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# An atomic-level look at the structure-property relationship of cerium-doped glasses using classical molecular dynamics

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## ABSTRACT

Ce-containing bioactive glasses are of great interest in biomedical field since they exert antioxidant properties associated with low toxicity and a broad spectrum of bacteriostatic activities. The results obtained by classical molecular dynamics simulations allow the elucidation of the correlations between the effect of the inclusion of cerium doping ions into the structure of phosphosilicate and silicate bioactive glasses and their properties. The addition of small quantities of Ce to the silicate bioglass favours the depolymerisation of the silicate network with a positive effect on the ability to dissolve in body fluid. Moreover, the under coordination of both the  $Ce^{3+}$  and  $Ce^{4+}$  species in these glasses enhances their catalytic activity towards hydrogen peroxide. Conversely, the formation of cerium phosphate domains in the phosphosilicate glasses leads to detrimental effects for both the solubility and the catalytic activity of the glasses. Finally, a new quantitative view of the structure-activity relationships governing the macroscopic properties of these glasses has been obtained by means of structural descriptor that takes into account the fragmentation of the Si network and the consequent rearrangement of the modifier ions and the network destruction per cerium unit descriptor.

## 1. Introduction

The increasing popularity of Bioactive glasses is due both to their composition, chemically related to the bone tissue, and their unique dissolution properties in body fluids. The rate of dissolution can be tailored by modulation of the composition of the glass. Thus, critical concentrations of ionic species can be released in the surrounding physiological environment, promoting mineralisation and stimulating the growth and differentiation of osteoblasts at the genetic level.

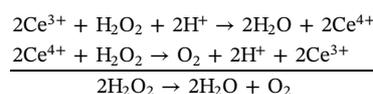
Moreover, incorporation in the glass matrix of optimal amounts of specific ions with physiological activities and therapeutic properties promotes the use of bioactive glasses in a large range of novel applications for advanced therapy in the field of soft tissue regeneration, wound healing, antimicrobial effect, drug release, cancer treatment, etc.... [1,2].

Cerium doped bioglasses have gained considerable interest in the biomedical field because of their role in enhancing osteoblastic differentiation, stimulating the production of collagen, exerting a broad spectrum of antibacterial activity and exhibiting low toxicity [3].

Our interest in this element was recently arisen from its antioxidant properties. The on-going activity of our research group in the field concerns the study of the ability of Ce-containing bioactive glasses to exert antioxidant activity by promoting the decomposition of hydrogen

peroxide ( $H_2O_2$ ) and superoxide ( $O_2^{\cdot-}$ ) radicals in vitro, as the enzymes Catalase [4] and Superoxide Dismutase [5] do at the physiological level, protecting cells from oxidative stress.

We have recently showed that, as in the  $CeO_2$  nanoparticles on which the enzyme mimetic activity was demonstrated for the first time [6], the antioxidant activity of bioglass [7] is related to the multiple valence states of Cerium,  $Ce^{3+}$  and  $Ce^{4+}$ , which are able to catalyse the dismutation reaction of hydrogen peroxide according to the following reactions:



The relative amount of available  $Ce^{3+}/Ce^{4+}$  and the kinetic of redox conversion  $Ce^{3+} \leftrightarrow Ce^{4+}$  depend on the chemical nature of the glass matrix constituents and environment. In particular, the phosphate units present in the glass and/or in the physiological solution, in which the leaching and catalase mimetic activity tests are usually carried out, slow the kinetics of release and of dismutation reactions, subtracting the catalyst by forming an amorphous insoluble phase ( $Ce_2O_3 \cdot CePO_4$ ) [8,9].

To this regards, the glass of composition  $25Na_2O \cdot 25CaO \cdot 50SiO_2$  mol %, proposed by Kokubo et al. [10] is a more efficient catalyst [11].

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However, the additional problem of determining the maximum amount of cerium oxide that can be added to the parent Kokubo glass to imprint optimal anti-oxidant ability without negatively affecting the solubility and then the bioactivity still have to be faced.

Because of their amorphous nature, there is a lack of detailed information on the microscopic structure of the bioglasses, on how the glass network is affected by the different ions making up the glass composition, and how changes in the structure affect the dissolution behaviour and the enzyme-mimetic activity. While molecular dynamic (MD) simulations will never replace laboratory experiments, it is increasingly being used to extract measurement of material properties where existing experimental techniques are unable to or where interpretation of the results of the experiment is difficult or apparently contradictory [12].

In this paper, we review the results obtained on cerium-doped bioglasses by means of the synergic experimental-computational approach developed in our laboratory and we present a new quantitative view of the structure-activity relationships governing the macroscopic properties of these glasses.

## 2. The glass

### 2.1. Glass compositions

Two series of bioactive glasses doped with variable percentages of cerium oxide have been considered for computational simulations studies of bulk materials [4,11]. Their molar compositions are reported in Fig. 1.

The parent glass of the first series, hereafter identified as H series, is the well-known 45S5 Bioglass® [13], whereas the parent glass of the second one (hereafter referred as K series) is the phosphate free glass proposed by Kokubo et al. [10]. K\_5.3 is partially crystallized therefore it has not been used for subsequent analysis.

