

*Electronic Supplementary Information for:*

**Fluorescent graphene quantum dots-enhanced machine learning for accurate detection and quantification of Hg<sup>2+</sup> and Fe<sup>3+</sup> in real water samples.**

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**S1.** The output files from the experimental obtention of the excitation-emission matrices (EEMs) with known  $\text{Hg}^{2+}$  and  $\text{Fe}^{3+}$  concentrations had to be pre-processed prior to the application of the machine learning models used for the prediction of analyte concentrations in real samples.

2D Excitation-emission matrix (EEM) for a single known  $\text{Hg(II)/Fe(III)}$  combination

EX Wavelength/EM Wavelength	EX Wavelength							
	399.0	401.0	403.0	405.0	407.0	409.0	411.0	413.0
310.0	3180.047	3333.720	3427.932	3513.985	3606.591	3667.432	3718.818	3800.214
312.0	3334.405	3480.124	3575.497	3674.070	3743.884	3818.191	3871.404	3933.121
314.0	3420.148	3564.604	3667.336	3758.919	3854.457	3920.152	3968.366	4040.615
316.0	3502.088	3650.953	3752.527	3844.432	3942.588	4000.723	4068.455	4138.775
318.0	3512.694	3664.145	3754.523	3852.983	3960.203	4025.770	4088.664	4170.255

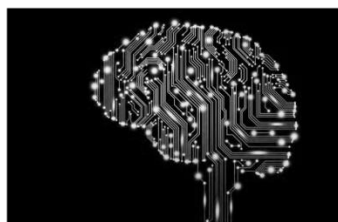
1D Flattened EEM

399.0_310.0	401.0_310.0	403.0_310.0	405.0_310.0	407.0_310.0	409.0_310.0	411.0_310.0
3180.047	3333.72	3427.932	3513.985	3606.591	3667.432	3718.818

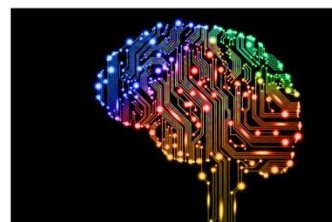
Stacked 1D EEMs for different  $\text{Hg(II)/Fe(III)}$  combinations

Hg_ppm	Fe_ppm	399.0_310.0	401.0_310.0	403.0_310.0	405.0_310.0	407.0_310.0	409.0_310.0	411.0_310.0
0.0000	0.0000	3180.047	3333.720	3427.932	3513.985	3606.591	3667.432	3718.818
0.0026	0.0000	3203.475	3376.472	3493.045	3609.939	3730.667	3826.925	3906.227
0.0034	0.0000	3112.786	3269.496	3387.882	3498.708	3624.783	3701.099	3777.906
0.0400	0.0000	1675.251	1718.979	1749.344	1792.057	1833.279	1871.723	1903.284
0.0500	0.0000	1456.329	1481.507	1504.970	1534.334	1563.514	1599.899	1621.381
0.0018	0.0000	3337.422	3508.959	3629.941	3758.494	3884.181	3975.637	4072.255

