



National Institute for Public Health
and the Environment
Ministry of Health, Welfare and Sport

Measurement strategy for air quality policy support and public information

**Optimal combination of reference
measurements and cheap sensors**

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information
combination
sensors
Optimal
quality
policy
strategy
Measurement
reference
air

- Calibration of air quality models
- Uncertainty of calibration
- Optimum use of measurements
- Conclusions
- Questions



Calibration of models



- Every year concentration maps are calculated for all of the Netherlands.
- Best available emissions and dispersion conditions.
- Maps for the previous year are calibrated using reference measurements of the National Air Quality Monitoring Network of the RIVM.
- Up to 45 measurement sites for the main substances: NO₂, PM₁₀, PM_{2.5}
- Also maps for ammonia and soot (EC).

- Always pressure to minimize the cost of the measurements.
- How many reference measurements do you need to calibrate the models?



Simple model calibration



Assumptions:

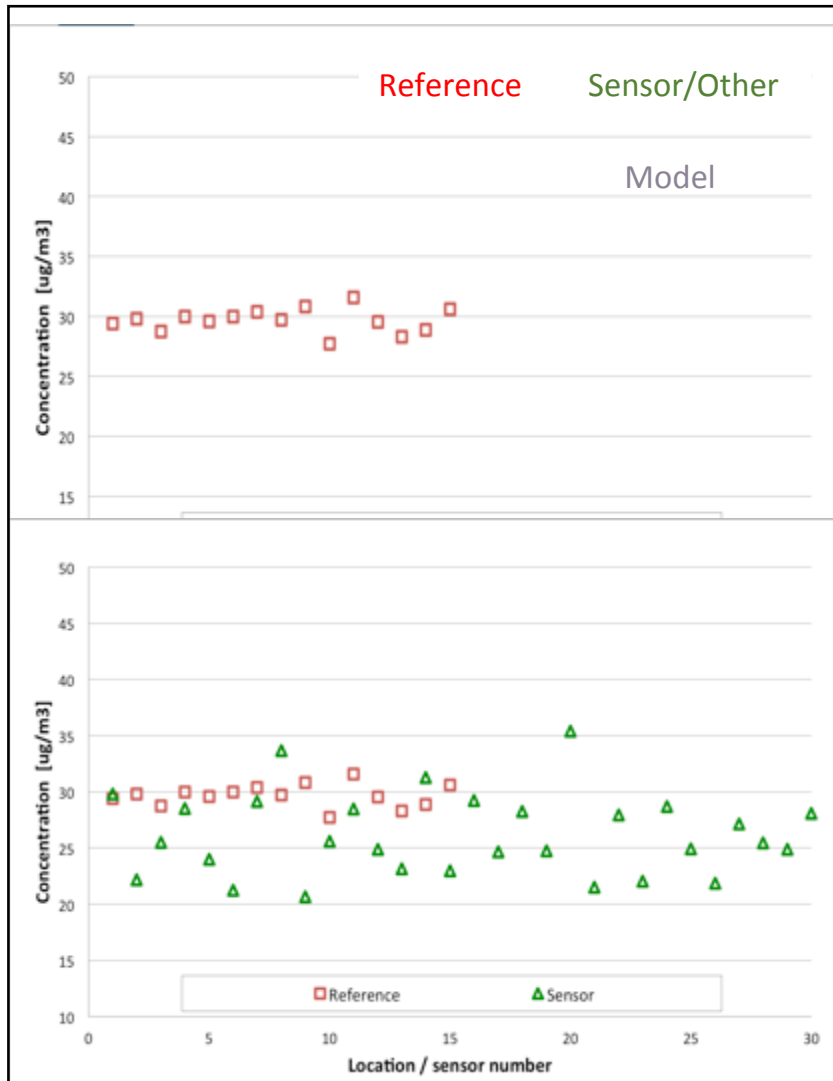
- There are K locations with
 - Reference measurements,
 - Sensor/other measurements and
 - Model results.
- There are L additional locations with
 - Sensor/other measurements and
 - Model results.
- Uncertainties measurements/model
 - Reference measurements unbiased, random uncertainty s_R
 - Sensor measurements contain bias, random uncertainty s_E
 - Model results contain bias, random uncertainty s_M

Uncertainty of calibration

Procedure:

- Estimate the bias of the K co-located sensors from a comparison with the reference measurements.
- Calibrate the sensors, assume the calibration obtained for the K sensors to be valid for *all* sensors.
- Estimate the bias of the model from a comparison with the K reference measurements and the L calibrated sensors
- Determine the calibration uncertainty:

$$S_{MER}^2 = \frac{\left(\frac{(s_M^2 + s_R^2)(s_E^2 + s_M^2)}{K L} + \frac{(s_E^2 + s_R^2)(s_M^2 + s_R^2)}{K^2} \right)}{\left(\frac{s_E^2 + s_M^2}{L} + \frac{s_E^2 + s_M^2 + 2 s_R^2}{K} \right)}$$

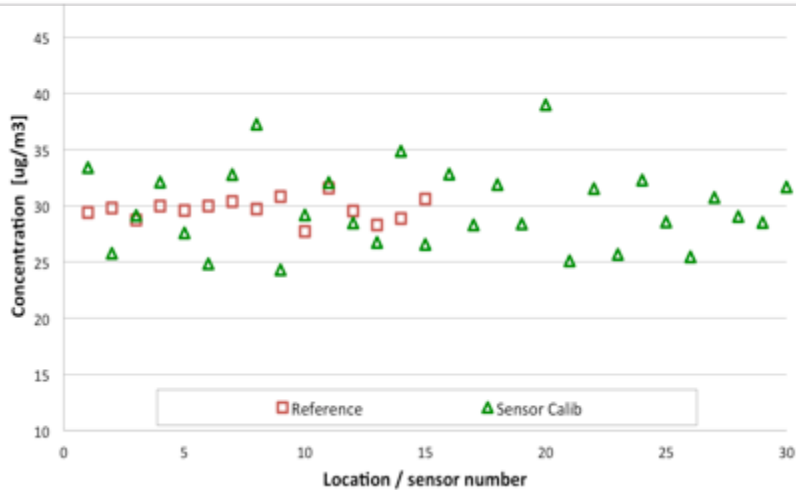
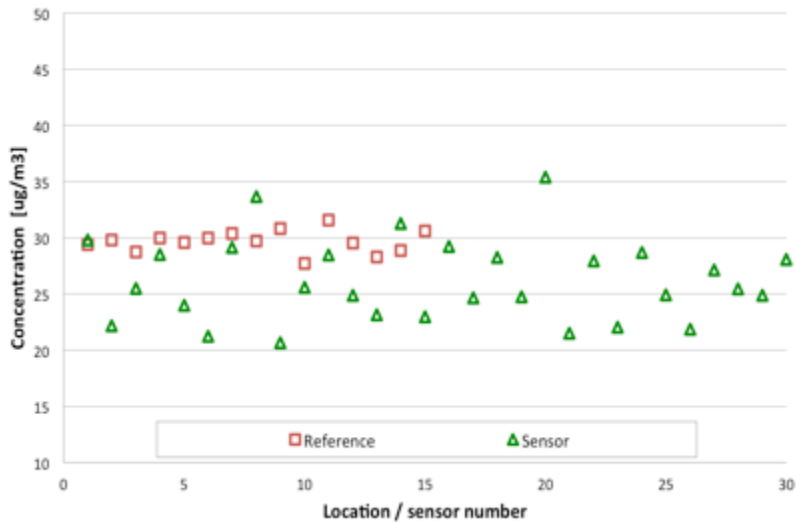