In addition, bioactive glass nanoparticles (NP) of the same composition of the bulk H\_3.6 and K\_3.6 glasses have also been considered in order to investigate the effect of surface area and reduced size in the structure-property relationships with respect to the bulk glasses [14].

The relative amount of  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  in the two series of glasses studied was determined by XPS [4] and K-edge XANES [15]. The results obtained by the first technique suggested that the amount of the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  is balanced in the K glass ( $\text{Ce}^{3+}/\text{Ce}^{4+} = 1.2$ ), while it is substantially different in the H glass ( $\text{Ce}^{3+}/\text{Ce}^{4+} = 3.5$ ); qualitative

evidences from the second technique suggest that the  $\text{Ce}^{3+}/\text{Ce}^{4+}$  ratio is not significantly dependent on the cerium doping concentration.

### 2.2. Glass MD simulations

The structures of the glasses have been generated through classical MD simulations by using the DL\_POLY package [16]. For the molecular simulations of the bulk materials, a well-established melt-quench computational protocol, described in previous work has been used [4]. Periodic boundary conditions (PBC) were used on a cubic box of side  $\sim 52 \text{ \AA}$  that contains around 10,000 atoms, depending on glass density. The total number of each  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  species in the final box of the H\_3.6 glass is 96 and 27, respectively; whereas in the K\_3.6 glass is 70 and 60, respectively.

The glass nanoparticles have been obtained by removing the PBCs and imposing spherical containing potentials, while quenching from 3200 K to 300 K, until a NP with radius of about  $33 \text{ \AA}$  was obtained [14].

Three independent simulations have been performed for each composition, the typical error associated to the results are on the second digit of the structural properties computed.

The Extended X-Ray Absorption Fine Structure (EXFAS) patterns were calculated for the BG\_5.3 MD-derived three-dimensional structures using the FEFF 8 code [17]. Each EXAFS pattern was averaged over all the non-equivalent cerium atoms within the MD calculated shell (180 for BG\_5.3 and 130 for K\_3.6), including single and multi-scattering paths by atoms within a  $9 \text{ \AA}$  distance from the central atom.

### 2.3. Force field parameters

In order to obtain a reasonable good description of the short and medium-range order of the glass structure at affordable computational costs, an adiabatic core-shell model [18] was used. In this model, the polarizability of oxygen induced by the network environment is straightforwardly included by considering the forces acting on the oxygen shell by the other ions [19]. Parameters for  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  compatible with this force field were derived recently by fitting on the Ce-containing crystal phases available in the literature [20]. Notwithstanding the number of experimental data available for the fitting procedure were scarce, especially for the  $\text{Ce}^{4+}$  species (5 crystalline phases containing  $\text{Ce}^{3+}$  ( $\text{Ce}_2\text{O}_3$ ,  $\text{CeP}_5\text{O}_{14}$ ,  $\text{Ce}_2\text{O}_7\text{Si}_2$ ,  $\text{CePO}_4$  and  $\text{Al}_3\text{CeP}_2\text{O}_{14}\text{H}_6$ ) and 2 crystalline phases containing  $\text{Ce}^{4+}$  ( $\text{CeO}_2$  and