Dimensionality reduction and machine learning model training



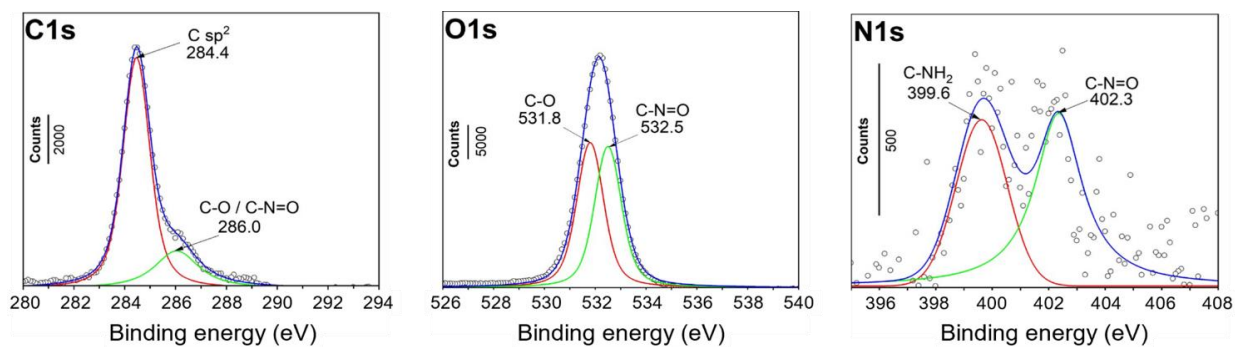
TRAINED MACHINE LEARNING MODEL



PREDICTIONS OF REAL SAMPLES

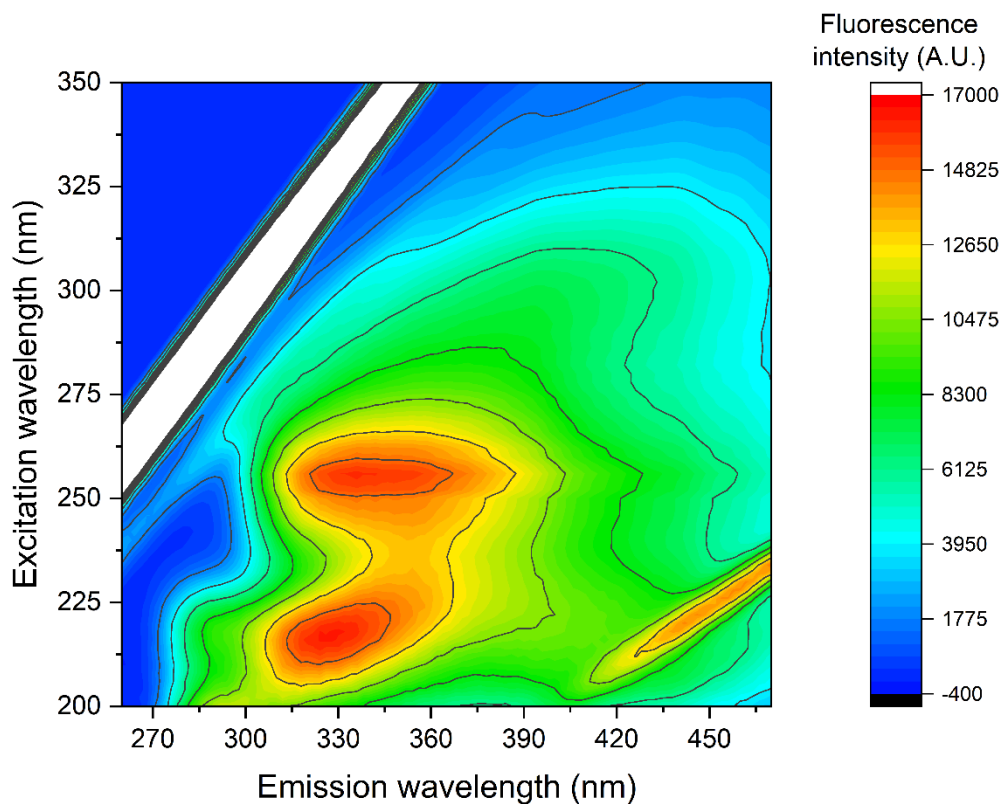
**Figure S1.** Schematic representation of the data handling process.

**S2. Additional XPS.** To complement the characterization of the urea-modified graphene quantum dots (uGQDs) and 1-nitroso-2-naphthol-modified NN-uGQDs, X-ray photoelectron spectra of pristine 1-nitroso-2-naphthol (NN).



