-substituted hematite indicate shorter Nb-O distances (1.87 and 409 2.05 Å) than the Fe–O distances in hematite (1.92 and 2.11 Å; Silva et al. 2009). The differences 410 between our results and those of Silva et al. (2009) could reflect the high amounts of Nb 411 incorporated in the Fe oxides they synthesized (5 and 10 wt% Nb) or the synthesis protocol. The 412 413 incorporation of Nb in Fe oxides may result in a symmetrization of the Nb site due to the relaxation of the crystal structure around Nb arising from the induced cation vacancies. 414 Niobium-substituted cerianite. Charge and size differences (0.97 and 0.64 Å, for Ce<sup>4+</sup> and 415 Nb<sup>5+</sup> respectively; Shannon 1976) limit the substitution of Nb in cerianite. The substitution of Nb<sup>5+</sup> 416

417 for  $Ce^{4+}$  was explained by the displacement of  $Nb^{5+}$  cations from ideal cubic symmetry, leading to

**418** oxygen vacancies (Hiley et al. 2018). It has also been suggested that half of the Ce ions become

419 trivalent to account for charge balance (Kolodiazhnyi et al. 2016). The other half of the charge

420 compensation would be accommodated by interstitial oxygens (Kolodiazhnyi et al. 2016, Schaube

**421** et al. 2019) according to:

422 
$$[Nb_2O_5] + 2[Ce_{Ce}^x] = 2[Nb_{Ce}^{\bullet}] + [O_i''] + 2[CeO_2] (2)$$

423 Our simulation of Nb-substituted spectra in  $O_h$  point symmetry (Fig. 3a) indicates that a Nb<sup>5+</sup>– 424 Nd<sup>3+</sup> co-doping eases the charge balance equilibrium (2[Ce<sup>4+</sup>] = [Nb<sup>5+</sup>] + [Nd<sup>3+</sup>]) and prevents 425 significant distortion of the Nb site by limiting the formation of interstitial oxygen and vacancies.

426

#### **IMPLICATIONS**

#### 427 Deciphering the origin of the properties of technological Nb-substituted materials

Some of the synthetic Nb-bearing oxides investigated in this study are meeting technological
challenges associated with climate change mitigation or environmental decontamination (e.g.,
Ismael 2020; Ma et al. 2020). Among other applications, they are used for dye-sensitized solar cells
(Lü et al. 2010), Na-ion battery anodes (Usui et al. 2015), direct solar-to-fuel conversion (Fu et al.
2016), and catalysts for the removal of exhaust-gas nitrogen oxide (Lian et al. 2015). These

433 enhanced physico-chemical properties result from the presence of substituted Nb<sup>5+</sup> leading to oxide 434 mobility and transport properties due to charge unbalancing, interstitial oxygen or vacancies. The 435 properties of these Nb materials may be rationalized by knowledge of the mechanisms of Nb 436 insertion, which can be unveiled by Nb  $L_{2,3}$ -edges XANES spectroscopy.

#### 437 Upgrading ore processing through quantitative Nb XANES spectroscopy

438 The choice of Nb ore-processing strategies depends on the nature of the Nb minerals, their degree of alteration and their crystal-chemical variability. It is essential to correctly characterize the 439 Nb ores to optimize ore processing (Černý and Ercit 1989). Niobium recovery from pyrochlore ores 440 441 using amine collectors is used in three processing plants worldwide (Guimarães and Weiss 2001). 442 Nevertheless, this process induces a significant loss of columbite and Nb-rutile between feed and 443 concentrate (Gibson et al. 2015). Moreover, a high concentration of Fe in pyrochlore, which is a **444** typical feature of hydropyrochlore, reduces its floatability and causes Nb loss during ore processing 445 (Chehreh Chelgani et al. 2012). Niobian rutile has also been identified in the world-class Nb deposit 446 of Araxá, but its significance in the overall Nb budget remains elusive (Neumann and Medeiros 447 2015). Therefore, Nb XANES spectroscopy may be a valuable tool for identifying Nb speciation in 448 ore minerals and optimizing ore-processing strategies.