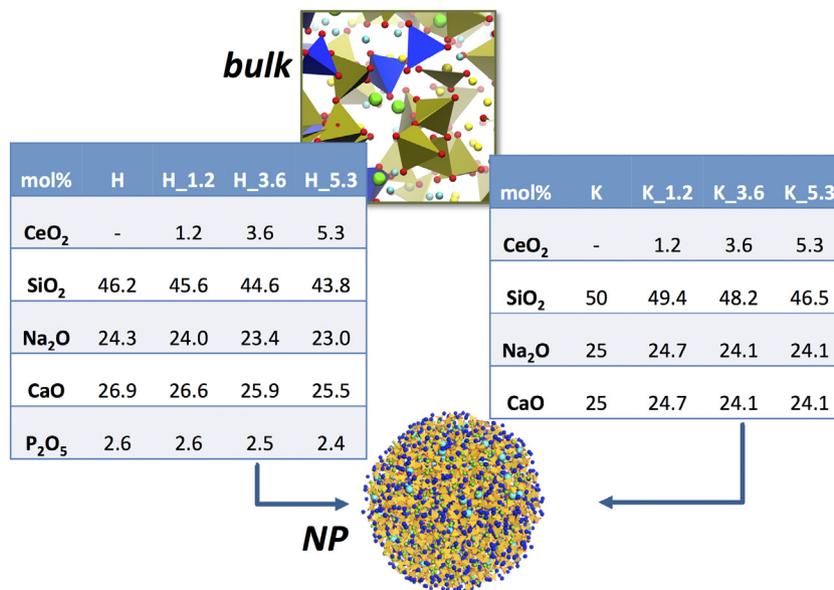
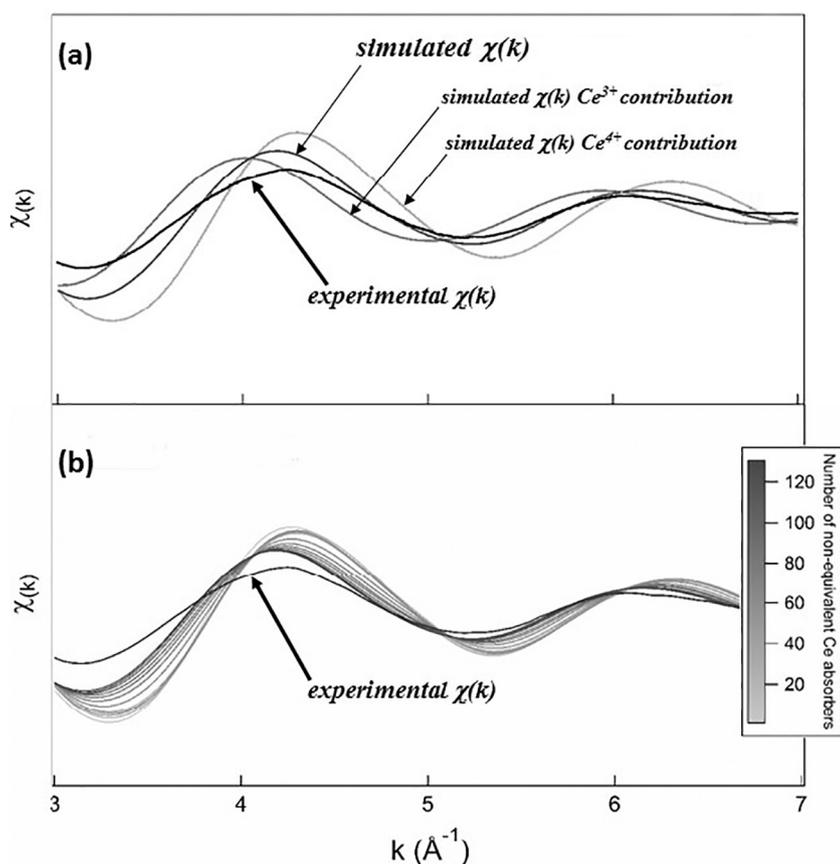


Fig. 1. The composition of the glasses studied as bulk and NP surface.



**Fig. 2.** (a)  $\chi(k)$  simulated for the BG\_5.3 glass by considering all of the cerium atoms contained in MD box, and the contribution due to the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  ions. (b) Evolution of the average  $\chi(k)$  simulated with increasing number of non-equivalent Ce ions in the MD box. In (a) and (b) the experimental  $\chi(k)$  is reported for comparison.

$\text{CeSiO}_4$ ), the force field was found to reproduce satisfactorily the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  environments in silico-phosphate and silico-aluminophosphate glasses.

### 3. Results and discussion

#### 3.1. Force field validation

A valuable way to check the reliability of the intermolecular potentials used and validate MD simulation results is the comparison of the computational results obtained with the structural information derived from the EXAFS spectrum.

Recently, quantitative information on the Ce local atomic environment in samples of the same compositions analysed in the present paper have been obtained by means of Ce K-edge absorption spectra [15].

Fig. 2a shows the measured EXAFS spectrum ( $\chi(k)$ ) of the BG\_5.3 glass in the interval  $3\text{--}7 \text{\AA}^{-1}$  superimposed to the ones simulated by considering the total amount of Cerium in the glass and the contribution of the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  species. It can be appreciated that the similarity between measured and simulated spectra is maximized when both the contributions of the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  ions are considered, confirming that both species are contemporaneously present in the glass. Moreover, Fig. 2(b) shows that the experimental spectrum is better reproduced by increasing the number of possible configurations of the Ce ions present in the simulation box.

Despite the limitations of the parameterization and finite size of the sample used in the MD simulation, the coordination around the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  ions is reasonable well determined by the models obtained, as demonstrated by the good agreement in phase between simulated spectra and measured EXAFS signal in the range considered for first shell fitting. The finite number of non-equivalent cerium atoms in the MD models is responsible for the difference in the amplitude of the signal and the dumping at long-range disorder.