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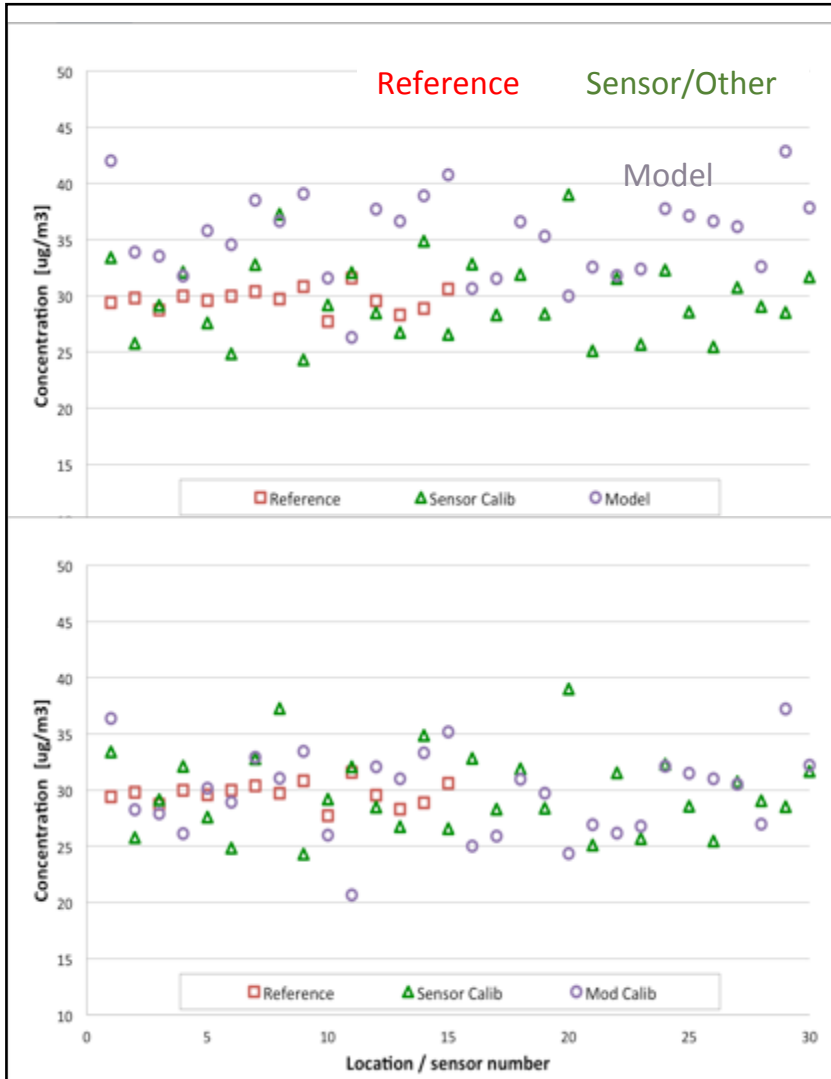


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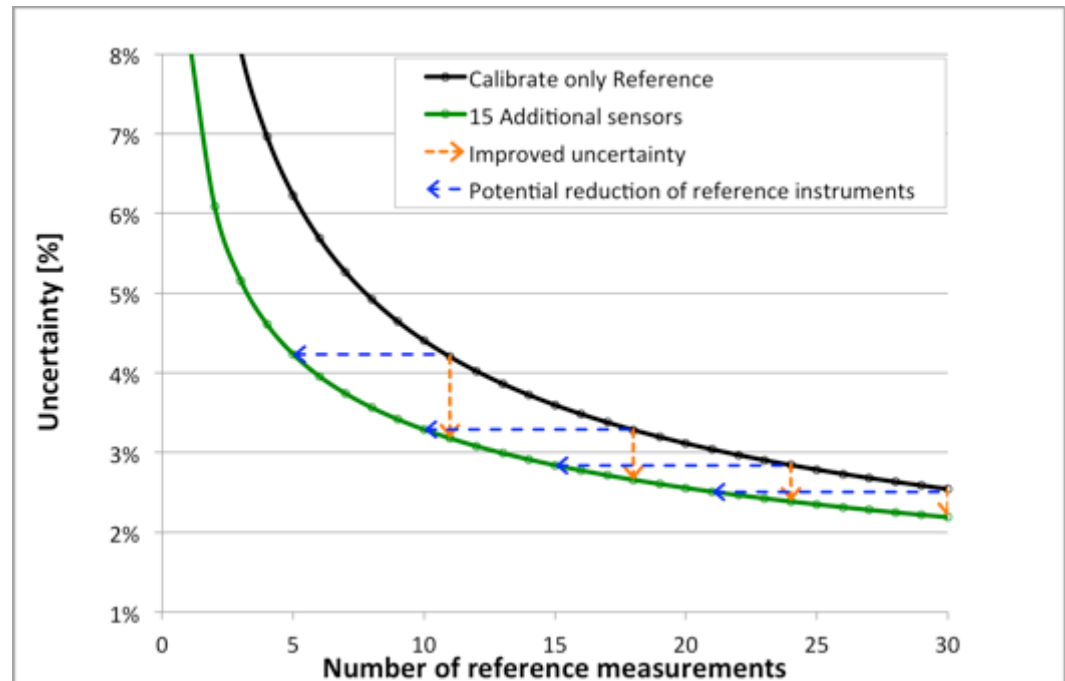


Optimum use of measurements

Compare the calibration uncertainty in the NO₂ model for several options:

- calibration using only reference NO₂ measurements;
- calibration using reference measurements and 15 additional calibrated sensors or indicative measurements (Palmer tubes).

