1	Aggregation and ecotoxicity of CeO <sub>2</sub> nanoparticles in
2	synthetic and natural waters with variable pH, organic matter
3	concentration and ionic strength
4	Karen Van Hoecke <sup>a,</sup> *, Karel A.C. De Schamphelaere <sup>a</sup> , Paul Van der Meeren <sup>b</sup> ,
5	Guy Smagghe <sup>c</sup> , and Colin R. Janssen <sup>a</sup>
6	
7	<sup>a</sup> Laboratory of Environmental Toxicology and Aquatic Ecology, Faculty of Bioscience
8	Engineering, Ghent University, Jozef Plateaustraat 22, B-9000 Gent, Belgium
9	
10	<sup>b</sup> Particle and Interfacial Technology Group, Faculty of Bioscience Engineering, Ghent
11	University, Coupure Links 653, B-9000 Gent, Belgium
12	
13	<sup>c</sup> Laboratory of Agrozoology, Faculty of Bioscience Engineering, Ghent University,
14	Coupure Links 653, B-9000 Gent, Belgium
15	
16	* Corresponding author:
17	Tel.: +32(0)92643710;
18	Fax: +32(0)92643766;

19 E-mail address: karen.vanhoecke@ugent.be

## 20 ABSTRACT

21 The influence of pH (6.0-9.0), natural organic matter (NOM) (0-10 mgC/L) and ionic 22 strength (IS) (1.7-40 mM) on 14 nm CeO<sub>2</sub> NP aggregation and ecotoxicity towards the alga 23 Pseudokirchneriella subcapitata was assessed following a central composite design. Mean 24 NP aggregate sizes ranged between 200 and 10000 nm. Increasing pH and IS enhanced 25 aggregation, while increasing NOM decreased mean aggregate sizes. The 48 h-ErC20s ranged between 4.7 and 395.8 mgCeO<sub>2</sub>/L. An equation for predicting the 48 h-E<sub>r</sub>C20 (48 h-26  $E_rC20 = -1626.4x(pH) + 109.45x(pH)^2 + 116.49x([NOM]) - 14.317x(pH)x([NOM]) +$ 27 28 6007.2) was developed. In a validation study with natural waters the predicted 48 h-ErC20 29 was a factor 1.08-2.57 lower compared to the experimental values.

30

### 31 KEYWORDS

- 32 CeO<sub>2</sub> nanoparticles alga natural organic matter natural waters
- 33

# 34 CAPSULE

- 35 CeO<sub>2</sub> nanoparticle aggregation and toxicity depend on abiotic factors such as pH, NOM and
- 36 IS. Effect concentrations can be predicted as a function of pH and NOM.

### 37 INTRODUCTION

38 The lanthanide oxide  $CeO_2$  in its nanoparticulate form is currently being used as a 39 diesel fuel additive, as a constituent of catalytic converters and as a UV blocking agent. 40 Therefore,  $CeO_2$  NPs are expected to enter the environment, where they may pose a 41 potential risk to aquatic and sediment organisms. The need for an environmental effects 42 assessment of these nanomaterials was expressed by international organisations such as the 43 Organisation for Economic Cooperation and Development (OECD) (OECD, 2008). A 44 previous study generated acute and chronic ecotoxicity data for three sizes of CeO<sub>2</sub> NPs 45 (14, 20 and 29 nm) according to the standard OECD test methods (Van Hoecke et al., 46 2009)..For 14 nm CeO<sub>2</sub> NPs, a 48 h 20 % effect concentration on *P. subcapitata* growth 47 rate (48 h-ErC20) (SD) of 3.5 (0.8) mg/L was obtained in the standard OECD algal test 48 medium at pH 7.4. Despite the usefulness of the standard test medium in comparing 49 experimental results, concerns have been raised regarding its environmental relevance for 50 ecotoxicity tests with manufactured nanomaterials (Crane et al., 2008; Handy et al., 2008). 51 Indeed, since physico-chemical water characteristics such as pH, ionic strength (IS) and 52 natural organic matter (NOM) concentration can vary greatly among natural surface waters, 53 the use of just one test medium at pH 7.4, low IS (1.7 mM) and in absence of NOM may 54 not be representative for realistic waters. Moreover, the above mentioned abiotic factors are 55 also known to be important parameters determining nanoparticle surface characteristics and 56 aggregation behaviour.

57 The goals of the present study were (1) to investigate the influence of the abiotic 58 factors pH, NOM concentration and IS on  $CeO_2$  NP aggregation and toxicity towards the 59 unicellular alga *Pseudokirchneriella subcapitata*, (2) to develop an empirical model which 50 predicts the 48 h-E<sub>r</sub>C20 of the alga as a function of pH, NOM and IS of the medium and 61 finally, (3) to validate the empirical model using four natural surface waters with various62 characteristics.

In a first experiment, CeO<sub>2</sub> toxicity and stability was investigated in standard algal 63 64 test medium supplemented with NOM. In a second part of the study, 17 synthetic test 65 media with different characteristics were prepared following a central composite 66 experimental design (CCD). Subsequently, 48 h-ErC20 for P. subcaptitata was determined 67 in each of these media. Non linear regression analysis allowed to mathematically express 68 the relations between the abiotic factors and the established 48 h-ErC20. Finally, the 69 predictive value of the developed model was assessed using 4 natural surface waters with various characteristics. 70

The empirical model can be used for predicting effect concentrations of  $CeO_2$  NPs in natural waters when basic water characteristics, i.e. pH and NOM concentration, are known.