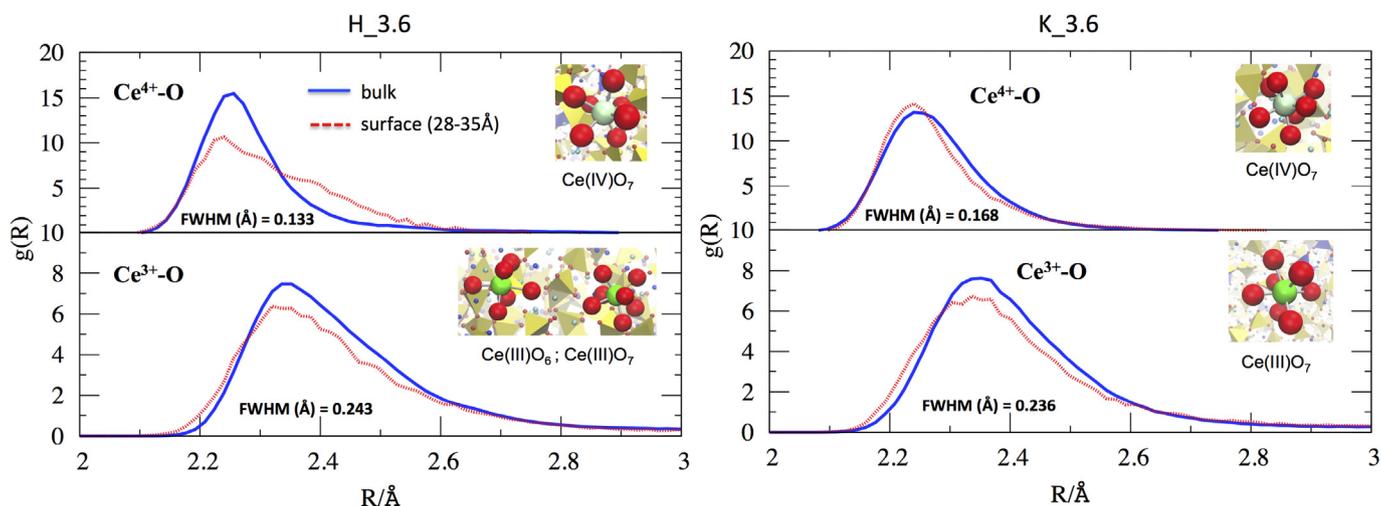
#### 3.2. Structure-activity relationships

##### 3.2.1. Short range order

Overall, the short-range order as detected by the bond distance, bond angles and coordination numbers of the constituting ions is not, or little, affected by the addition of cerium oxide, both in the bulk [15] and at the surface [14].

The silicon and phosphorus ions are four-coordinated in all glass compositions examined. Cerium acts as a modifier cation, being coordinated by non-bridging oxygens (NBOs) only, and strongly competes with Na and Ca ions for NBOs coordination. The Ce-O pair distribution functions in Fig. 3 show data values of full width at half maximum (FWHM) smaller for  $\text{Ce}^{4+}$  with respect to  $\text{Ce}^{3+}$  in both H and K glasses, indicating a more defined local environment for  $\text{Ce}^{4+}$ . In fact, although small amount of 6- and 8-fold coordination are found, the most probable coordination for  $\text{Ce}^{4+}$  ions is 7 (Fig. 3); whereas the 6 or 7 oxygen coordination is equally probable for  $\text{Ce}^{3+}$ . These results are in agreement with the values obtained in previous MD studies on Ce silico-phosphate and aluminosilicophosphate glasses [20,21], and Ce aluminophosphate glasses [22], as shown in Fig. 4. In all cases, a part from the PACS2 glass, the coordination number (CN) of the  $\text{Ce}^{4+}$  species is larger with respect to the one of the  $\text{Ce}^{3+}$  species, in line with the trends observed by EXAFS studies of rare earth phosphate glasses [23] and X-ray diffraction measurements performed on Ce-phosphate glasses [24]. Discrepancies in the results obtained by Du et al. [22] for the PACS2 glass could be ascribed to their use of a rigid model potential. In fact, as it has been shown for the CSP glass [19] this potential yields CN values of 6.7 and 6.5 for the  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  species respectively, with a reverse trend with respect to the core-shell potential (CN = 6.5 and 7.8  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  species respectively).

The higher Lewis acidity of under-coordinated cerium observed in the K series (6.3–6.4 for  $\text{Ce}^{3+}$  ions; 6.7–6.8 for  $\text{Ce}^{4+}$  ions) with respect to the H series (6.5–6.6 for  $\text{Ce}^{3+}$  ions; 7.0–7.08 for  $\text{Ce}^{4+}$  ions) and at



**Fig. 3.** Pair radial distribution functions,  $g(R)$ , for the Ce-O pairs in the H<sub>3.6</sub> and K<sub>3.6</sub> glasses. The data values of full width at half maximum (FWHM) and the typical oxygen arrangements around the Ce ions are reported.

the surface with respect to the bulk enhances its reactivity with positive consequences on its catalytic activity towards hydrogen peroxide.

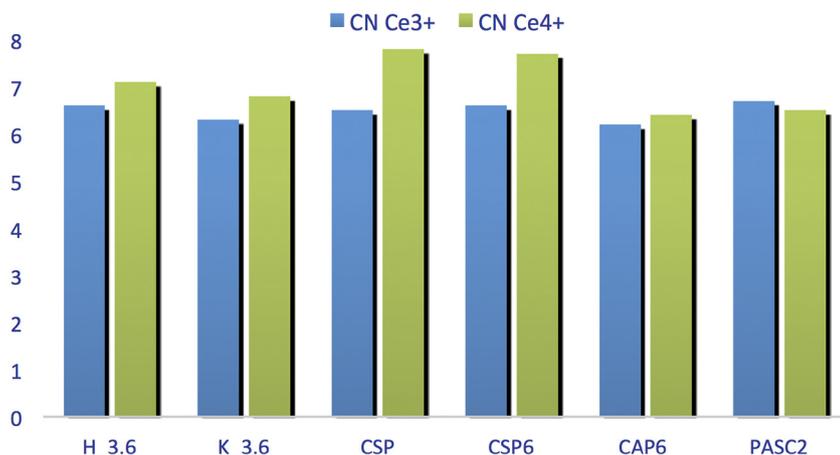
Interestingly, in the H series a moderate increase of the CN of Na (5.4–6.0), is observed as a function of CeO<sub>2</sub> addition (Table 1). This effect, mainly due to the increment of NBOs, is less pronounced in the K series. Overall, the variation in the CN<sub>Ca-O</sub> as a function of CeO<sub>2</sub> addition is only marginal. This picture of the short range environment of Na and Ca ions shows a nice agreement with the results of previous MD and NMR investigations on silicate glasses [23–26].

