

Supplementary material to:

A Chemiresistor Sensor Array Based on Graphene Nanostructures: From the Detection of Ammonia and Possible Interfering VOCs to Chemometric Analysis

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1. Set up for gas exposures

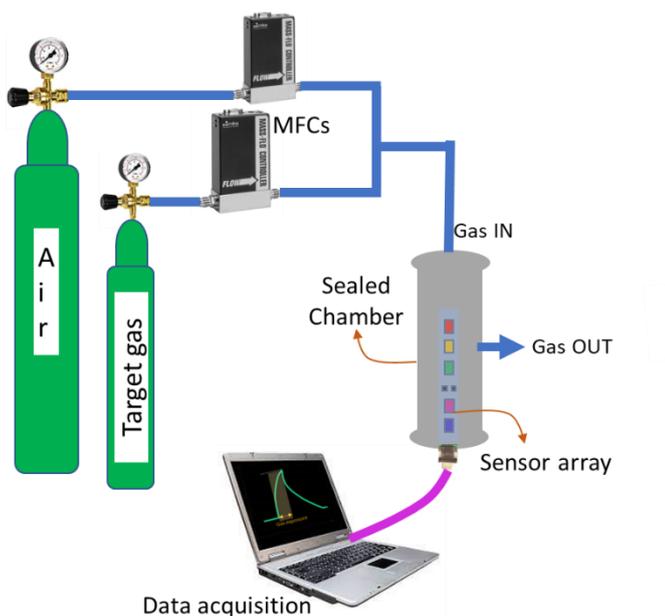


Figure S1: Schematic representation of the set up used for the gas exposures. The system comprises a sealed steel homemade chamber, connected to 2 mass flow controllers (MFCs) and a PC for data acquisition, a cylinder filled with air and a cylinder with the target gas molecules. The sensor array is hosted inside the chamber. The MFC connected to the air cylinder has a maximum flow of 500 sccm, while the max flow of the MFC connected to the analyte cylinders is 200 sccm.

2. Freundlich fitting parameters and detection limit evaluation

Table S1: fitting parameter of the calibration curve (reported in Figure 3 – right panel) of the main text), used to evaluate the limit of detection (LOD) for ammonia exposure, according to the formula reported in the main text.

| Sensor | A | Pow | LOD (ppb) |
|-----------------------------------|---------------------|-----------------|-----------|
| Gr_CoPt | 0.008 ± 0.001 | 0.65 ± 0.01 | 0.1 |
| Gr_Fe ₃ O ₄ | 0.005 ± 0.001 | 0.43 ± 0.01 | 7.2 |
| Gr_TiO ₂ | 0.0011 ± 0.0002 | 0.53 ± 0.03 | 101 |
| Gr nanolapelets | 0.0014 ± 0.0003 | 0.89 ± 0.04 | 720 |
| Gr dispersion | 0.0024 ± 0.0001 | 0.84 ± 0.01 | 102 |