74

# 75 MATERIALS AND METHODS

#### 76 *CeO*<sub>2</sub> *nanoparticles and natural organic matter*

Crystalline 14 nm CeO<sub>2</sub> NPs were supplied by an industrial NanoInteract project partner (cfr. supporting information). The particles were dried after synthesis and were redispersed into Milli-Q water by ball milling. Prior to the redispersion, the pH of Milli-Q water was set to 4 using diluted nitric acid. A final stock of 100 g/L CeO<sub>2</sub> NPs was obtained. A detailed characterization of the particles, including the particle size distribution, the isoelectric point and the cerium oxidation state in the stock suspension is described in Van Hoecke et al. (2009). More details are given in the supporting information.

84 The natural organic matter (NOM) was sampled from a creek in Bihain, Belgium,
85 using a portable reverse-osmosis based device (RealSoft PROS/2S) in order to concentrate

NOM as described by Serkiz and Perdue (1990) and Sun et al. (1995). The sampling
procedure is described in more detail in De Schamphelaere et al. (2003).

88 *NOM adsorption studies* 

89 The amount of NOM adsorbed to CeO<sub>2</sub> NPs in 20 ml OECD medium (OECD, 90 2006) containing 8.0 mg C/L NOM was measured under various conditions of pH (6.0, 7.5 91 and 9.0) and NaCl concentrations (0, 20 and 40 mM). A high concentration of CeO<sub>2</sub> NPs 92 was necessary to be able to detect a significant adsorption of NOM to the particle surface. 93 Therefore, suspensions containing 220 mg CeO<sub>2</sub>/L were incubated at 25 °C under 94 continuous illumination for 48 h. Twice a day, pH values were checked and adjusted when 95  $\geq 0.2$  pH units deviation was observed. The increase in IS due to pH adjustments was  $\leq 0.2$ 96 mM. At the end of the incubation period, two 10 ml samples of each medium were 97 centrifuged for 15 minutes at 2000g. Finally, 7 ml of the supernatant was used for NOM 98 analysis, for which a TOC-500 (Shimadzu, Duisburg, Germany) carbon analyzer was used. 99 The experiment was performed twice. One-way ANOVA ( $\alpha = 0.05$ ) was performed to 100 establish the significance (p < 0.05) of pH and/or IS on NOM adsorption.

101 One factor experiment

102 In the one factor experiment, only the concentration of NOM was varied. Two 103 environmentally relevant concentrations for river water in cool and warm temperate 104 climates, in which NOM ranges between 2 and 15 mg C/L with means of 3 and 7 mg C/L, 105 respectively (Thurman, 1985). Test suspensions were prepared by dropwise addition of the 106 14 nm CeO<sub>2</sub> NP stock suspension in stirred standard OECD algal medium to which 3.6 mM 107 3-(N-Morpholino)propanesulfonic acid (MOPS) buffer (pH 7.4) and the desired amount of 108 Bihain NOM (2.2 and 7.4 mg C/L) were added. Test medium containing NOM without 109 addition of CeO<sub>2</sub> was used as control medium. Concentrations of CeO<sub>2</sub> NPs ranged

110 between 3.2 and 180 mg CeO<sub>2</sub>/L. The NOM concentration was monitored daily in a 111 control medium replicate without addition of buffer.

112 *Multivariate experiment* 

The three factor (pH, NOM and IS) experiment, was performed according to a complete second-order three factor central composite design (CCD) in three experimental blocks, which consisted of 17 algal growth inhibition tests (Box and Draper, 1987). The pH of the algal test medium was varied between 6.0 and 9.0, NOM concentrations were varied between 0 and 10 mg C/L and NaCl was added in concentrations ranging between 0 and 40 mM. The nominal values of the three factors in each of the 17 test media are presented in **Table 1**.

120 The 17 test media were prepared by addition of 3.6 mM buffer and the desired 121 amount of NOM to the standard OECD algal test medium and subsequent pH adjustment 122 using HCl or NaOH. To maintain a pH value of 6.0 2-(N-Morpholino)ethanesulfonic acid (MES) buffer was used, while MOPS buffer adequately stabilized the media pH at values 123 124 6.6 and 7.5. The 8.4 and 9.0 pН values required addition of 2-125 (Cyclohexylamino)ethanesulfonic acid (CHES) buffer. In order to assure an equal 126 minimum conductivity across the whole pH range, the test media were equilibrated at 25 °C 127 and conductivity of all media was set to 375 µS/cm using NaCl before addition of the 128 amount of NaCl as specified in the CCD. Finally, CeO<sub>2</sub> NP stock suspension was added by 129 dropwise addition to the stirred media, until desired concentrations between 2.2 and 460 mg 130 CeO<sub>2</sub>/L were reached.

131 During the algal growth inhibition tests, pH, NOM and conductivity were monitored 132 daily. A pH electrode (P407, Consort, Turnhout, Belgium) was used to measure pH. In case 133  $\geq 0.2$  pH units deviation from the theoretical value was observed, pH was adjusted using 134 1 M NaOH or HCl solutions. The media at pH values 8.4 and 9.0 were checked twice a day.