### 3.2.2. Medium range order: $Q_n$ distribution

The  $Q_n$  distribution (where Q designates “quaternary” and  $n$  the number of bridging oxygens (BOs) connected to the network former cations) provides a measure to detect the effect of CeO<sub>2</sub> on the glass polymerization, and can be summarized in the descriptor network connectivity (NC) defined as the average number of BOs per network-forming [27,28].

The un-doped H and K glasses present a trinomial  $Q_n$ (Si) distribution dominated by  $Q_2$  species (52, 56% respectively) with a similar population of  $Q_1$  and  $Q_3$  species (21.2%) for the K glass, whereas in the H glass the  $Q_3$  species dominates over the  $Q_1$  ones (Fig. 5).

The addition of CeO<sub>2</sub> fragments the glass structure with NC monotonically decreasing from 2.4 and 2.1 to 1.6 and 1.7 for K and H glass, respectively. In the K series, the NBOs necessary to stabilize the first coordination sphere of Ce ions are supplied by the depolymerisation of the silicate network. In fact, the population of  $Q_2$  and  $Q_3$  species



**Fig. 4.** Coordination number of glasses containing cerium oxide ions. H<sub>3.6</sub> and K<sub>3.6</sub> are the silicate glasses presented in this paper. Data for CSP (Ce<sub>2</sub>O<sub>3</sub> 8%, P<sub>2</sub>O<sub>5</sub> 37%, SiO<sub>2</sub> 55%) and CSP6 (Ce<sub>2</sub>O<sub>3</sub> 18%, P<sub>2</sub>O<sub>5</sub> 62%, SiO<sub>2</sub> 17%, Al<sub>2</sub>O<sub>3</sub> 2.3%) are taken from ref. [20]. Data for CAP6 (Ce<sub>2</sub>O<sub>3</sub> 13.8%, P<sub>2</sub>O<sub>5</sub> 69.8%, Al<sub>2</sub>O<sub>3</sub> 16.4%) are taken from ref. [22], and those for PASC2 (Ce<sub>2</sub>O<sub>3</sub> 5%, P<sub>2</sub>O<sub>5</sub> 71.25%, SiO<sub>2</sub> 9.5%, Al<sub>2</sub>O<sub>3</sub> 14.25%) from ref. [21]. Glass compositions are expressed in mol%.

**Table 1**

Average coordination number for the modifier ions.

CN <sub>x-o</sub>	H <sub>1.2</sub>	H <sub>3.6</sub>	H <sub>5.3</sub>	K <sub>1.2</sub>	K <sub>3.6</sub>	K <sub>5.3</sub>
Na-NBO	4.00	4.77	4.81	4.30	4.50	4.60
Na-BO	1.36	1.25	1.20	1.30	1.30	1.20
Na-O	5.36	6.02	6.01	5.60	5.80	5.80
Ca-NBO	5.35	5.40	5.41	5.06	5.20	5.14
Ca-BO	0.47	0.54	0.45	0.50	0.50	0.50
Ca-O	5.82	5.94	5.86	5.56	5.70	5.64

drastically decreases to 43.6% and 10.8%, respectively (for K<sub>5.3</sub>Ce glass), whereas  $Q_1$  increases to about 40%. The effect of CeO<sub>2</sub> addition on the silica network of the H series is less pronounced: phosphorus contributes significantly to supply the NBOs necessary for stabilization of the Ce species. Thus, the amount of orthophosphate ( $Q_0$ ) environment in the BG glass (77%) increases to 89% after the addition of only 5.3 mol% of CeO<sub>2</sub>.

### 3.2.3. Cation-cation coordination

The cation-cation coordination numbers (CN<sub>x-y</sub>) computed by integrating the first peak of the corresponding pair distribution functions provides further insights into the medium range order and chemical disorder of these glasses.