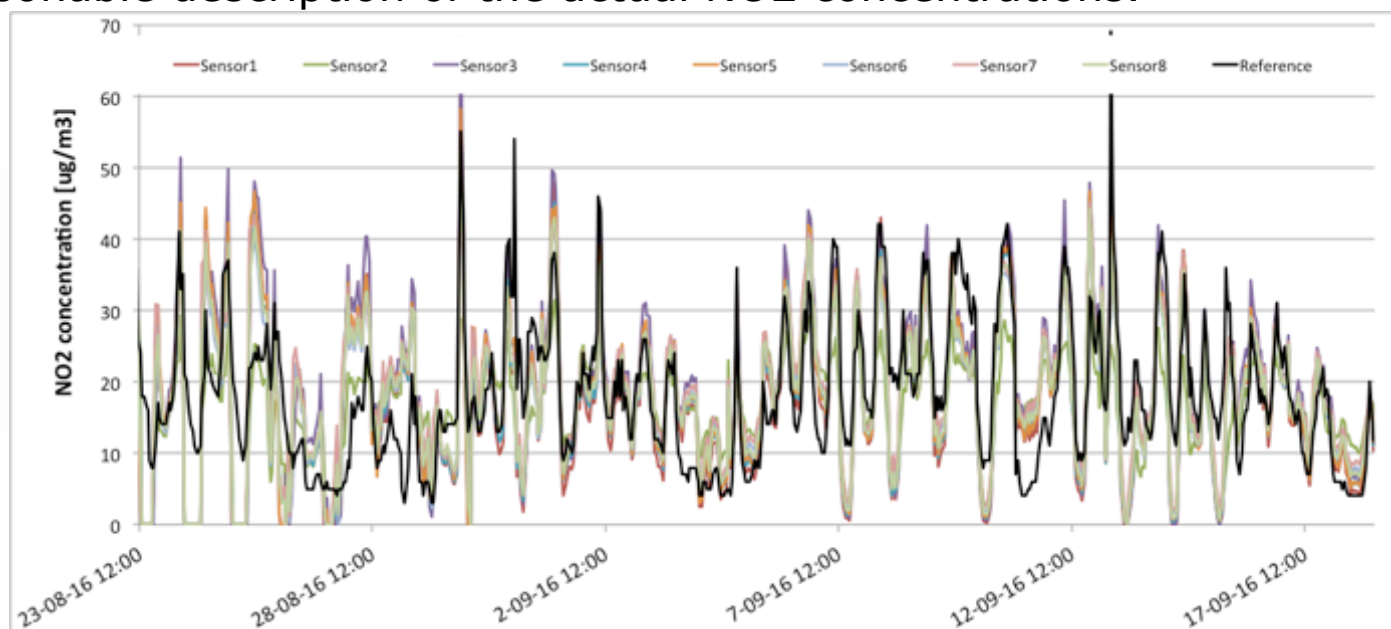
Uncertainty parameters are taken from actual Palmer tubes NO₂ measurements.





Example Alphasense B43F NO2

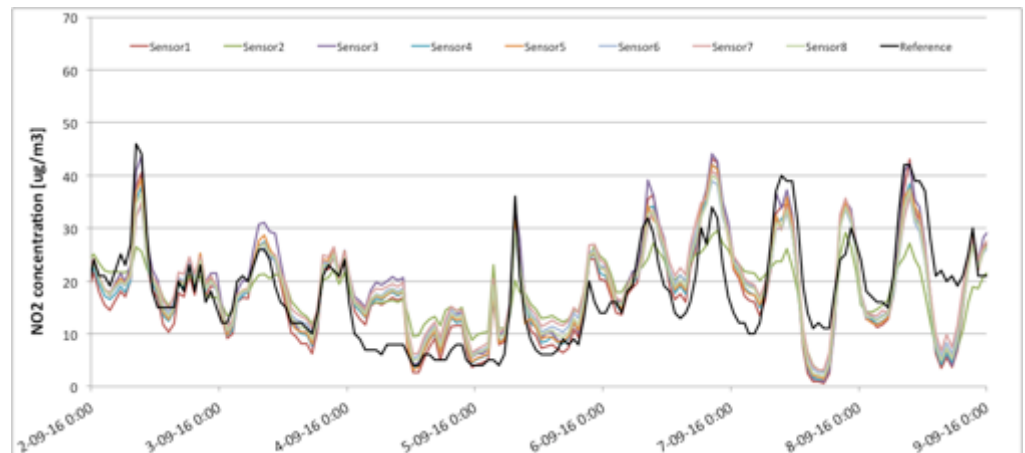
- Work started on using the Alphasense B43F NO2 sensor.
- A fit of the output of the sensor to reference measurements, temperature and ozone yields a reasonable description of the actual NO2 concentrations.





