

Development of a Low-Cost Sensor Array for Real-Time Agricultural Ammonia Monitoring

M. Rosiers^{1,2}, S.P. Liégeois¹, N. Antoine¹, C. Falzone¹, M. Justin¹, M.B. Jalloh¹, M. Van Damme², L. Clarisse², P. Coheur² & A.C. Romain¹

¹Sensing of Atmospheres and Monitoring (SAM) Laboratory - UR SPHERES, Université de Liège, Arlon Campus Environnement

²ULB-BLU Space Research Center - UR SQUARES, Université libre de Bruxelles



Introduction

- Ammonia (NH_3) is a major agricultural pollutant
- Negative impact on human health & climate
- Monitoring is challenging!
 - EU: Increased demand for NH_3 emission data
 - Conventional methods are essential
 - However, coarse resolution, expensive, ...
- Need: affordable, high-resolution monitoring solution
 - Development of NH_3 sensor array (e-nose)
- E-nose principle: recognition of 'agricultural gas fingerprint'
 - Prediction of atmospheric NH_3
 - High spatial & temporal resolution, affordable, scalable, ...

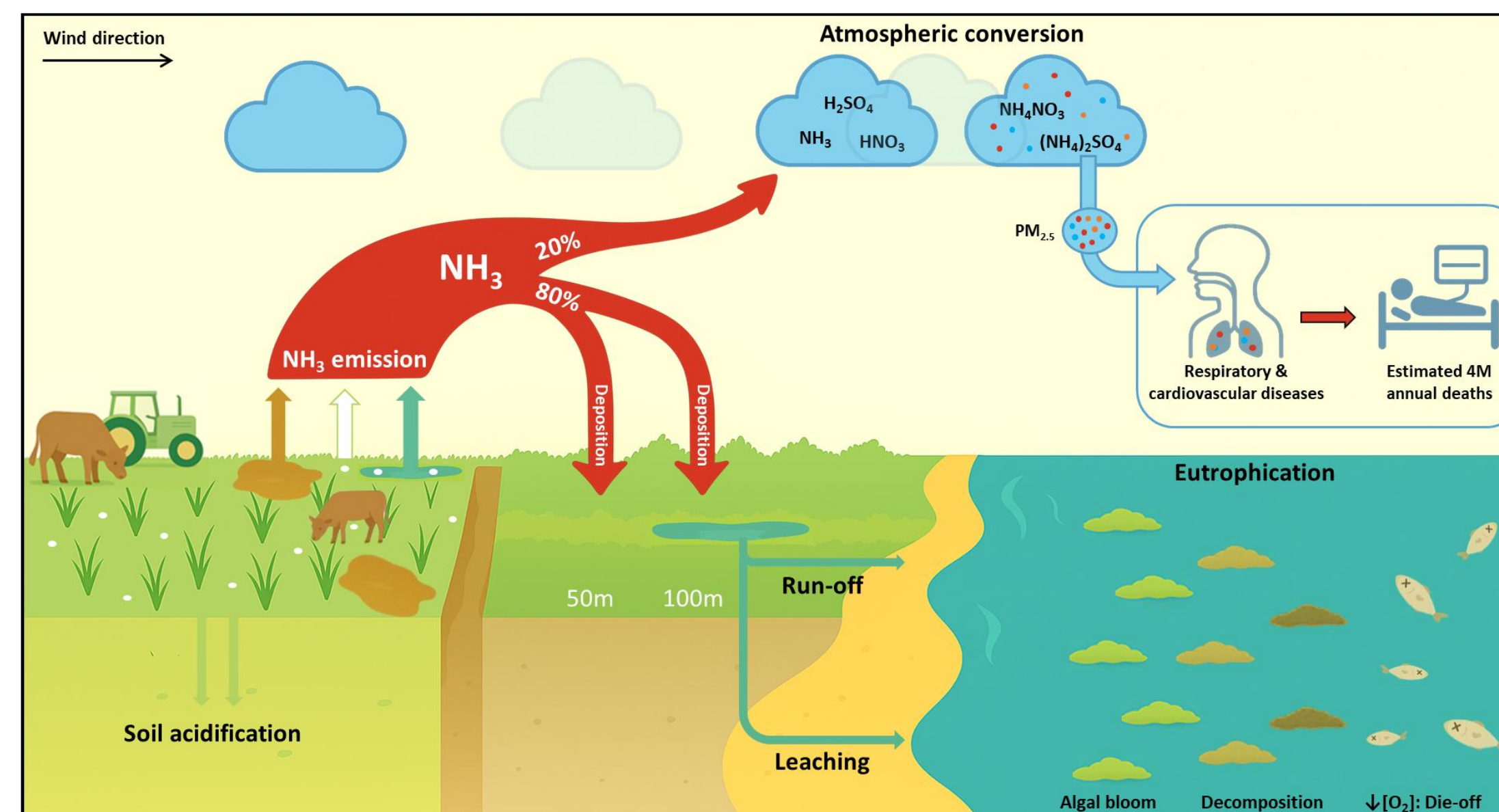


Figure 1: Schematic overview of NH_3 emissions, alongside its environmental and health consequences (Rosiers, AI).

Initial Sensor Selection – Based on Literature