3. Stability of sensor response upon time and temperature

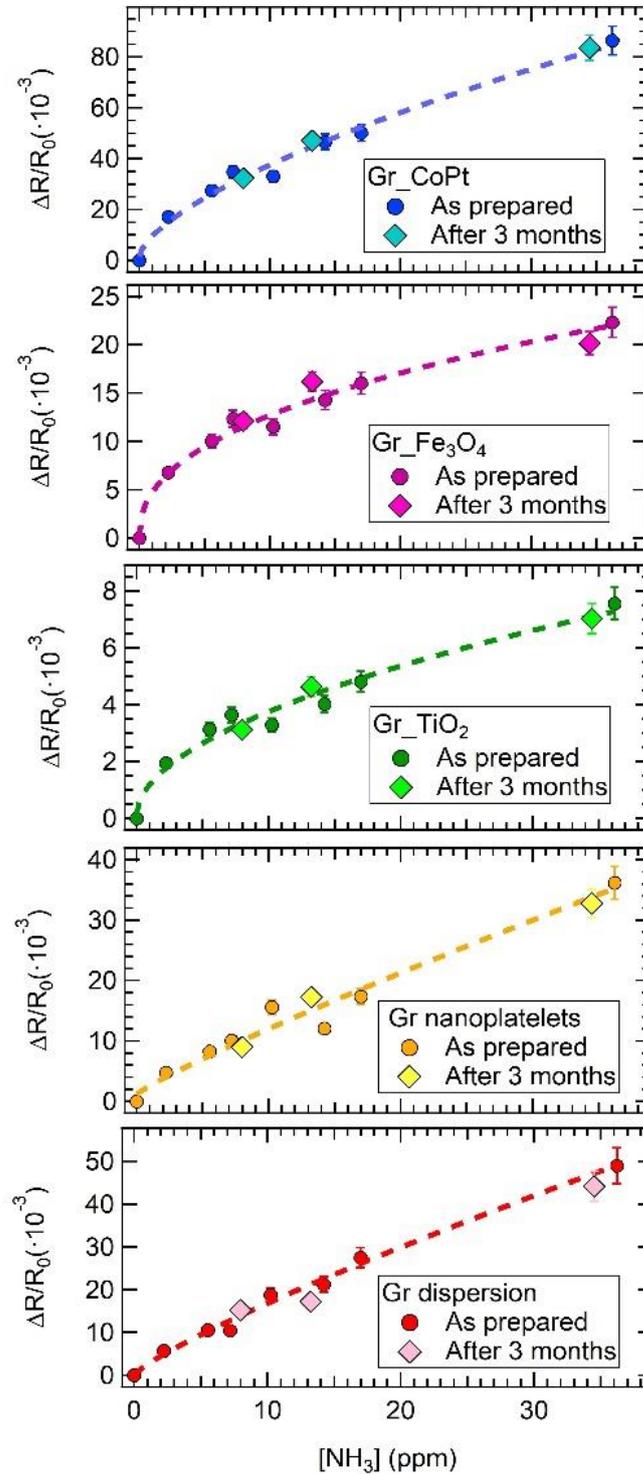


Figure S2: Proof of the stability and reproducibility of the sensors response upon ammonia exposures: calibration curves (dots) and Freundlich fit (dashed curves) evaluated after the sample preparation; rhombus data have been collected after 3 months from the sample preparation and they perfectly matched the calibration curve and Freundlich fit for all sensors.