The addition of CeO<sub>2</sub> oxide into the H glass causes a migration of Na ions from the P environment to the Si network promoting the

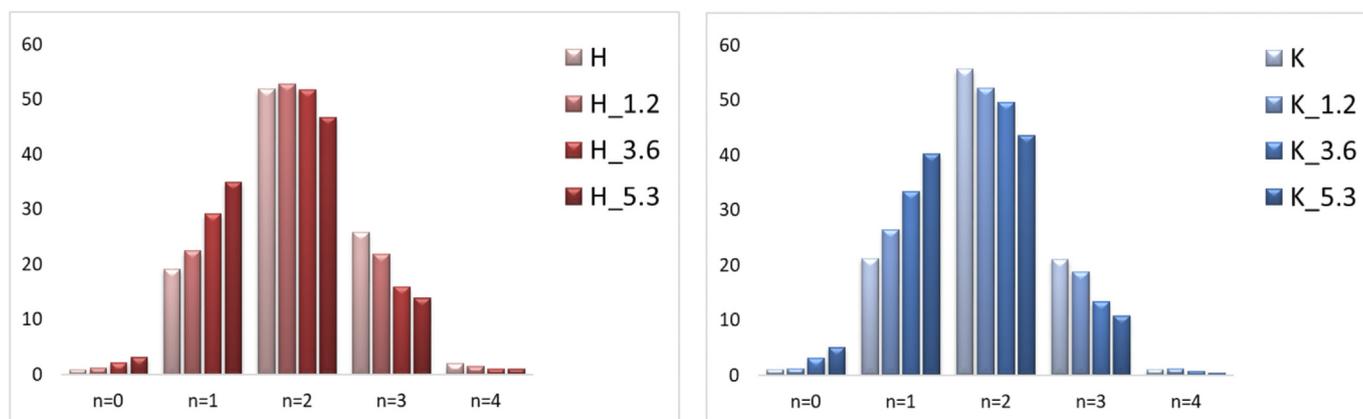


Fig. 5.  $Q_n$  (Si) distributions for the H and K series of glasses.

depolymerisation of the silica network according to the reaction:  $\text{Si-O-Si} + \text{Na}_2\text{O} \rightarrow 2\text{SiONa}$ .

A strong preference of Ce ions to be found in the close surrounding of the phosphate groups is accounted for by the 1.1 value of the P/Si ratio around Ce ions in the MD models, which is about 10 times higher than the nominal one (Fig. 6). This phenomenon is responsible for the reduced release of phosphate ions from the glass network in glasses doped with high concentration of Ce, and, as a consequence, of the loss of the bioactive property. In fact, a stable, insoluble  $\text{CePO}_4$  crystalline phase can be observed by XRD analysis after thermal treatment of the glass samples [29]. Moreover, the segregation of  $\text{Ce}^{3+}$  species in cerium phosphate domains has a detrimental effect also on the catalase mimetic activity of these glasses since both  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  species are necessary for the catalysis of the dismutation reaction of hydrogen peroxide.

The most notable effect induced by Ce addition on the structure of the K series of glasses is observed in the surrounding of the  $\text{Ce}^{4+}$  ions: the number of Si ions around  $\text{Ce}^{4+}$  ions decreases 7.8 to 7.1. Indeed, the presence of  $\text{CeO}_2$  crystal phases in the K\_5.3 glass is observed by XRD measurements on the heat-treated glass [11].

### 3.2.4. Bulk vs surface distribution of modifier ions

The distribution of the modifier species in the H3.6 and K3.6 bulk glasses, with respect to the corresponding ones in the core and surface of the NP glasses is summarized in Table 2. The density ratio  $\text{Ce}^{3+}/\text{Ce}^{4+}$  and  $\text{Na}^+/\text{Ca}^{2+}$  is computed for the NP in a region within 28 Å from the centre of mass (core) and within a spherical shell located between 30 and 33 Å from the centre of mass (surface).

It can be noted that, in general the NP surface is significantly richer of sodium ions with respect to calcium, therefore, once in contact with body fluid, the initial dissolution process should be favoured by the nanosized particles. However, the pronounced pH increase due to the

Table 2

Ratio of the  $\text{Ce}^{3+}/\text{Ce}^{4+}$  and  $\text{Na}/\text{Ca}$  modifier ions in the bulk of the H\_3.6 and K\_3.6 glasses, and in the core and surface of the corresponding nanoparticles.

	H_3.6 $\text{Ce}^{3+}/\text{Ce}^{4+}$	K_3.6 $\text{Ce}^{3+}/\text{Ce}^{4+}$	H_3.6 $\text{Na}/\text{Ca}$	K_3.6 $\text{Na}/\text{Ca}$
Bulk	~3.5	~1.2	1.7	1.9
Core NP	3.5	1.0	1.9	2.0
Surface NP	~13.0	~2.1	5.2	4.5

burst of Na ions exchanged with the surrounding solution can be detrimental to the cells; therefore, a careful optimization of the sodium gradient of concentration should be achieved.

Interesting, the  $\text{Ce}^{3+}/\text{Ce}^{4+}$  ratio at the surface of the NP denotes an almost exclusive presence of  $\text{Ce}^{3+}$  in the H glass, whereas for the K glass the proportion of  $\text{Ce}^{3+}$  and  $\text{Ce}^{4+}$  is more balanced.

According to the results reported by Pirmohamed et al. [30] catalase mimetic activity of nanoceria is inversely related to the concentration of cerium atoms in the +3 oxidation at the surface of the nanoparticle; therefore, Ce doped K-NPs should possess better antioxidant properties compared to the ones derived by conventional bioactive glasses.