Name	Manufacturer	Type	Target gases	Detection range NH_3 (ppm)	Detection range other analytes (ppm)
TGS2602	FIGARO	MOX	NH_3 & VOCs	0-30	-
MQ-137	Winsen Elec.	MOX	NH_3	5-500	-
MQ-135	Winsen Elec.	MOX	VOCs & NH_3	10-1000	-
GGS4330 T	Umwelt	MOX	NH_3	0-100	-
NH_3 -SM30-20	ELT SENSOR	EC	NH_3	0-20	-
NH_3 -SM30-100	ELT SENSOR	EC	NH_3	0-100	-
MQ-3	Winsen Elec.	MOX	VOCs	-	VOCs: 0-500
TGS2620	FIGARO	MOX	VOCs & CH_4	-	VOCs: 0-5000
TGS2610	FIGARO	MOX	VOCs & CH_4	-	VOCs: 0-5000;
TGS813	FIGARO	MOX	VOCs & CH_4	-	-

Table 1: an overview of the broad selection of low-cost MOX and EC sensors for this study. All characteristics are taken directly from official manufacturer datasheets.

Sensor Selection

Methodology

- Sensor array needs to capture complex agricultural gas mixture
- In-lab sensor performance assessment (NH_3 , EtOH & CH_4)
 - Based on single analyte & controlled gas mixtures (incl. RH & T)
- Cycle-based exposure - [analyte] between 0.1-2.5 ppm \approx in-situ
 - Reference: humidified synthetic air (20/80 O_2/N_2 – RH = 55%)
- Feature Extraction: Median value of Steady-State sensor signal
- Data Preprocessing: Data Cleaning & Scaling (Column-wise)
- Sensor Selection: Sensor Characteristics (LOD, Sensitivity, etc.) & PCA