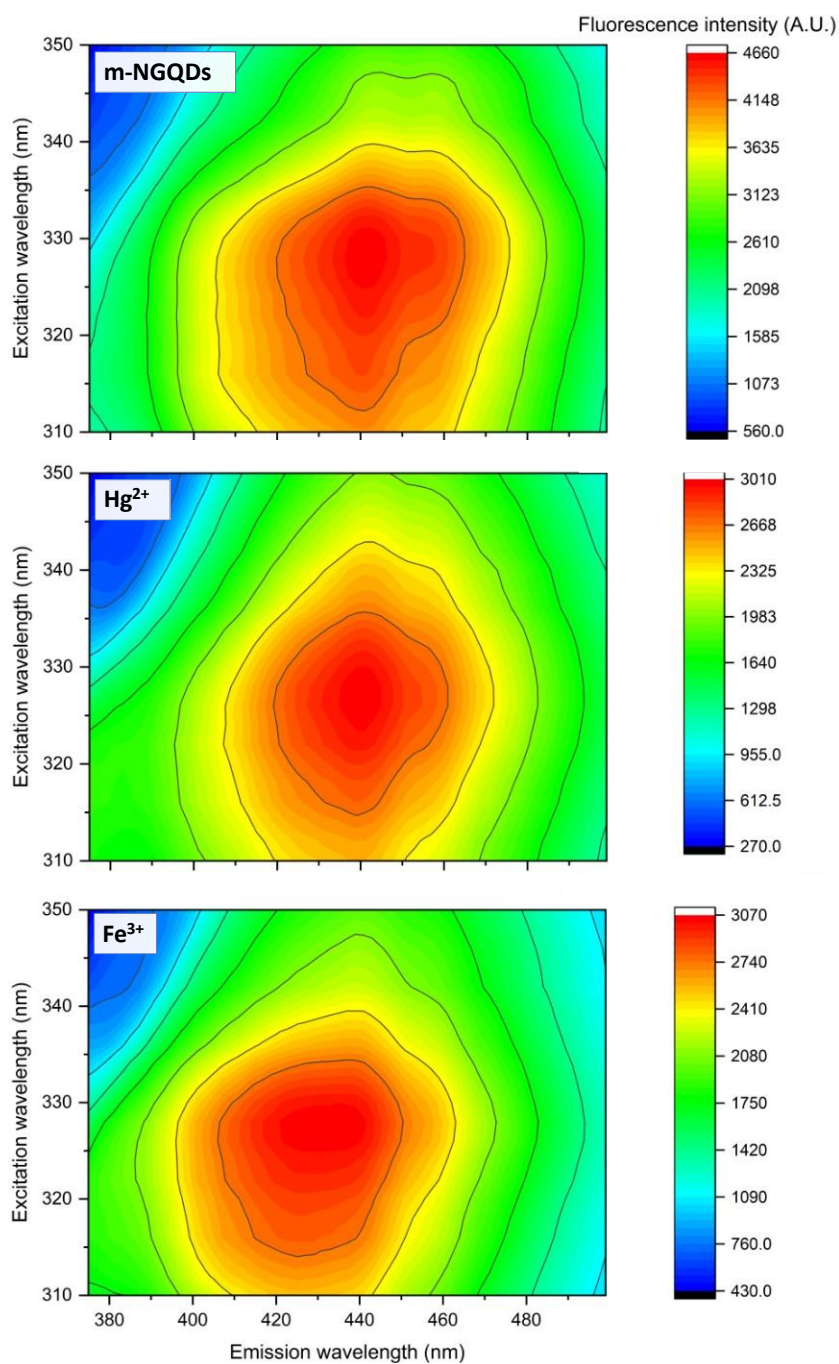
**Figure S2.** Top: C 1s, O 1s and N 1s XPS spectra for pristine NN, including the deconvolution of the instrumental signal.

**S3. Excitation Emission Matrix (EMM) for GQDs synthesized without urea.** The EMMs for graphene quantum dots (GQDs) synthesized without urea, as control, show similarities with that of urea-modified graphene quantum dots. The main difference between both cases is the EMM observed for uGQDs with an excitation wavelength of 315 nm, which is not present in the case of GQDs.



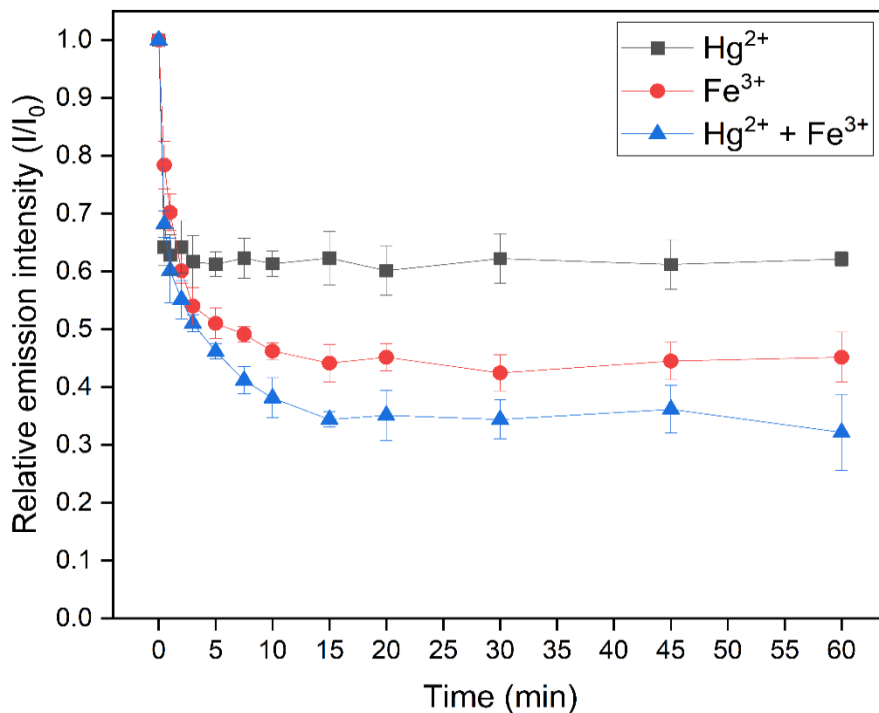
**Figure S3.** Excitation-emission matrix (EMM) for as-synthesized graphene quantum dots. The main high-intensity emission resulting from scattering (when  $\lambda_{exc} = \lambda_{em}$ ) has been whitened to improve visualization.