Natural organic matter concentrations were monitored in a buffer free replicate in OECD algal test medium incubated under the same conditions as the algal growth inhibition tests. Finally, conductivity measurements using a cond 315i portable device equiped with a TetraCon 325 electrode (WTW, Weilheim, Germeny) were performed to monitor the IS in all test suspensions, according to the method described by Simon and Garcia (1999). More details on the relation between electrical conductivity and IS can be found in the supporting information.

### 142 Particle size distribution analysis

Particle size distributions of the 22.0 mg/L 14 nm  $CeO_2$  NP suspensions were analyzed using dynamic light scattering (DLS) three days after the start of the algal growth inhibition test. In case of severe aggregation resulting in aggregates with a Z-average hydrodynamic diameter (as determined by DLS) > 1000 nm, laser diffraction was performed with a Mastersizer (Malvern Instruments, Worcestershire, UK) equiped with a 300 RF fourier lens to analyze particle size distributions. More details on instrument settings can be found in the supporting information.

150 *Algal toxicity testing* 

151 The green alga Pseudokirchneriella subcapitata (Korshikov) Hindak was obtained 152 from the Canadian Phycological Culture Centre (CPCC, Waterloo, Canada). Algae were 153 continuously cultured in two fold diluted ES-medium (Provasoli, 1966) prepared in carbon 154 filtered aerated Ghent city tap water. The resulting medium was supplemented with 1.4 155 mg/L FeSO<sub>4</sub>.7H<sub>2</sub>O, 15 mg/L NaH<sub>2</sub>PO<sub>4</sub>.2H<sub>2</sub>O, 150 mg/L NaNO<sub>3</sub> and 2.35 mg/L 156 MnCl<sub>2</sub>.4H<sub>2</sub>O. Four days prior to the start of a series of algal growth inhibition experiments, 157 a new algal culture was prepared and allowed to grow on a shaking table at  $20 \pm 1$  °C under continuous illumination (70  $\mu E/(m^2.s^1)$ ). 158

159 Each of the test media from both the one factor and the multivariate experiment was 160 used to prepare one control medium and five different test concentrations of CeO<sub>2</sub> NPs. 161 Equilibration took place overnight at 25 °C in the dark. Subsequently, four 50 ml portions 162 of each concentration were transferred to 100 ml erlenmeyer flasks, three of which were 163 inoculated with 10,000 cells/ml of the grown culture and one was used as a background correction. One 50 ml portion of a 22.0 mg CeO<sub>2</sub>/L suspensions was sealed with parafilm® 164 165 to serve for aggregation behaviour analysis. All flasks were incubated at 25 °C under 166 illumination and were shaken manually three times a day. After 24, 48 and 72 h, the algal 167 cell density was measured using a cell counter (Beckman Coulter Counter, Ghent, 168 Belgium). The average specific growth rate  $\mu$  (1/d) in each concentration was calculated 169 after 48 h exposure, because the test validity criteria were not met in 4 experiments of the 170 CCD when data was analyzed after 72 h. More specifically, the mean coefficient of 171 variation (CV) on sectional growth rate, which checks for exponential growth in the control 172 throughout the test, was > 35 %. In this case the OECD test protocol prescribes the use of 173 48 h toxicity data.

174 Data treatment and analysis

175 Either a log-logistic or a modified log-logistic model (Van Hoecke et al., 2009), was chosen to fit the concentration-response curves, depending on the highest correlation 176 177 coefficient. Effect concentrations and their 95 % confidence intervals were calculated with Statistica® (Statsoft, Tulsa, OK, USA). First, the effect of nominal pH, NOM and IS 178 179 (independent variables) on the control growth rates was analyzed using Statistica's CCD 180 feature. Subsequently, the CCD analysis was applied to the 48 h-E<sub>r</sub>C20s in order to identify 181 any significant linear, quadratic and interaction effects. Subsequently, non linear least 182 squares regression analysis using measured factor levels was applied to develop an 183 empirical model and to assess the variability explained by the different linear and quadratic

184 effects. The Levenberg-Marquardt algorithm was used to estimate regression coefficients 185 (Moré, 1977). Additional factors were added according to a minimisation of the Akaike 186 information criterion (Akaike, 1974). Throughout the study, a significance level ( $\alpha$ ) of 0.05 187 was adopted.

188 Validation study with natural waters

189 Four natural waters, Ankeveensche Plas (a lake system in lowland peat area, Nederhorst den Berg, NL), Markermeer (part of a large lake cut off from the North Sea by a 190 191 dam, Marken, NL), Le Voyon (a small stream in a forested area, Trélon, Fr) and Ourthe 192 orientale (a river in mixed forest, Brisy, BE) were used in a validation study. Table 1 193 contains some characteristics of these waters. One day prior to the start of an algal growth 194 inhibition test, all natural waters were filtered through a 1.2 µm Whatman glass microfiber filter and through 0.8 and 0.45 µm Pall Supor<sup>®</sup> membrane filters. In order to meet the 195 196 OECD validity criteria for algal testing (OECD, 2006), natural waters had to be supplied 197 with all nutrients in the same concentration of the standard OECD algal test medium prior 198 to buffer addition and spiking of 14 nm CeO<sub>2</sub> NP stock suspensions. Subsequently, tests 199 and measurements were performed as described above.