### 3.3. Quantitative structure-activity relationships (QSAR)

A major part of the functionality of bioactive glasses originates by their ability to dissolve in body fluid. From the experimental point of view, this property can be modelled by measuring the release of glass ions after soaking in the  $\text{H}_2\text{O}_2 + \text{SBF}$  solution for the two series of glasses. In particular, the amount of released Si, Ca and P ions for the H series, and Si and Ca for the K series after 96 h soaking (Total Leaching) are considered [11]. In fact, according to the mechanism proposed by Hench [31] the initial  $\text{Na}^+/\text{H}_3\text{O}^+$  exchange and pH rise is followed by

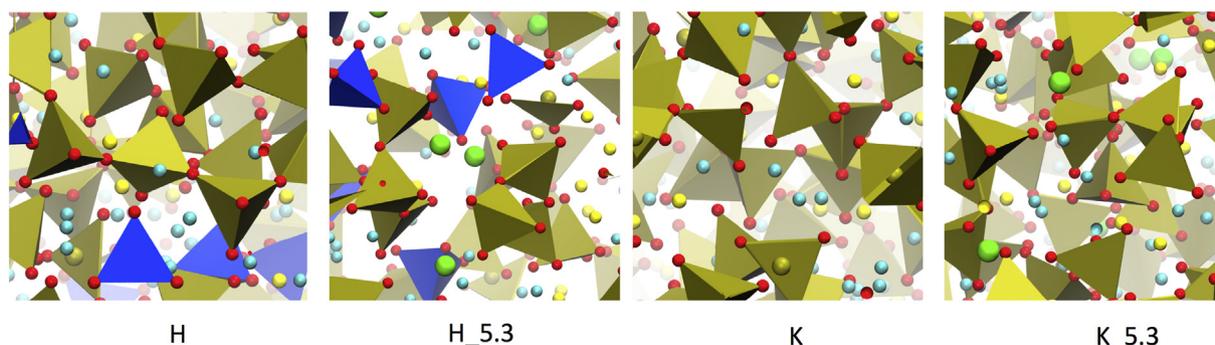
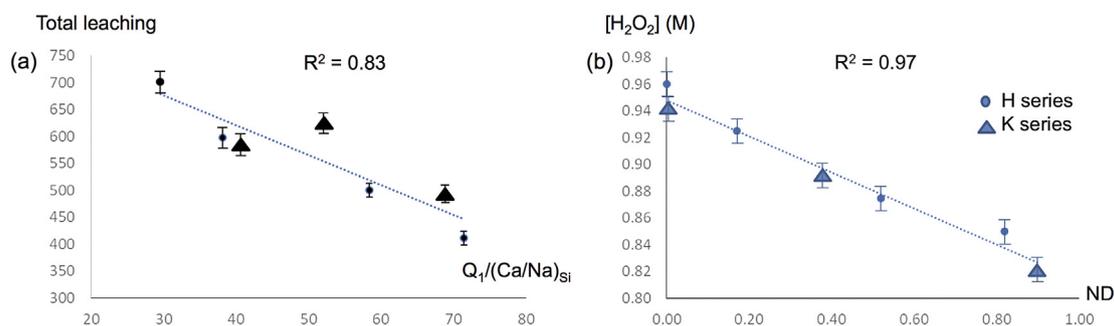


Fig. 6. The structure of in the H\_5.3 and K\_5.3 glasses. Si is represented in dark yellow, O in red, P in blue, Ce in green, Na light blue, and Ca light yellow. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)



**Fig. 7.** (a) Correlations between the experimental Total Leaching data values (ppm) [11] and the structural descriptor  $Q_1 / (Ca / Na)_{Si}$ . The linear regression obtained is: Total Leaching =  $5.54 Q_1 / (Ca / Na)_{Si} + 825.35$   $n = 7$ ,  $R^2 = 0.83$ . (b) Correlations between the experimental concentration of  $H_2O_2$  (M) data values [4,11] and the ND descriptor. The linear regression obtained is:  $[H_2O_2] = -0.13 ND + 0.95$   $n = 7$ ,  $R^2 = 0.97$ .

alkaline hydrolysis of Si-O-Si bonds and subsequent formation of a silica gel layer by condensation reactions between Si-OH groups. The presence of a silica gel layer is thought to aid hydroxyapatite  $Ca_5(PO_4)_3OH$  nucleation.

Suitable structural markers to predict and compare the bioactivity of different glass compositions are related to network connectivity which, as shown by the atomic level picture derived by MD simulations, depends, in a non-trivial way, both on the amount and nature of network forming and modifier ions [32].

Fig. 7a shows the linear correlation obtained between the experimental Total leaching after 96 h soaking in a  $H_2O_2 + SBF$  solution, and the  $Q_1/(Ca/Na)_{Si}$  descriptors derived by the MD simulations. The total amount of released Si, Ca, and P ions is considered for the H series of glasses, whereas, for the K series, only the released Si, Ca ions are summed up.