## 449 Unravelling Nb geochemical behavior in natural systems

Recent findings in hydrothermal contexts (Andersson et al. 2018; Dietzel et al. 2019) and near-surface conditions (Wall et al. 1996; Chakrabarty et al. 2013; Giovannini et al. 2017) demonstrate the alteration of Nb minerals and question the presumed immobility of Nb (MacLean and Barrett 1993). The sensitivity of Nb  $L_{2,3}$ -edges XANES spectroscopy opens the possibility to track Nb mineral speciation in weathered Nb-enriched samples. It could also be used to determine the mechanisms of alteration of primary Nb minerals and reveal the mechanisms of Nb incorporation in newly-formed phases. A combination of bulk and micro-XANES analyses could

457 thus be used to enlighten the molecular-scale and geochemical factors that induce contrasted Nb

458 dynamics in supergene environments as has been done for rare-earth elements (Janots et al. 2015;459 Chassé et al. 2019; Borst et al. 2020).

460

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## FIGURE CAPTIONS

- 472 Figure 1: (a) Niobium  $L_3$  and (b)  $L_2$ -edge XANES spectra of the studied Nb minerals. The
- 473 coordination number of Nb (<sup>[8]</sup>Nb and <sup>[6]</sup>Nb) is specified. Vertical lines centered at 2372, 2376,
- 474 2387 eV at the  $L_3$ -edge and at 2466, 2470, 2481 eV at the  $L_2$ -edge evidence the variable position of
- 475 the B<sub>3</sub> and B<sub>2</sub> features. The spectra of niocalite, lueshite, Nb-substituted hematite and goethite were
- 476 trimmed beyond 2475 eV due to sulfur impurities resulting in an intense S K-edge feature at
- **477** 2481 eV.
- 478 Figure 2: Deconvolution of Nb L<sub>3</sub>-XANES spectra of (a) fluorcalciopyrochlore,

479 (b) hydropyrochlore, (c) Nb-substituted hematite, (d) Nb-substituted goethite, (e) Nb-substituted

480 rutile, (f) Nb-substituted anatase, (g) Nb-substituted cerianite, (h) Nb perovskite with three pseudo-

- 481 Voigts (PV1, PV2, PV3) and an error function (ERF). The experimental (Exp.) and the fitted data
- 482 (Fit.) correspond to the black and purple curves. All spectra are satisfactorily fitted using this
- **483** procedure ( $\chi^2 < 0.5$ ), but the fits of Nb-substituted anatase and Nb perovskite spectra are of poorer
- **484** quality ( $\chi^2 = 0.41$  and 0.39, respectively) due to the broadening of B<sub>3</sub> features (Figs. 2f and 2h). The
- 485 deconvolution of the other XANES spectra is shown in Supplemental Material (Supplemental Figs.
- **486** S4 and S5).

- **487** Figure 3: Comparison of experimental (black dashed lines) and simulated spectra (red lines)
- 488 obtained by crystal field multiplet (CFM) calculations of (a) Nb-substituted cerianite, (b) Nb-
- 489 substituted hematite, (c) hydropyrochlore, (d) Nb perovskite. The thin red lines indicate the position
- 490 and intensity of the electronic transitions when experimental and core-hole lifetime broadenings are
- 491 absent. The  $t_{2g}$  and  $e_g$  terms used in the single-particle approach are employed in a matter of clarity
- **492** but they correspond to the convolution of multi-electronic states.
- **493** Figure 4: Comparison of experimental (black dashed lines) and simulated spectra (red lines)
- 494 obtained by ligand-field multiplet (LFM) calculations of Nb-substituted hematite spectra.
- 495 Figure 5: Experimental spectra of Nb perovskite (black spectra) and theoretical spectra depicting
- 496 the influence of hydridization strength ( $V_{mix}$  parameter varying from 0.0 to 5.0 eV with a 0.25 eV
- 497 step) on the Nb  $L_{2,3}$ -edges spectral shapes. The arrows mark the low intensity features resulting
- **498** from charge-transfer effect. Charge-transfer parameters are 3.0, 6.0 and 4.0 eV for  $U_{dd}$ ,  $U_{dc}$  and  $\Delta$ , **499** respectively.
- Tespectively.
- 500 Figure 6: Dependence between the energy splitting ( $\Delta E$  parameter) at the L<sub>3</sub>-edge and the expected
- 501 average distance (R) between <sup>[6]</sup>Nb–O or between Fe–O, Ti–O, Ce–O in the case of Nb-substituted
- **502** reference materials. Experimental data are best fitted with a function proportional to  $R^{-3}$  ( $\chi^2 = 0.17$ ),
- **503** rather than a function proportional to  $R^{-5}(\chi^2 = 0.26)$ . Experimental data corresponding to Nb-
- **504** substituted Ti oxides deviate from both models. The error bars on  $\Delta E$  correspond to the instrumental
- **505** resolution of 0.25 eV at the Nb  $L_{2,3}$ -edges.