### 200 **RESULTS**

201 Preliminary one factor study of influence of NOM on CeO<sub>2</sub> NP toxicity and stability

Addition of NOM to the OECD algal test medium prior to spiking  $CeO_2$  NPs highly affected both  $CeO_2$  suspension stability and toxicity in comparison with the NOM free standard OECD algal test medium at pH 7.4. The particle size distributions and concentration-response curves are presented in **Figures 1 and 2**, respectively. While severe aggregation in absence of NOM resulted in a in a mean particle size of 4500 nm, the NOM stabilized small particle aggregates of 100-200 nm. Pictures are given in the supporting information. At the low NOM concentration of 2.2 mg C/L, 48 h-ErC10 and ErC20 values

increased with 7.7 and 7.4 fold up to 16.2 and 26.0 mg CeO<sub>2</sub>/L compared to the NOM free medium, respectively. At 7.4 mg C/L, the effect concentrations increased 31.5 and 23.3 fold up to 66.4 and 81.6 mg CeO<sub>2</sub>/L, respectively. A linear relationship between the NOM concentration and the effect concentrations was found (Figure 1 panel B).

213 NOM adsorption to CeO<sub>2</sub> NPs

The amount of NOM adsorbed to  $CeO_2$  NPs varied between 0.006 and 0.062 mg C in a 220 mg CeO<sub>2</sub>/L suspension, which corresponds to 0.0014 and 0.014 mg C/mg CeO<sub>2</sub>. **Table 2** shows the amount of NOM adsorbed as a function of pH and IS. One-way ANOVA indicated that pH significantly influenced NOM adsorption (p =  $1.8 \times 10^{-5}$ ), with higher adsorption observed at pH 6 compared to pH 9. No significant influence of IS was observed.

220 Central composite design to test the influence of pH, NOM and IS on aggregation

221 behaviour and 48 h-E<sub>r</sub>C20 of CeO2 NPs

222 In all test media particle aggregation occurred. Mean particle aggregate sizes as 223 determined by DLS (media no. 3, 4, 5, 8 and 16 as listed in Table 1) or laser diffraction are 224 given in Table 1. Predominantly in media with low pH and in presence of NOM severe 225 aggregation was prevented, resulting in Z-average hydrodynamic diameters of a few 226 hundred nanometer in media 4, 5, 8 and 16. Also in medium 3 with high pH and NOM 227 concentration, but low IS, the mean particle size was < 1000 nm. In all other media severe 228 aggregation to particles > 1000 nm occurred. In the CCD analysis, all linear main effects were significant with p-values of 2.0x10<sup>-4</sup>, 0.013 and 0.022 for pH, NOM concentration and 229 230 IS, respectively. Increasing pH and IS enhanced aggregation, while increasing NOM 231 concentration decreased the tendency towards aggregation. Furthermore, a significant 232 quadratic pH effect was identified with a p-value of 0.020. A scatterplot of mean aggregate 233 sizes as determined by DLS or laser diffraction as a function of pH, NOM and IS is given in Figure 3. The pH was found to be the dominant factor, as derived from the ratio of the
pH's sum of squares (SS) to the total SS. The ratio was 0.682 for linear and quadratic pH
effect, while it was only 0.091 and 0.070 for NOM concentration and IS, respectively.

237 The CCD analysis first revealed a significant linear and quadratic pH effect on the 238 growth rate of algae in the control. The p-values for these effects were 0.032, and 0.0036, 239 respectively. Table 1 contains all control growth rates. The control growth rate at pH 9 (experiment 17) was only 0.97/d. Furthermore, the validity conditions of this algae test 240 241 were not met. More specifically, the algal cell density in the control did not increase with a 242 factor of 16 within 48 h and the mean sectional CV was > 35 %, indicating the deviation 243 from exponential growth in the control replicates. Therefore, data point 17 in Table 1 was 244 deleted from subsequent non linear regression analysis.

245 The 48 h-E<sub>r</sub>C20 values and their 95 % confidence interval are given in Table 1. A 246 factor of 84 separates the lowest  $E_rC20$  value of 4.7 from the highest of 395.8 mg CeO<sub>2</sub>/L. 247 Significant linear pH and NOM effects (p = 0.0041 and 0.017, respectively) were found in the CCD analysis, while pH also showed a significant quadratic effect ( $p = 1.8 \times 10^{-4}$ ). 248 249 Furthermore, an interaction effect between pH and NOM was identified (p = 0.030). Except 250 for pH values of 8.4, increasing the NOM concentration lead to a decrease in toxicity, 251 which is in agreement with the first experiment. Figure 4 plots the 48 h-E<sub>r</sub>C20s as a 252 function of the three factors. The significant effects identified by the CCD were 253 subsequently used in the non linear regression analysis in order to derive an empirical 254 model. As a result, a mathematical expression of the form: 48 h-E<sub>r</sub>C20 = Ax(pH) +  $Bx(pH)^2 + Cx([NOM]) + Dx(pH)x([NOM]) + E$  was derived. In this equation, pH and 255 256 [NOM] are expressed numerically, with [NOM] expressed as mg C/L. Table 3 summarizes 257 the parameter coefficients, standard errors, p-values and percentage of total variability explained by each effect. In total, 93.7 % of the variability in 48 h ErC20 values could be 258

explained by the variation in pH and NOM concentration. The overall p-value of the least squares regression was 2.9x10<sup>-7</sup>. A graphical illustration and description of the model outcome as a function of pH and NOM concentration can be found in the Supporting information section.