In both series the ion release in solution decreases as the content of Cerium increases, this phenomenon is well accounted for ( $R^2 = 0.828$ ) by considering that the fragmentation of the Si network ( $Q_1$ ) occurs with a variation in the segregation of Na and Ca ions by the silica network induced by cerium addition to the two series of glasses.  $(Ca/Na)_{Si}$  is the ratio between the number of Ca and Na in the second coordination sphere of Si compared it to the Ca/Na ratio in the nominal glass composition).

The ability of Ce-containing bioactive glasses to inhibit oxidative stress has been tested in vitro in terms of reduction of the concentration of hydrogen peroxide observed after glass soaking. The degradation of hydrogen peroxide is cerium dependent, increasing as cerium content increases in the glasses. Classical molecular simulations cannot provide descriptors related to the interconversion between  $Ce^{3+}$  and  $Ce^{4+}$ , which is a redox reaction of fundamental importance for the exhibition of catalase mimetic activity. However, the results of classical molecular simulations provide elements for a direct or indirect estimation of the availability of Cerium on the glass surface. Qualitative considerations have been presented in the previous paragraphs. From a quantitative point of view, the network destruction per cerium unit (ND) descriptor explains 97% of the variation in the degradation of hydrogen peroxide (Fig. 7b). The main contribution to this descriptor is given by the amount of  $Q_1$  species, since, as shown in Fig. 5, it is the most responsive to Ce addition. Therefore, the availability of Cerium on the glass surface, favoured by a disrupted silicate network, regulates the amount reactive Cerium available for  $H_2O_2$  decomposition; to this regard, the K<sub>3.6</sub> shows the same catalytic efficiency than H<sub>5.3</sub> (residual  $H_2O_2$  concentration 0.85 M vs. 0.82 M, respectively).

It is worth noting that an advantage of the descriptors used in the QSPR models obtained rests in their ability to gather in a single monovariate model two series of glasses structurally significantly different. In this way, the limitation due to an insufficient number of data in the dataset is overcome. This is particularly important in these glasses, where the range of compositions is limited by the occurrence of crystallization and phase separation.

#### 4. Conclusions and perspective

The results obtained by classical molecular dynamics simulations allow the elucidation of the effect of the inclusion of cerium doping ions on the structure and properties of bioactive glasses. In particular, significant differences are observed in the glasses, depending on the presence of phosphate ions in their compositions.

In the K series, the first coordination sphere of Ce ions is stabilized by the NBOs supplied by the depolymerisation of the silicate network, as detected by the rapid increases of the Si  $Q_1$  species upon Ce addition. Conversely, in the H series phosphorus contributes significantly to the stabilization of the  $Ce^{3+}$  species providing an environment rich of orthophosphate ( $Q_0$ ) units. This phenomenon is seminal for the reduced release of phosphate ions from the network of H glasses doped with high concentration of Ce, and, as a consequence, for the loss of the bioactive property. Moreover, the catalase mimetic activity of these glasses is also negatively affected by the formation of cerium phosphate domains, which perturb the equilibrium of the  $Ce^{3+}$  and  $Ce^{4+}$  species necessary for the catalysis of the hydrogen peroxide dismutation reaction.

Interesting, the most notable effect of Ce addition on the structure of the K series of glasses is the reduction of the Si ions in the surrounding of the  $Ce^{4+}$  ions, which may be responsible for the precipitation of  $CeO_2$  crystal phases in glasses with high cerium content (K<sub>5.3</sub> glass).

In addition, the CN of cerium in the K series is smaller with respect to those of the H series for both the  $Ce^{3+}$  and  $Ce^{4+}$  species. This phenomenon is amplified at the surface of the nanoparticles, but it is significant also in the bulk structures. The presence of under coordinated Cerium ions with high Lewis acidity in the K series of glasses affects positively their catalytic activity towards hydrogen peroxide.

Finally, the atomic level picture derived by MD simulations has allowed the derivation of suitable descriptors to obtain sound QSAR models for the quantitative rationalization of the leaching ability of the glasses in  $H_2O_2 + SBF$  solution and the ability to reduce the concentration of hydrogen peroxide observed after glass soaking. In the first case, the 83% of the variance is explained by a structural descriptor that takes into account the fragmentation of the Si network and the consequent rearrangement of the modifier ions; in the second case, 97% of the variance is explained by the network destruction per cerium unit descriptor.

Although the results obtained are of help in the tailoring of specific ion release from bioactive glasses to match clinical requirements, some important challenges have still to be faced. Some of these are strictly connected to the inclusion in the glass matrix of ions with multiple oxidation states, i.e. Cerium whose local site interconversion cannot be directly accounted for by classical force fields. Other, more general ones, concern a rigorous investigation of surface reactivity both of flat and nanoparticle surfaces in water and SBF. Finally, the study of the interaction of glass surface with model systems of blood plasma proteins is mandatory to have information on the fate of glass particles

with specific medical properties once in contact with blood stream.

A promising perspective in these fields is given by the use of reactive potentials that offer an alternative method to simulate structures and chemical reactions with high accuracy, within a MD framework [33,34]. The penalty in computational efficiency is relatively small, but parametrization is hard and it is only available for the silica/water system. Therefore, the development of general and accurate reactive force fields for multicomponent oxide glasses is urgently needed.

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