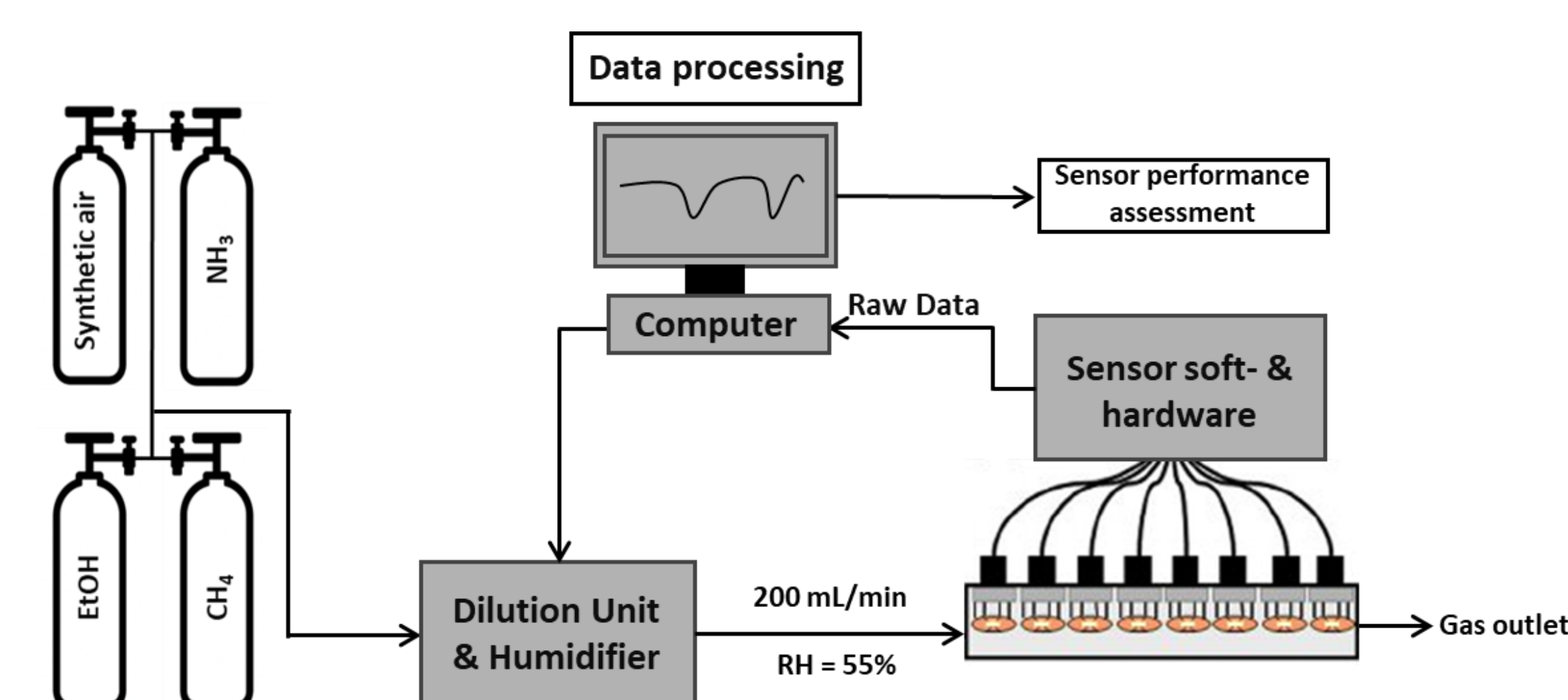


Figure 2: Schematic overview of the experimental design, used to assess sensor specific characteristics.

Conclusion

- Based on Biplots of PCAs:
 - MQ135 (CH_4), TGS2620, TGS2602 & MQ3 (EtOH)
- Strong separation of single analyte gases
- Identification of EtOH & NH_3 gradients in complex gas mixtures
- No EC? \rightarrow High LOD – good performance at > 1 ppm

Data Treatment

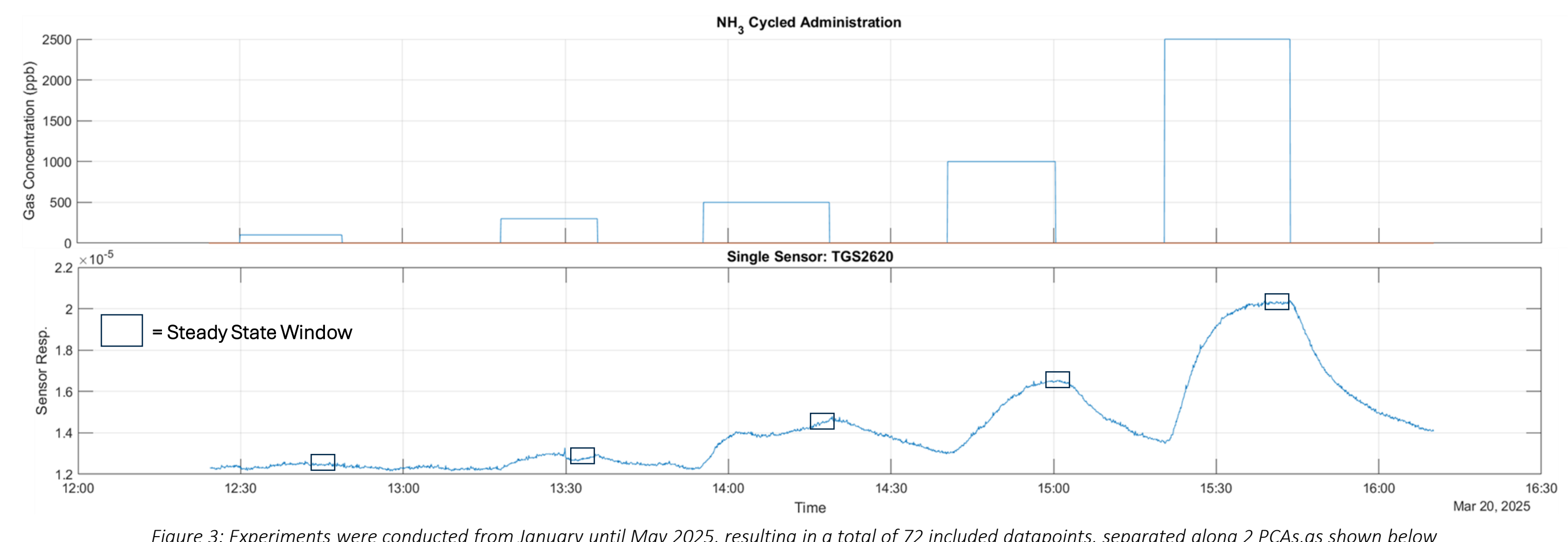


Figure 3: Experiments were conducted from January until May 2025, resulting in a total of 72 included datapoints, separated along 2 PCAs, as shown below