263 Validation study

264 Also in natural surface waters the  $CeO_2$  NPs aggregated up to particles > 1000 nm. 265 The mean aggregate sizes determined by laser diffraction are shown in **Table 1**. The 266 experimentally determined 48 h-ErC20 values in the 4 natural waters ranged between 46.3 267 and 103.2 mg CeO<sub>2</sub>/L. Table 1 contains both observed and predicted 48 h-E<sub>r</sub>C20 and their 268 ratios. The concentration-response curve obtained in Markermeer natural water was not 269 monotonous, giving rise to the large confidence interval of the measured 48 h-ErC20 value 270 (Table 1). For all natural waters, the predicted  $E_rC20$  was lower than the experimentally 271 determined value and the difference between observed and predicted value differed with a 272 factor of 1.08 to 2.57. When considering the experimentally determined 95 % confidence 273 intervals, the model predicted effect concentration of 55.2 mg/L for Le Voyon and of 31.5 274 mg/L for Ourthe Orientale are both values not contained within the experimentally 275 determined 95 % confidence intervals (see Table 1).

### 276 **DISCUSSION**

#### 277 Effect of NOM only

The preliminary experiment in NOM containing medium demonstrated the stabilizing effect of NOM on CeO<sub>2</sub> NPs. Similarly, Keller et al. (2010) and Quik et al. (2010) demonstrated the stabilization of small CeO<sub>2</sub> NP aggregates of a few hundred nm by NOM. Also other types of NPs can be stabilized by NOM, e.g..carbon NPs (fullerene as well as carbon nanotubes (CNT)) (Chen and Elimelech, 2007; Hyung et al., 2007), TiO<sub>2</sub> and ZnO NPs (Keller et al., 2010). The Z-average hydrodynamic diameter around 100 nm corresponded to small aggregates which were already present in the stock suspensions in deionized water at pH 4 (Van Hoecke et al., 2009). As a result, the NOM was able to prevent further aggregation in the test medium but was unable to overcome the strong van der Waals forces holding small NP aggregates together. A similar conclusion was drawn by Walker and Bob (2001).

All effect concentrations for  $CeO_2$  NPs were found within the mg/L concentration range, which is very high in comparison with predicted concentrations in the environment (O'Brien and Cummins, 2010). Therefore, a low risk quotient is expected, especially in presence of NOM.

### 293 Influence of multiple abiotic factors on CeO<sub>2</sub> NP toxicity and aggregation behaviour

294 A more complex situation arose when in addition to NOM concentration pH and IS of 295 the test media were varied. Concerning the ErC20 values in Figure 4, three groups can be 296 identified. First, media containing  $\geq$  5 mg C/L NOM at low pH resulted in low toxicity (48) 297 h-E<sub>r</sub>C20  $\geq$  183 mg/L) as represented by data points 4, 8 and 16. The highest toxicity (48 h-298  $E_rC20 \le 11.0 \text{ mg/L}$ ) was found for media 1 and 13, i.e. at the highest pH of 8.4 in presence 299 of only 2 mg C/L NOM and at pH 7.5 in absence of NOM, respectively. Finally, the largest 300 group of media caused an intermediate toxicity. In general, this group contained media with 301 low NOM concentration at low pH and media with high NOM concentration ( $\geq$  5 mg C/L) 302 at high pH. The CCD's central point also resulted in an intermediate toxicity. These 48 h-303 ErC20s can be used to evaluate the reproducibility of the algal growth inhibition tests. With 304 a relative standard deviation of 13.6 % on data points 2, 6 and 11 the reproducibility was 305 good.

For all synthetic waters, effect concentrations for  $CeO_2$  NPs were similar or higher compared to previously reported low mg/L values obtained in standard algal tests (Van Hoecke et al., 2009; Rogers et al., 2010). This indicates that the standard algal tests can be 309 considered a worst case scenario for the CeO<sub>2</sub> NPs. On the other hand, if toxicity is highly 310 overestimated for certain waters, this might lead to overly conservative environmental 311 quality standards. Using the developed model, the discrepancy between the toxicity in 312 standard test medium and in a more realistic test medium containing NOM can be 313 minimized up to a factor of 3.2, according to the ratio of observed towards predicted  $E_rC20$ 314 values given in **Table 1**. When no NOM was added, medium 13, a negative value was 315 predicted. Therefore, the model is of no use for media without NOM around pH 7-8.

When combining data on mean aggregate size and 48 h-E<sub>r</sub>C20, it became clear that the more stable suspensions gave rise to the lowest observed toxicities (data points 4, 8 and 16 listed in Table 1). In Figure S5 in supporting information, the logarithms of 48 h-E<sub>r</sub>C20 of each medium are plotted against average aggregate sizes as determined by DLS and laser diffraction. Interestingly, a negative linear relationship was established (p =  $1.6 \times 10^{-10}$ ).