Table 1

Table 1. Structural and chemical information on the selected Nb minerals. (i), (ii) and (iii) correspond to the three groups of Nb minerals described in the main text. Commercial Nb<sub>2</sub>O<sub>5</sub> was also selected as a reference material. The cation–O distances are Nb–O except for Ti, Fe and Ce oxides which correspond to Ti–O, Fe–O and Ce–O distances. The site symmetry is that of Nb sites in Nb-bearing minerals and of Fe, Ti and Ce in Fe, Ti and Ce oxides, respectively. The distortion index is calculated as defined by Baur (1974). The references giving the structure of each compound can be found in the Supplemental Material.

Mineral (groups i,ii,iii)	groups i,ii,iii) Ideal formula Structure		Coordination number	Site symmetry (Nb, Ti, Fe, Ce)	Average cation–O distances (Å)	Distortion index (%)	Location
Natural samples							
(i) Fluorcalciopyrochlore	(Ca,Na) <sub>2</sub> (Nb,Ti) <sub>2</sub> O <sub>6</sub> F	Corner-sharing NbO <sub>6</sub> octahedra sharing edges with A site cation	6	$D_{3d}$	1.944	0.0	Tatarka. Russia (SU)
(i) Hydropyrochlore	$(\mathrm{H_2O},\square)\mathrm{Nb_2(O.OH)_6(H_2O)}$	Corner-sharing NbO <sub>6</sub> octahedra sharing edges with A site cation	6	$D_{3d}$	1.972	0.0	Lueshe. Congo (SU)
(i) Columbite-(Mn)	(Mn,Fe)(Nb,Ta) <sub>2</sub> O <sub>6</sub>	Chains of edge-sharing NbO <sub>6</sub> octahedra	6	<i>C</i> <sub>1</sub>	2.017	6.0	Musha. Rwanda (ENSMP)
(ii) Niobian perovskite	$CaTi_{1-2x}Fe_xNb_xO_3$	Perovskite structure (ABO <sub>3</sub> ) with interconnected NbO <sub>6</sub> octahedra with interstitial Ca	6	<i>C</i> <sub>1</sub>	1.966	0.6	Oka. Canada (ENSMP)
(ii) Niocalite	$Ca_7Nb(Si_4O_{14})O_3F$	Isolated NbO $_6$ octahedra sharing edges and corners with CaO $_6$ octahedra	6	<i>C</i> <sub>1</sub>	2.049	6.1	Oka. Canada (ENSMP)
Synthetic samples							
(ii) Lueshite	NaNbO <sub>3</sub>	Perovskite structure (ABO <sub>3</sub> ) with interconnected NbO <sub>6</sub> octahedra with interstitial Na	6	С1	1.990	2.8	
(iii) Rutile (5 wt% Nb)	TiO <sub>2</sub>	Edge and corner-sharing TiO <sub>6</sub> octahedra (2 edges are shared with each other)	6	$D_{2h}$	1.956	0.6	
(iii) Anatase (5 wt% Nb)	TiO <sub>2</sub>	Edge-sharing TiO <sub>6</sub> octahedra (4 edges are shared with each other)	6	$D_{2d}$	1.949	1.0	
(iii) Hematite (1 wt% Nb)	$\alpha$ -Fe <sub>2</sub> O <sub>3</sub>	Face and edge-sharing FeO <sub>6</sub> octahedra	6	С3	2.031	4.2	
(iii) Goethite (1 wt% Nb)	α-FeOOH	Chains of edge-sharing FeO <sub>6</sub> octahedra joined by corner-sharing FeO <sub>6</sub>	6	$C_s$	2.026	3.8	
(iii) Cerianite (1 wt% Nb)	CeO <sub>2</sub>	Edge-sharing CeO8 cubes	8	$O_h$	2.343	0.0	
Nb <sub>2</sub> O <sub>5</sub>	Nb <sub>2</sub> O <sub>5</sub>	Edge and corner-sharing NbO <sub>6</sub> octahedra. 1 out of 28 Nb sites is a tetrahedron	6	$C_{I}$	2.014	1.5	