**S4.** The EMMs of 1-nitroso-2-naphthol-modified nitrogenated graphene quantum dots (NN-uGQDs), in the presence of  $0.20 \text{ mg L}^{-1}$  of both  $\text{Hg}^{2+}$  and  $\text{Fe}^{3+}$ , show significant differences in the emission profile. These differences were key for the application of the developed machine learning model, used for the simultaneous prediction of  $\text{Hg}^{2+}$  and  $\text{Fe}^{3+}$  concentrations in unknown samples.



**Figure S4.** EMM spectra for 1-nitroso-2-naphthol-modified nitrogenated graphene quantum dots before (m-NGQDs, shown on top) and after the addition of  $0.20 \text{ mg L}^{-1}$  of  $\text{Hg}^{2+}$  (middle) and  $\text{Fe}^{3+}$  (bottom).

**S5. Response time.** The response time of the probe differed for the studied analytes, having  $\text{Hg}^{2+}$  and immediate effect on the emission, while  $\text{Fe}^{3+}$  took 15 min to produce its full quenching effect.



**Figure S5.** Relative EMM intensity of 1-nitroso-2-naphthol-functionalized N-doped graphene quantum dots as a function of time after the addition of  $0.35 \text{ mg mL}^{-1}$  of  $\text{Hg}^{2+}$ ,  $0.50 \text{ mg mL}^{-1}$   $\text{Fe}^{3+}$  and  $0.35 \text{ mg mL}^{-1}$  of  $\text{Hg}^{2+} + 0.50 \text{ mg mL}^{-1}$   $\text{Fe}^{3+}$ . The spectra taken at time = 0 has been considered as the reference emission intensity ( $I_0$ ) and  $n = 3$ .

## S6. Table comparing different Fluorescent Sensors

**Table S1.** Comparison of the hereby presented results with other recently published GQD-based fluorescence sensors for  $Hg^{2+}$  and  $Fe^{3+}$  determination.