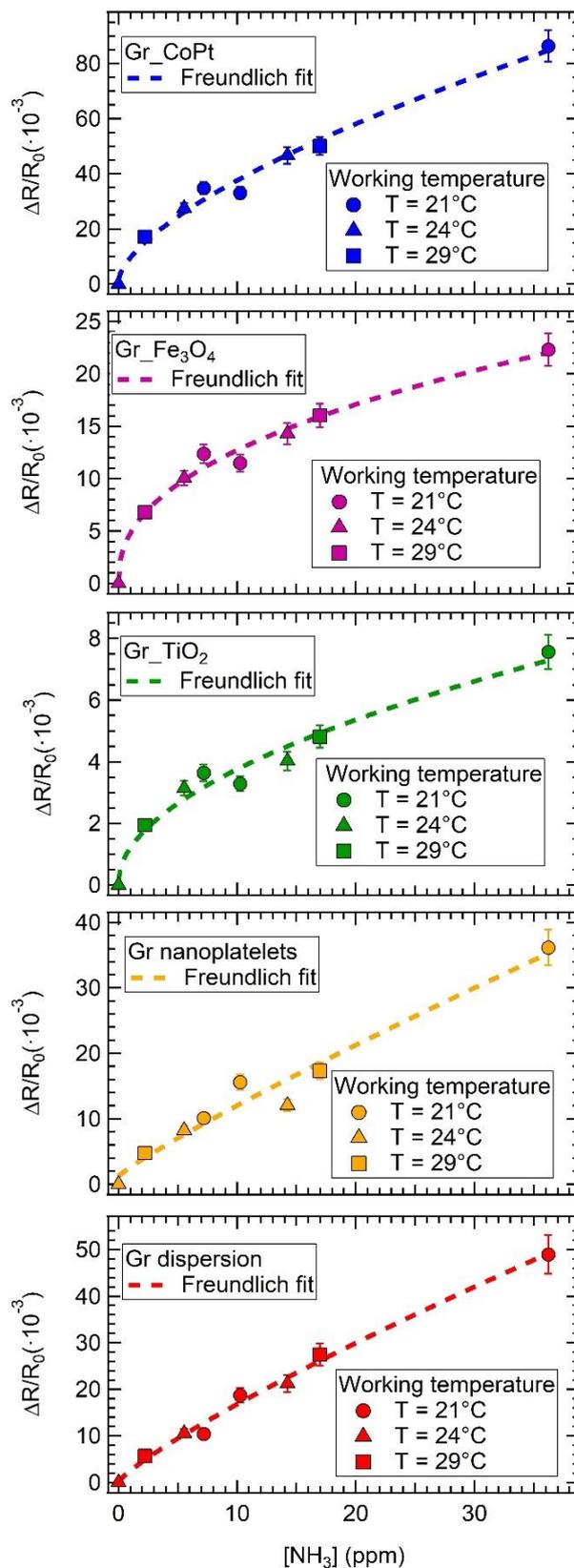


Figure S3: Proof of the stability and reproducibility of the sensors response to ammonia exposures at different working temperature: 21°C (dots), 24°C (triangles) and 29°C (squares). Dashed line is the Freundlich fit. The tested temperature range is suitable for breathomics, environmental, food quality and safety applications.