Feature Extraction

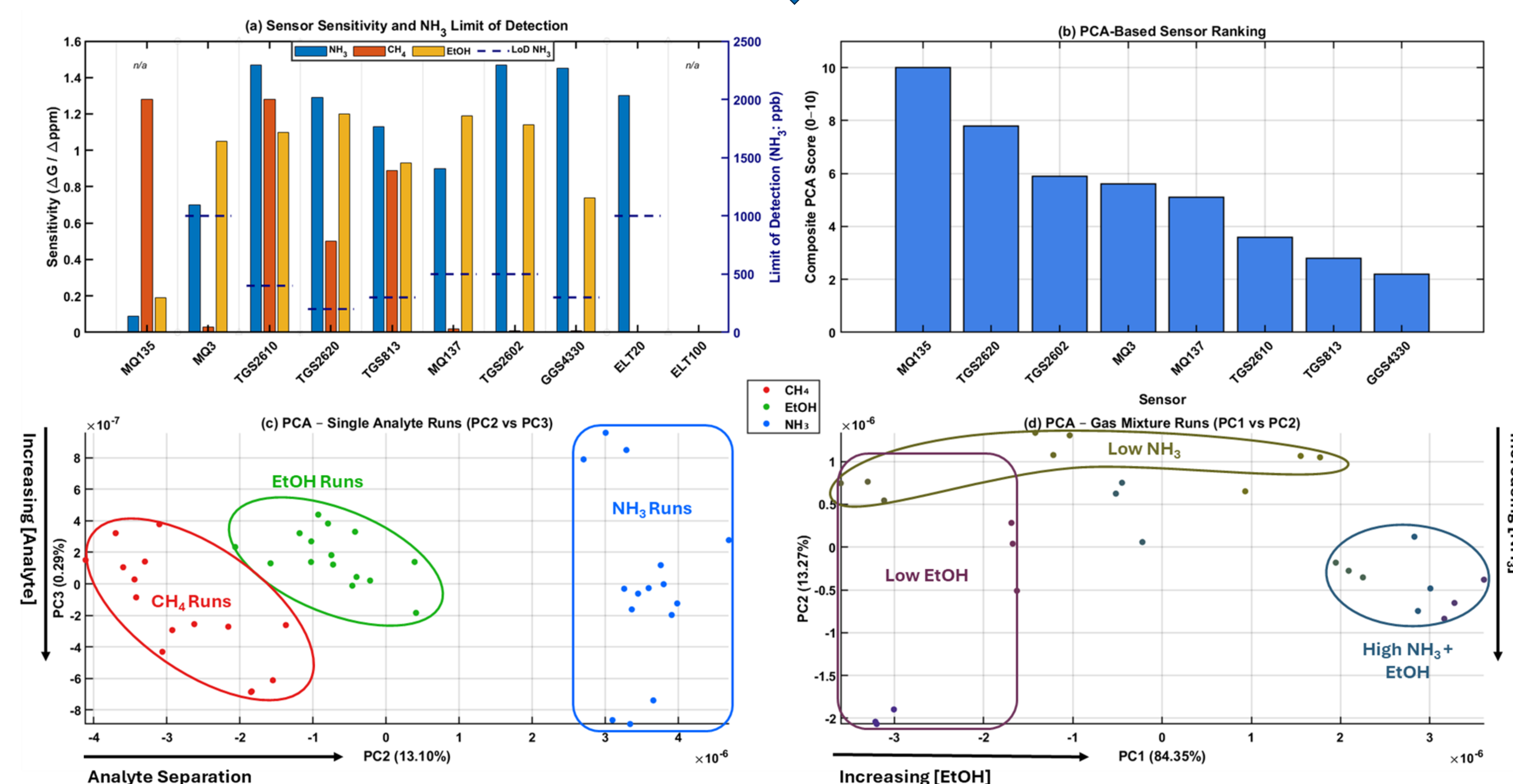


Figure 4: Sensor characteristics of the selected low-cost MOX and EC sensors. (a) Bar chart showing sensor sensitivities to NH_3 , CH_4 , and EtOH ($\Delta G/\Delta \text{ppm}$), with overlaid NH_3 LoD (ppb). (b) PCA-based ranking of sensors by composite score derived from loadings. (c) PCA biplot (PC2 vs PC3) of single-analyte experiments, with clusters for NH_3 (blue), CH_4 (red), and EtOH (green) runs distinctly separated. (d) PCA biplot (PC1 vs PC2) of gas mixture experiments, where score locations correspond to RGB-blended concentrations and clusters indicate regions with low NH_3 , low EtOH, or high NH_3 +EtOH.

Future Work

Model Development

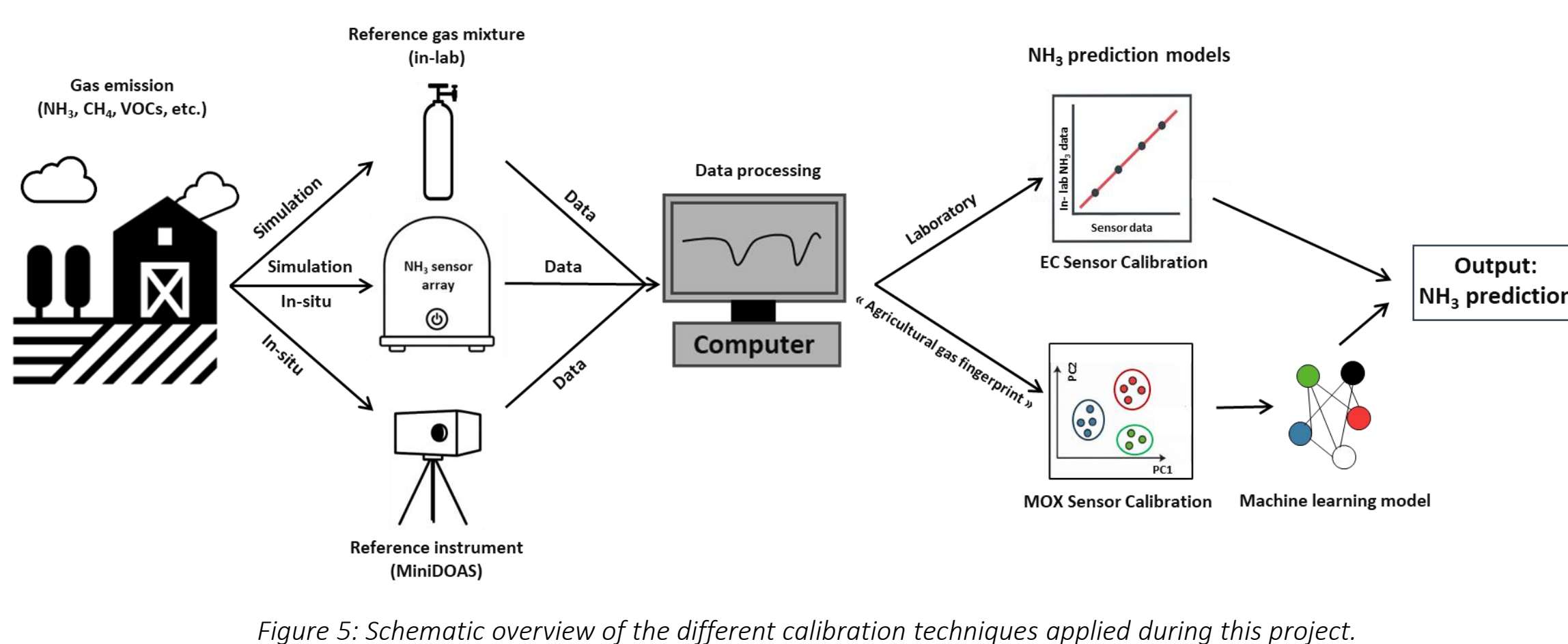


Figure 5: Schematic overview of the different calibration techniques applied during this project.