321 A clear relation between CeO<sub>2</sub> toxicity and aggregation behaviour and the affinity 322 towards NOM adsorption follows from Figures 3 and 4 and Table 2. For CeO<sub>2</sub> toxicity and 323 stability as well as its affinity towards NOM, the pH was the dominant factor. Adsorption 324 of NOM was favoured at low pH values (6, 6.6), which resulted in the lowest toxicity and 325 highest stability observed. On the other hand, NOM adsorption decreased as pH increased, 326 which adversely affected stability and toxicity. From these observations, it was clear that 327 adsorption of NOM to the CeO<sub>2</sub> NP surface prevented the particles form directly interacting 328 with each other and with algal cells. The decrease in toxicity therefore was due to a 329 reduction in bioavailability of the particles. A similar observation was made by Li et al. 330 (2010), who reported a decrease in the toxicity of zerovalent iron NPs towards E. coli, 331 which the authors attributed to the loss of adhesion of NOM coated particles to the bacterial 332 cell wall.

333 The observations concerning NOM adsorption as a function of pH are in agreement 334 with previous research on NOM adsorption to oxide surfaces by Au et al. (1999). In this 335 study, a decrease in NOM adsorption density was observed with increasing pH. At high pH, 336 lateral repulsion of charged NOM fragments bound to the particle surface prevented 337 additional NOM molecules from adsorbing to the surface. On the other hand, the adsorbed 338 NOM layer protruded further from the NP surface into the solution at higher pH. At low 339 pH, the NOM bore less negative charges, which resulted in lower repulsion and hence 340 higher adsorption density. In our experiments, decreased NOM adsorption at pH 9 could also be due to an increased concentration of  $CO_3^{-2}$ , which could have competed with NOM 341 for adsorption to the CeO<sub>2</sub> surface. At lower pH values, the species  $H_2CO_3$  and  $HCO_3^-$ 342 343 dominated.

344 The relation between NOM adsorption and pH might as well explain the observed 345 quadratic pH effect in the toxicity model. Since at intermediate pH values NOM adsorption 346 is lower compared to pH 6 and the NOM layer does not extend far into the solution, as 347 expected at the highest pH values, a maximum direct interaction between the CeO<sub>2</sub> NPs and 348 algal cells can be expected around pH 7.5, which would explain the maximum toxicity 349 observed at pH 7.5. According to Au et al. (1999), increasing the IS enhanced NOM 350 adsorption, since NOM fragments were able to coil when its negative charges were partly 351 shielded by the positive counterions of the electrolyte, thereby reducing steric and 352 electrostatic repulsion. However, increasing the IS lead to a compression of the electrostatic 353 double layer, which adversely affected the stabilising potency of the NOM and thereby the 354 stability of the particle suspensions. A decrease in stabilising potency of the NOM at higher IS was also observed in the present study, however, no enhancement of the NOM 355 356 adsorption was noted within the range of IS studied. Several studies with various NP types reported similar behaviour as a function of pH and IS in presence of NOM. For example, 357

358 Domingos et al. (2009) found increased aggregation of 5 nm  $TiO_2$  NPs with increasing IS 359 and in general, the tendency towards aggregation increased under conditions that were 360 unfavorable for NOM adsorption. Furthermore, increased stability of Au NPs was observed 361 in presence of NOM by Diegoli et al. (2008). Once again, high IS was capable of 362 eliminating the enhanced stability of NOM coated Au NPs.

### 363 *CeO*<sub>2</sub> *NP toxicity and behaviour in natural waters*

364 The observed ErC20 values in the four natural waters corresponded to the predicted 365 values within a factor of 2.57. In previous experiments with the 14 nm CeO<sub>2</sub> NPs the 366 individual 48 h-ErC20 measurements differed by a factor of 2.1. As a consequence, the 367 discrepancy between measured and model predicted 48 h-ErC20s cannot be explained by 368 experimental variability only. The composition of NOM is known to differ between natural 369 waters and could have influenced the adsorption affinity and stabilizing potency towards NPs. Secondly, the higher concentration of divalent ions such as  $Ca^{2+}$  and  $Mg^{2+}$  in the 370 371 natural waters compared to the synthetic waters may help explain the observed discrepancy. 372 The test media used in the CCD analysis all have a hardness of 24 mg CaCO<sub>3</sub>/L. With 373 exception of Le Voyon natural water, the river waters all have a much higher hardness of 53-267 mg CaCO<sub>3</sub>/L. The divalent ions Ca<sup>2+</sup> and Mg<sup>2+</sup> are also more effective in 374 375 destabilising particle suspensions, which is known as the Schulze-Hardy rule. Furthermore, Sander et al. (2004) reported the ability of  $Ca^{2+}$  at a concentration of 10 mM to bridge 376 377 adsorbed NOM layers on several particles, thereby enhancing the aggregation process. 378 Therefore, the large mean aggregate sizes observed in natural waters (Table 1) may be 379 partly explained by the higher hardness.