4. Sensing mechanism

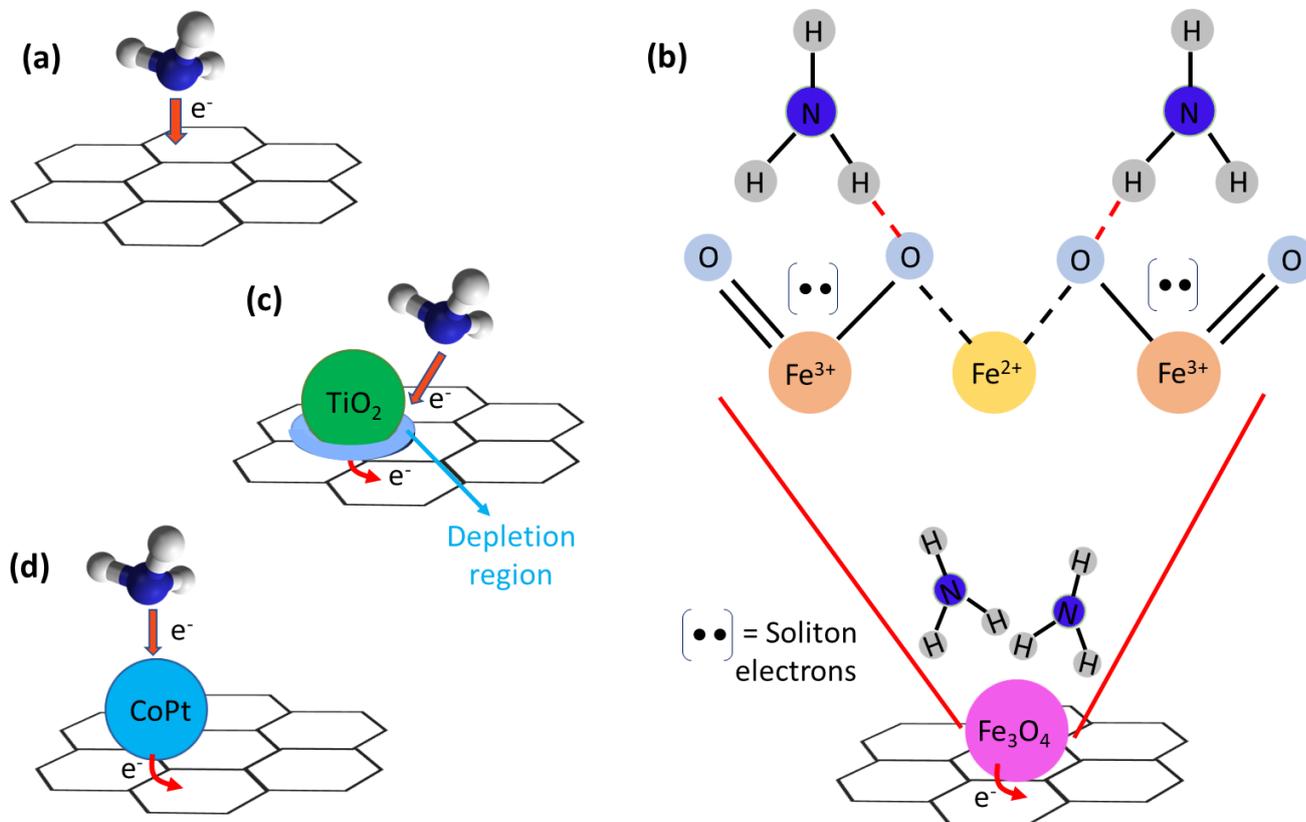


Figure S4: Scheme of the sensing mechanism to ammonia exposure for (a) Gr dispersion and Gr nanoplatelets, (b) Gr_{Fe₃O₄}, (c) Gr_{TiO₂} and (d) Gr_{CoPt} layers.