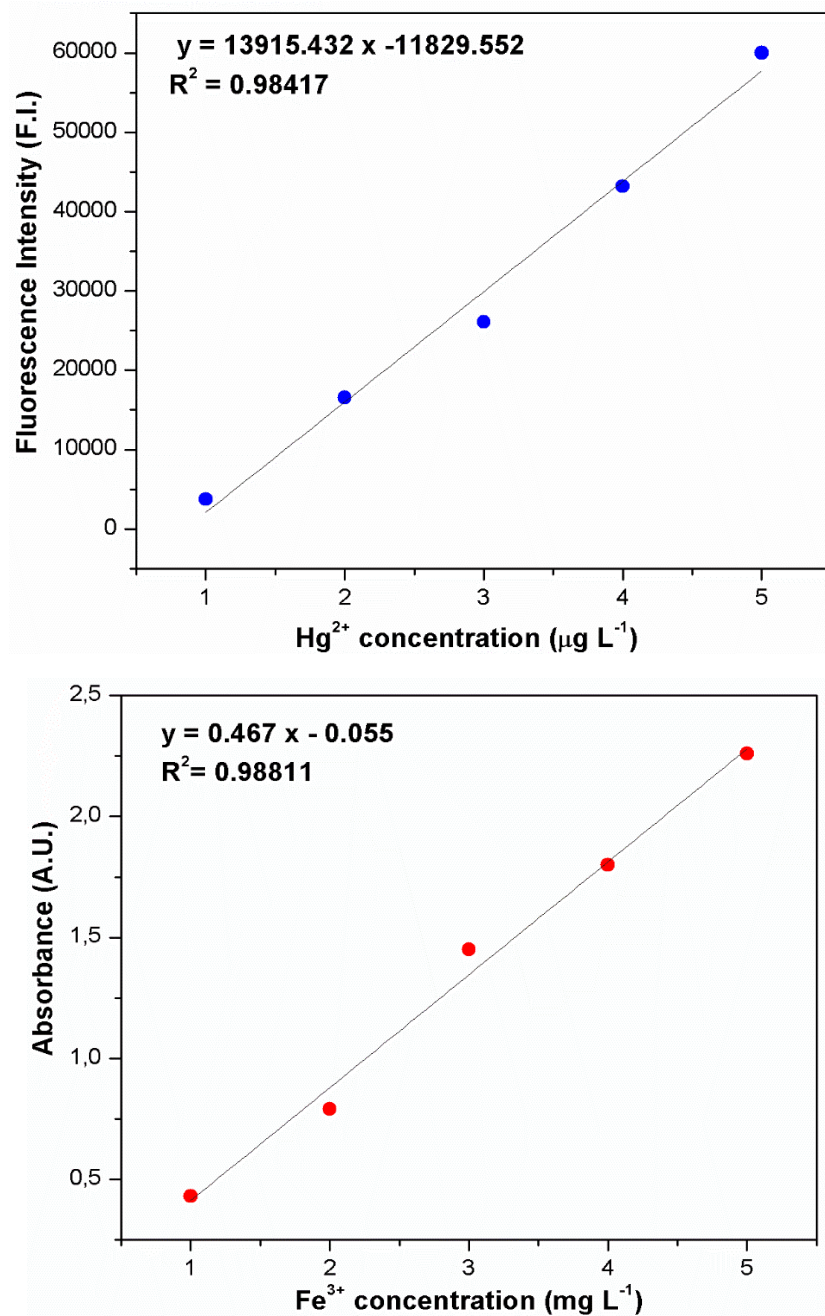
<i>Fluorescence Sensor</i>	<i>Synthesis method</i>	<i>Linear range</i>	<i>LOD</i>		<i>Real Samples</i>	<i>Reference</i>
			<i>Hg<sup>2+</sup></i>	<i>Fe<sup>3+</sup></i>		
Glutathione-doped GQDs	Pyrolysis	1-150 $\mu$ M	-	0.10 $\mu$ M	Drinking water	1
N-doped GQDs	Hydrothermal	0-30 $\mu$ M	0.25nM	-	River water	2
P, N-doped GQDs	Pyrolysis	Not reported	0.13 $\mu$ M	-	Natural spring water, river water and serum sample	3
GQDs	Pyrolysis	0–60 nM	-	0.024 nM	Drinking water	4
NN-u-GQDs	Electrochemical exfoliation from 3D graphene	0-0.02 $\mu$ M 0-0.08 $\mu$ M	0.005 $\mu$ M	0.017 $\mu$ M	Tap water, river water and dam water	This work

**S7.** Instrumental conditions for the determination of  $\text{Hg}^{2+}$  in water samples by cold vapor-atomic fluorescence spectrometry. All measurements were carried out on samples that were previously acidified with  $\text{HNO}_3$  up to a final concentration of  $1.0 \text{ mol L}^{-1}$ . The calibration curve was obtained using standard samples prepared in  $1.0 \text{ mol L}^{-1}$   $\text{HNO}_3$ . On the other hand, the spectrophotometric method used for  $\text{Fe}^{3+}$  determination was based on a liquid-liquid extraction using ethyl acetate, after addition of  $\text{KSCN}$  as complexing and chromogenic reagent.

**Table S2.** Instrumental conditions for the determination of  $\text{Hg}^{2+}$  in water samples by cold vapor-atomic fluorescence spectrometry.

<i>AFS instrumental conditions</i>	
Wavelength	257.3 nm
Measurement mode	Peak height
Primary lamp current	8.0 mA
Atomizer temperature	300 °C
Boost current	0
PMT voltage	240 V
<i>Cold vapor generation conditions</i>	
Sample volume	2.0 mL
Carrier	$1.0 \text{ mol L}^{-1}$ $\text{HNO}_3$
Carrier flow rate	$4.0 \text{ mL min}^{-1}$
Reductant	0.5% (w/v) $\text{NaBH}_4$
Reductant flow rate	$4.0 \text{ mL min}^{-1}$
Carrier gas and flow rate	Ar, $500 \text{ mL min}^{-1}$





**Figure S6.** Calibration curves for Hg<sup>2+</sup> (above) and Fe<sup>3+</sup> (below) are presented, corresponding to the spectrophotometric and CV-AFS measurements utilized in the validation process.

## References

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