To the best of our knowledge, no ecotoxicity studies on  $CeO_2$  NPs in natural waters have been published. However, several studies on metal and metal oxide NPs experimentally confirmed that water characteristics can have important implications for

383 either or both NP toxicity and stability. Wiench et al. (2009) reported lower sedimentation 384 of TiO<sub>2</sub> NPs in NOM containing pond water, while Gao et al. (2009) limited aggregation of 385 Ag and Cu NPs up to 100 nm in natural waters with high NOM and low salt contents. They 386 furthermore found that the stabilising effect was counteracted when IS increased, which 387 agrees with our conclusions and those of Keller et al. (2010). Concerning ecotoxicity test 388 results on cladocerans, the conclusions of three studies are not entirely in agreement with 389 each other. Wiench et al. (2009) reported a decrease in acute D. magna EC10 values for 390 coated ZnO NPs in natural waters, while Blinova et al. (2010) did not. On the other hand, 391 the latter study indicated an NOM dependent increase in acute D. magna EC50 values (up 392 to 140 fold) for CuO NPs when dispersed in natural waters. Gao et al. (2009) described a decrease in acute toxicity towards Ceriodaphnia dubia when exposed to Ag and Cu NPs 393 394 dispersed in water with increasing NOM and IS levels, although the effect of IS was not so 395 clear in case of Ag NPs. All papers note that dissolution of Ag, Cu, CuO and ZnO most 396 likely contributed to the observed effects. Hence, NOM could act on the dissolution and 397 bioavailability of the formed ions. This situation differs from the current study with CeO<sub>2</sub> 398 NPs, which did not dissolve (Van Hoecke et al., 2009). This difference in physico-chemical 399 properties of the NPs might be the reason why no effect of IS on toxicity of CeO<sub>2</sub> NPs was 400 observed in this study in contrast with the two other studies using TiO<sub>2</sub> and ZnO NPs. In 401 addition, it is expected that the exposure pathways of daphnids used in these studies differ 402 from the exposure pathway of the alga.

### 403 CONCLUSION

404 This study demonstrates that test media characteristics highly affect  $CeO_2$  NP 405 toxicity and stability. In fact, the standard OECD test medium without NOM should be 406 considered a worst case as far as  $CeO_2$  NP toxicity is concerned. In the tested synthetic and 407 natural waters containing NOM, the observed 48 h-E<sub>r</sub>C20 values were a factor 3 to 113 408 higher as compared to the 3.5 mg CeO<sub>2</sub>/L 48 h- $E_r$ C20 value obtained in standard OECD 409 test medium at pH 7.4. Furthermore, the NOM was found to adsorb to the CeO<sub>2</sub> NP surface, 410 which could explain the reduction in toxicity through a decrease in bioavailability of the 411 particles.

412 An empirical model taking into account medium pH and NOM concentration could 413 predict 48 h- $E_rC20$  values fo CeO<sub>2</sub> NPs in natural surface waters within a factor of 2.57.

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No.	Point <sup>a</sup>	Block <sup>b</sup>	рН <sup>с</sup>	NOM <sup>c</sup>	IS <sup>c</sup>	$\mathrm{pH}^\mathrm{d}$	NOM <sup>d</sup>	IS <sup>d</sup>	Mean aggregate size <sup>e</sup>	Control growth rate	Experimental 48 h E <sub>r</sub> C <sub>20</sub>	95% CI <sup>f</sup>	Model predicted 48 h-ErC <sub>20</sub>	$\frac{E_r C_{20}(obs)}{E_r C_{20}(pred)}$
				mg C/L	mM		mg C/l	mМ	nm	1/d	mg CeO <sub>2</sub> /l	mg CeO <sub>2</sub> /l	mg CeO <sub>2</sub> /l	(95 % CI)
1	cube	1	8.4	2	32	8.25	2.19	33.4	7800	1.32	11.0	4.4-27.7	35.1	0.31 (0.13-0.79)
2	center	1	7.5	5	20	7.49	4.91	21.6	1710	1.53	25.0	23.0-27.1	10.9	2.29 (2.11-2.49)
3	cube	1	8.4	8	8	8.28	7.82	11.4	517	1.44	41.6	37.2-46.6	28.1	1.48 (1.33-1.66)
4	cube	1	6.6	8	32	6.68	7.82	30.7	832	1.55	183.0	164.5-203.5	189.7	0.96 (0.87-1.07)
5	cube	1	6.6	2	8	6.65	2.19	9.2	367	1.48	30.8	25.1-37.8	78.2	0.39 (0.32-0.48)
6	center	2	7.5	5	20	7.55	4.97	22.3	2650	1.58	25.0	22.5-27.7	8.3	3.00 (2.71-3.34)
7	cube	2	6.6	2	32	6.6	1.85	34.2	1410	1.41	51.7	35.5-75.1	81.1	0.64 (0.44-0.93)
8	cube	2	6.6	8	8	6.6	8.09	11.5	185	1.50	204.6	186.3-224.8	218.4	0.94 (0.85-1.03)
9	cube	2	8.4	8	32	8.34	8.09	34.1	7320	1.40	38.4	31.6-46.8	32.1	1.20 (0.98-1.46)
10	cube	2	8.4	2	8	8.36	1.85	11.8	6150	1.54	30.5	26.7-34.8	53.8	0.57 (0.50-0.65)
11	center	3	7.5	5	20	7.49	5.43	25.8	1850	1.52	31.4	26.3-37.5	15.7	2.00 (1.68-2.39)
12	star	3	7.5	10	20	7.48	11.44	24.9	1010	1.58	41.7	36.8-47.2	72.9	0.57 (0.50-0.65)
13	star	3	7.5	0	20	7.47	0.00	23.9	4880	1.60	4.7	3.8-5.7	-34.8	n.a.
14	star	3	7.5	5	40	7.44	5.43	43.7	3080	1.44	31.8	28.7-35.1	19.2	1.65 (1.49-1.83)
15	star	3	7.5	5	0	7.47	5.43	3.7	2160	1.70	34.0	30.8-37.6	17.0	2.00 (1.81-2.21)
16	star	3	6.0	5	20	6.00	5.43	23.4	537	1.37	395.8	339.8-461.0	354.9	1.11 (0.96-1.30)
17	star	3	9.0	5	20	8.91	5.43	26.1	9790	0.97	257.5	106.1-624.8	144.7	1.78 (0.73-4.32)
Ank	Ankeveensche plas		n.a.		7.36	11.74	10.3	4860	1.73	103.2	90.4-117.7	95.7	1.08 (0.95-1.23)	
]	Markermeer		n.a.		8.11	6.61	10.6	14930	1.64	46.3	5.4-398.1	18.0	2.57 (0.30-22.12)	
	Le Voyon		n.a.		6.77	2.18	2.8	1550	1.75	80.3	74.7-86.3	55.2	1.45 (1.35-1.56)	
Οι	Ourthe orientale		n.a.		6.78	1.05	3.4	2780	1.75	69.6	64.1-75.6	31.5	2.21 (1.95-2.40)	