5. Sensitivity benchmarking

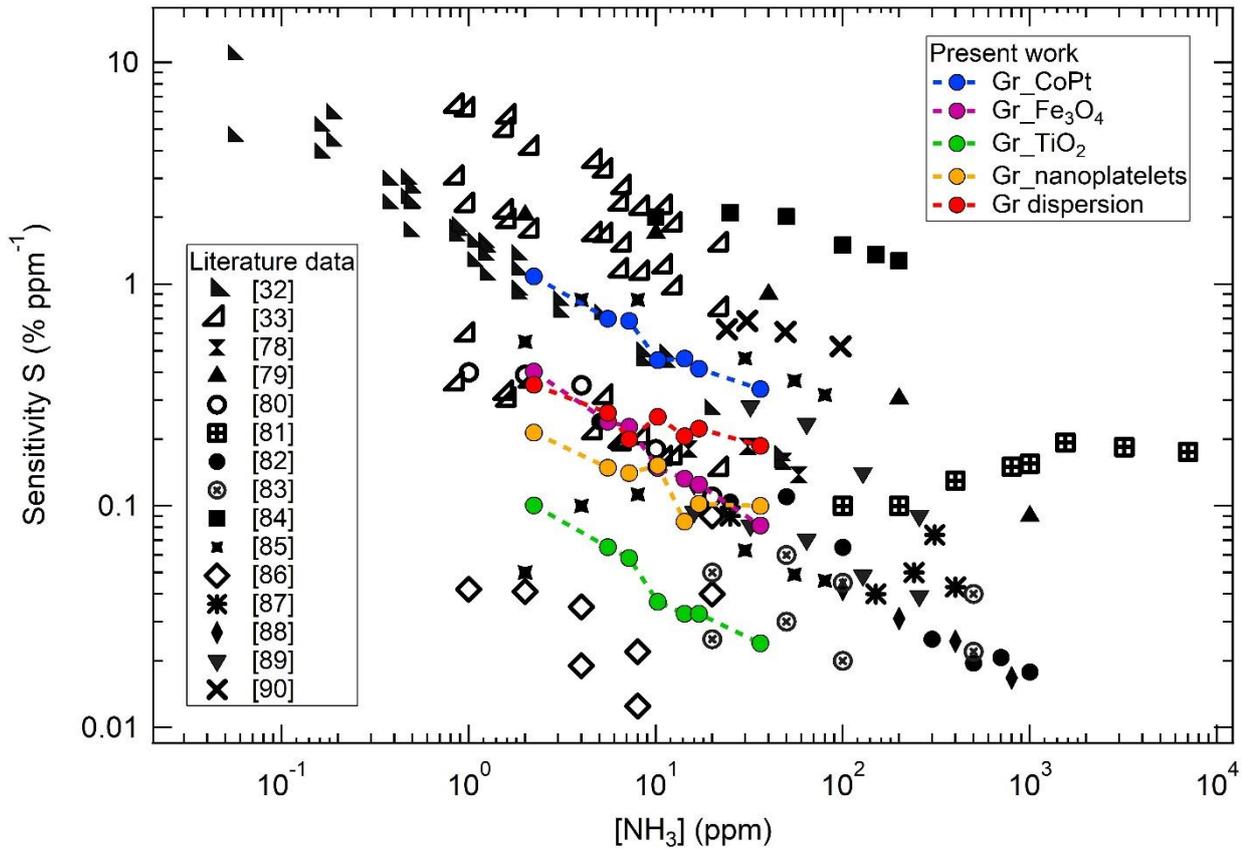


Figure S5: Benchmarking for sensitivity (defined as: $(\Delta R/R_0 \cdot 100)/[\text{NH}_3]$) upon ammonia exposure, of the prepared sensors (blue, purple, green, yellow and red dots) with respect to other graphene-based chemiresistor sensitivity values reported in literature (black symbols). Literature data refer to Refs [32,33,78-90] reported in the main text. Data are presented in a log-log scale. Of note: only articles clearly reporting gas concentration and sensor response/sensitivity have been taken into account for this benchmarking.

6. Concentration range of each tested gas molecule

Table S2: Concentration range of the selected target gas molecules used for the PCA, LDA and Mahalanobis distance analysis.

| Target gas | Concentration range (ppm) |
|---------------------|---------------------------|
| Ammonia | 0-36.0 |
| Acetone | 0-40.0 |
| Ethanol | 0-37.0 |
| 2-propanol | 0-40.3 |
| Sodium hypochlorite | 0-0.5 |

7. Example of a confusion matrix for LDA cross validation with accuracy percentage evaluation

Table S3: Example of the confusion matrix upon internal cross validation of the model reported in Figure 6-b of the main text. On the row there are the correct belonging classes, while the columns, labelled with an asterisk (*), are the predicted belonging classes. In red are enlightened the wrong assignment of data.

| | Ammonia* | Acetone* | 2-propanol* | Ethanol* | Sodium hypochlorite* | Water* |
|----------------------------|-----------------|-----------------|--------------------|-----------------|-----------------------------|---------------|
| Ammonia | 6 | 0 | 0 | 0 | 0 | 0 |
| Acetone | 0 | 3 | 0 | 0 | 1 | 0 |
| 2-propanol | 0 | 0 | 3 | 1 | 0 | 0 |
| Ethanol | 0 | 0 | 0 | 4 | 0 | 0 |
| Sodium hypochlorite | 0 | 0 | 0 | 1 | 3 | 0 |
| Water | 0 | 0 | 0 | 0 | 0 | 5 |

Table S4: Accuracy percentage of cross validation referred to the confusion matrix reported in table S.III. The total accuracy is 88%.

| Ammonia | Acetone | 2-propanol | Ethanol | Sodium hypochlorite | Water |
|----------------|----------------|-------------------|----------------|----------------------------|--------------|
| 100% | 75% | 75% | 100% | 75% | 100% |

8. Example of a confusion matrix for LDA predictive capability

Table S5. Confusion matrix obtained for classification of a random subset of training dataset containing 6 data (one for each class) projected on the LDA model reported in Figure 6-b. The accuracy of this classification is 100% since all the data are correctly identified. True class is reported on row, while the predicted class are on the columns and labelled with an asterisk (*).

| | Ammonia* | Acetone* | 2-propanol* | Ethanol* | Sodium hypochlorite* | Water* |
|----------------------------|-----------------|-----------------|--------------------|-----------------|-----------------------------|---------------|
| Ammonia | 1 | 0 | 0 | 0 | 0 | 0 |
| Acetone | 0 | 1 | 0 | 0 | 0 | 0 |
| 2-propanol | 0 | 0 | 1 | 0 | 0 | 0 |
| Ethanol | 0 | 0 | 0 | 1 | 0 | 0 |
| Sodium hypochlorite | 0 | 0 | 0 | 0 | 1 | 0 |
| Water | 0 | 0 | 0 | 0 | 0 | 1 |