# Table 2

**Table 2.** Summary of the parameters obtained from the fitting procedure including the energy splitting between the features A and B ( $\Delta$ E), the relative intensity ratios (I<sub>A</sub>/I<sub>B</sub>) and the ratio of the B feature width with respect to A feature (FWHM<sub>B/A</sub>). The quality of the fit is assessed using the Pearson chi-squared test ( $\chi^2$ ). The amplitude, center, width and intensity of the pseudo-Voigts can be found in Supplemental Table S3.

		L3-0	edge		L <sub>2</sub> -edge			
Sample	$\Delta \mathbf{E}$ (eV)	$I_A/I_B$	FWHM <sub>B/A</sub>	χ²	$\Delta \mathbf{E} (\mathbf{eV})$	$I_A/I_B$	FWHM <sub>B/A</sub>	$\chi^2$
Nb cerianite	2.55	0.75	1.47	0.06	2.29	0.96	1.73	0.06
Nb <sub>2</sub> O <sub>5</sub>	3.28	0.94	1.73	0.04	3.06	1.24	1.92	0.04
Fluorcalciopyrochlore	3.90	1.18	1.48	0.09	3.83	1.55	1.69	0.06
Hydropyrochlore	3.76	1.07	1.62	0.05	3.64	1.41	1.67	0.04
Columbite	3.41	1.11	1.48	0.06	3.32	1.47	1.73	0.06
Niocalite	3.43	1.17	1.38	0.11	3.44	1.55	1.63	0.10
Lueshite	3.54	1.05	1.68	0.08	3.75	1.42	1.28	0.09
Nb perovskite	3.96	1.20	2.08	0.39	3.95	1.60	2.35	0.16
Nb hematite	3.44	1.08	1.12	0.28	3.47	1.45	1.39	0.10
Nb goethite	3.46	1.08	1.18	0.25	3.48	1.46	1.47	0.11
Nb anatase 1% Nb	3.38	1.10	1.58	0.51	3.30	1.48	1.84	0.19
Nb anatase 5% Nb	3.34	1.14	1.62	0.41	3.29	1.55	1.88	0.17
Nb anatase 10% Nb	3.33	1.14	1.61	0.39	3.28	1.55	1.92	0.15
Nb rutile 5% Nb	3.45	1.03	1.54	0.21	3.31	1.25	1.78	0.09

## Table 3

**Table 3.** Crystal-field multiplet (CFM) parameters that bestreproduce the experimental spectra.

Sample	Nb point group symmetry	Slater integrals reduction	10 <i>Dq</i> (eV)
Nb-substituted cerianite	$O_h$	0.51	2.80
Nb-substituted hematite	$O_h$	0.51	3.70
Hydropyrochlore	$O_h$	0.54	3.90
Nb perovskite	$O_h$	0.35	3.90

Table 4

Table 4. Crystal-field and charge-transfer parameters that best reproduce the experimental spectra.

Sample	Nb point group symmetry	Slater integrals reduction	10 <i>Dq</i> (eV)	U <sub>dd</sub> (eV)	$U_{dc}$ (eV)	∆ (eV)	V <sub>eg</sub> (eV)	$V_{t2g}$ (eV)
Nb-substituted hematite	$O_h$	0.70	2.25	2.0	6.0	4.0	4.0	-2.0



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