**Table 1** – Nominal & measured factor levels, mean aggregate size, control growth rates, measured & predicted 48h-E<sub>r</sub>C20 and their ratios

- <sup>a</sup>: Identification of data point in central composite design. Either cube, center or star points are used in the design (Box and Draper, 1987).
- <sup>b</sup>: Referes to the experimental block/week in which the experiment was performed.
- <sup>508</sup> <sup>c</sup>: Nominal factor levels as specified in the central composite design.
- <sup>d</sup>: Measured factor levels.
- <sup>e</sup>: as determined by DLS (media no. 3, 4, 5, 8 and 16) or laser diffraction.
- 511 f: CI = confidence interval.

**Table 2** – Adsorption of NOM to CeO<sub>2</sub> NPs in OECD medium (220 mg CeO<sub>2</sub>/L) with

513	various pH and IS.	Mean (standard	deviation) of 2	replicated	experiments	are given.
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рН	IS	NOM adsorbed
	mM	mg C
6.0	0	0.038 (0.009)
7.5	0	0.034 (0.010)
9.0	0	0.017 (0.002)
6.0	20	0.053 (0.014)
7.5	20	0.045 (0.002)
9.0	20	0.006 (0.008)
6.0	40	0.062 (0.007)
7.5	40	0.045 (<0.001)
9.0	40	0.017 (0.004)

515 **Table 3** – Summary of model coefficients, standard errors, p-values and percentage of 516 variance explained by each factor as determined by non linear estimation. The 517 mathematical expression of the model is:  $48h-E_rC20 = AxpH + BxpH^2 + CxNOM +$ 

518 DxpHxNOM + E.

	А	В	С	D	E		
E <sub>r</sub> C20	-1626.4	109.45	116.49	-14.317	6007.2		
Std. error	222.5	15.06	31.95	4.263	824.7		
p-value	1.5x10 <sup>-5</sup>	1.6x10 <sup>-5</sup>	$3.8 \times 10^{-3}$	6.4x10 <sup>-3</sup>	$1.6 \times 10^{-5}$		
% of variance explained	48.4	31.0	7.8	6.5	/		
Cumulative % variance explained: 93.7							

## 520 Figure legends

- Figure 1 Particle size distributions of 22 mg/L 14 nm CeO<sub>2</sub> NPs in OECD algal medium
  without and with 2.2 and 7.4 mg C/L NOM.
- 523
- 524 **Figure 2** Concentration-response curves of 14 nm CeO<sub>2</sub> NPs in OECD algal medium at
- 525 pH 7.4 without and with 2.2 and 7.4 mg C/L natural organic matter (NOM) (A) and the
- 526 derived 48 h-E<sub>r</sub>C10 and E<sub>r</sub>C20 values as a function of the NOM concentration (B). Error
- 527 bars in panel B present 95 % confidence interval on E<sub>r</sub>Cx values.
- 528
- 529 **Figure 3** –Scatterplot of average aggregate sizes as determined by DLS or laser diffraction.
- 530 The label near each data point refers to the same number listed in Table 2. As given in the 531 figure legend, the grey scale of the label refers to NOM content label magnitude refers to 532 IS.
- 533

**Figure 4** – Scatterplot of 48h- $E_rC_{20}$  values as a function of pH, NOM and IS in synthetic waters. The label near each data point refers to the same number listed in Table 2. The grey scale of the label refers to pH and label magnitude refers to IS. Error bars represent 95 % confidence interval on 48h- $E_rC20$  value.