- Dual-model NH_3 prediction:
 - $[\text{NH}_3] < 1-2$ ppm: MOX*-based - MiniDOAS Prediction Model
 - $[\text{NH}_3] > \text{in-situ calibration range}$: EC*-based – Laboratory Model
- Increased NH_3 prediction range (sub-ppm to 50 ppm)

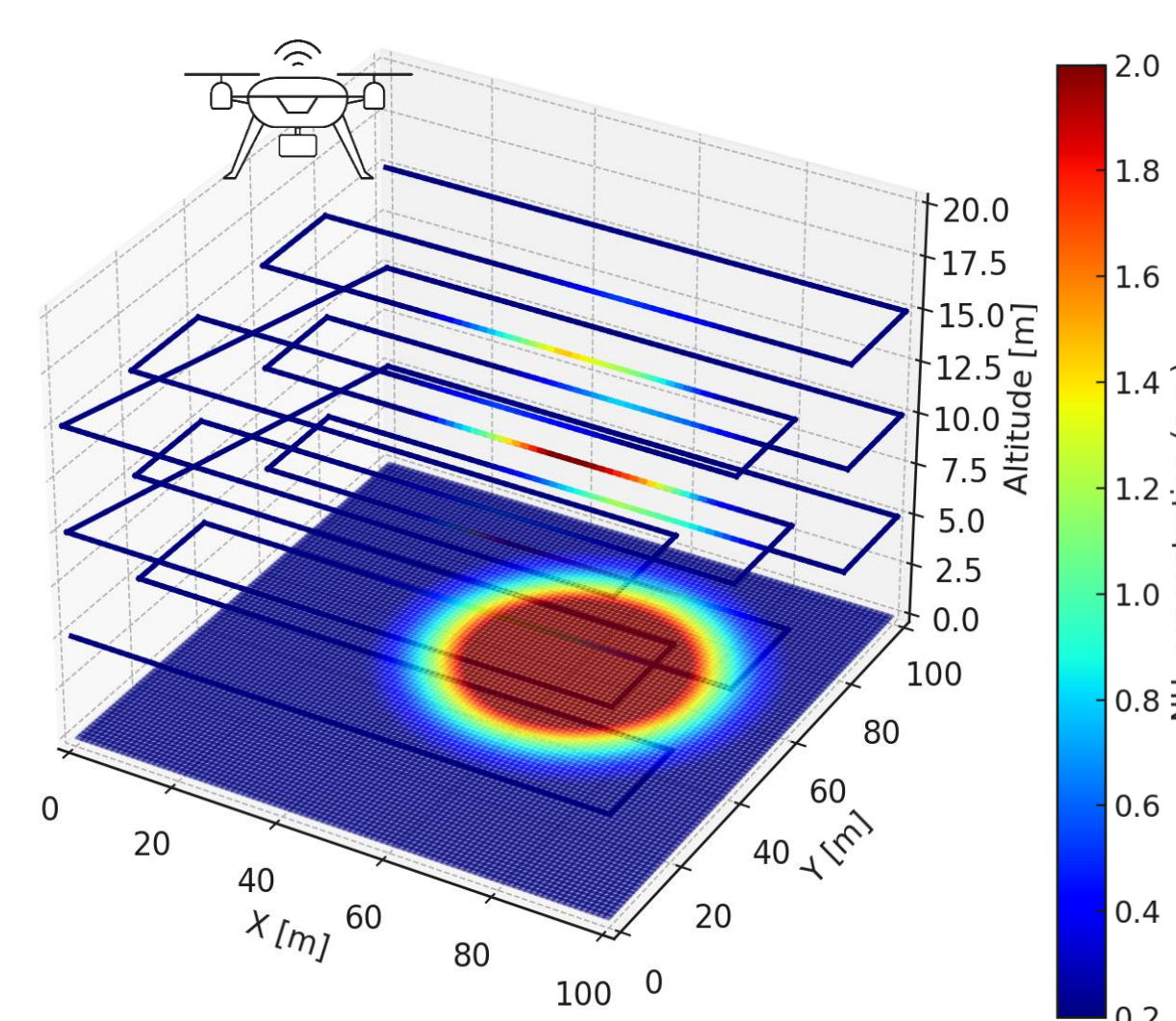


Figure 6: NH_3 plume intensity along drone paths; red = high, blue = low.

* MOX = Metal-Oxide sensor
** EC = Electrochemical sensor

Measurement Perspectives

- Manufacture and deploy 10-20 instruments
- Use mother-daughter calibration network
- Field measurement campaigns in Europe (BE & FR)
- Drone-based measurement campaigns
 - Unprecedented 3D NH_3 measurements
- Increase knowledge on small-scale NH_3 variation
 - Enhance legislation on NH_3 emissions
- Compare with satellite & airplane IR measurements