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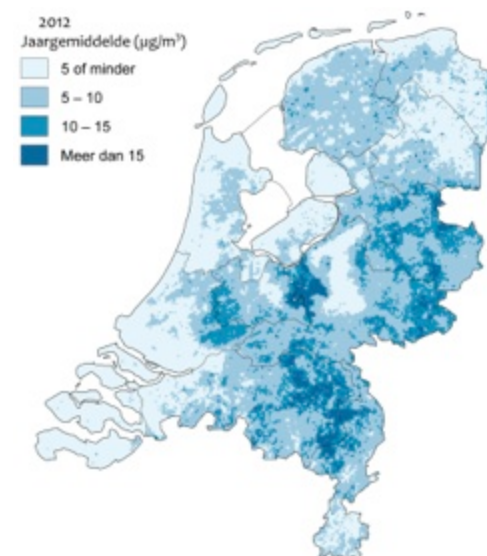
- Work started on using the Alphasense B43F NO2 sensor.
- A fit of the output of the sensor to reference measurements, temperature and ozone yields a reasonable description of the actual NO2 concentrations.
- Several options for calibrating the sensors, among these:
 - Periodic check against reference measurements;
 - Combination of sensor and Palmes tube(s);
 - 'On the fly' calibration using detailed hourly air quality maps.





Example Ammonia

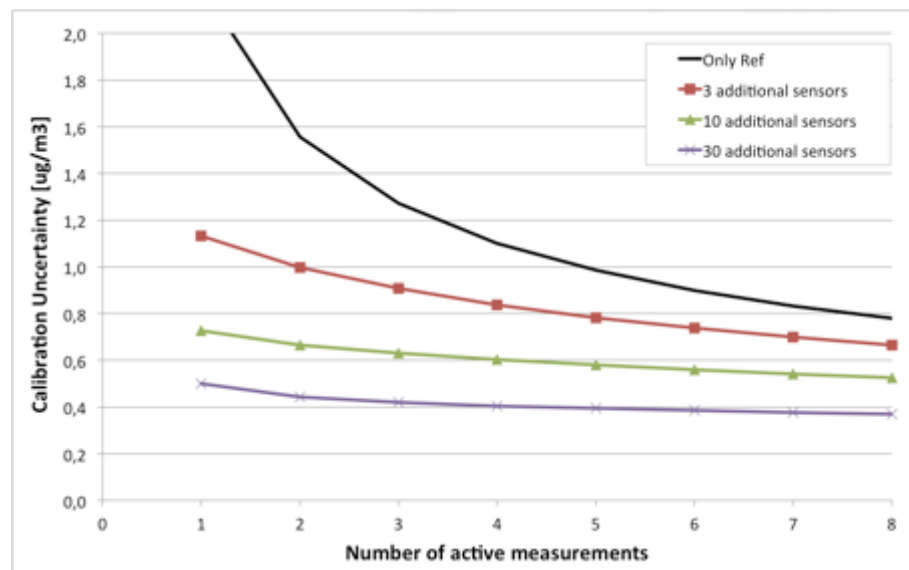
- The reduction of the deposition of nitrogen (mainly consisting of ammonia) is an important objective in many Natura 2000 area's in the Netherlands.
- Extensive monitoring of ammonia concentrations is required.
- Large model uncertainty.
- Until recent 8 advanced monitors, presently only 6.
- Additional ammonia measurements using diffusion tubes.
- A relatively small number of additional measurements results in a significant reduction of the calibration uncertainty.





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- In the near future cheap sensors will be used to augment and to some extent also replace reference measurements.
- Improved model calibration is possible with less reference instruments.
- Presently, all individual sensors must be calibrated.
- It is necessary to determine performance indicators for new sensors (bias, drift, random uncertainty).
- A statistical frame work for monitoring optimization is being developed:
 - Analytic expressions for simple examples.
 - Monte-Carlo simulations for the real world.

Questions?