Reference Quality Upper-Air Measurements: guidance for developing GRUAN data products

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Abstract. The accurate monitoring of climate change imposes strict requirements upon observing systems, in particular regarding measurement accuracy and long-term stability. Currently available data records of the essential climate variables (temperature-$T$, geopotential-$p$, humidity-$RH$, wind, and cloud properties) in the upper-air generally fail to fulfil such requirements. This raises serious issues about the ability to detect, quantify and understand recent climate changes and their causes. GCOS is currently implementing a Reference Upper-Air Network (GRUAN) in order to fill this major void within the global observing system. As part of the GRUAN implementation plan we provide herein fundamental guidelines for establishing and maintaining reference quality atmospheric observations which are based on principal concepts of metrology, in particular traceability. It is argued that the detailed analysis of the uncertainty budget of a measurement technique is the critical step for achieving this goal. As we will demonstrate with an example, detailed knowledge of the calibration procedures and data processing algorithms are required for determining the uncertainty of each individual data point. Of particular importance is the careful assessment of the uncertainties introduced by correction schemes adjusting for systematic effects.

1 Introduction

Owing to the dedication of some outstanding scientists (e.g. Keeling, 1998, CO₂ record) and to the high measurement standards at some atmospheric observatories, a number of valuable datasets are available for the detection of climate change. However, the bulk of meteorological observations have been made for short-term purposes (e.g. weather forecasting) and, due to changing equipment and lower requirements for long-term stability and traceability, those data often have limited value for climate research (Thorne et al., 2005; Titchner et al., 2009). This is particularly true for upper-air measurements of the essential climate variables obtained from the operational radiosonde networks where numerous and poorly documented changes in instrumentation and operational procedures strongly limit their value for climate monitoring (Titchner et al., 2009; Seidel et al., 2004).

Poor sensor performance in the past has limited the application of operational radiosonde measurements for climate studies. A widespread transition to more accurate sensors has occurred in the last decade. The performance of the new systems has proved difficult to link to the performance of the older radiosondes, given the very complex nature of the errors in the older systems. Managing the transition was not helped by the tendency of the radiosonde manufacturers to modify the new designs without informing the users, as errors identified in the radiosondes in operations were rectified.

At the same time, the observational networks are getting denser, mainly due to the excellent observational opportunities offered by satellites (see NOAA (2009); EUMETSAT (2009) for an overview of existing satellite observing
systems). Therefore, the amount of available data is increasing. Most, if not all, of these observations need to be calibrated to a standard or the applied methods need to be validated by comparison to an accepted reference. The reliability of these calibration or validation procedures over long periods of time is of particular importance if these observations are to provide irrefutable, useful data series suitable for monitoring climate changes. However, the necessary reference data are often not available, leading to the unsatisfying situation that a huge majority of observations are not traceable to standards of the international system of units (SI) (Ohring et al., 2007, 2005). This means that separate datasets from different stations, observing platforms, and technologies are not directly comparable and therefore cannot necessarily be combined to give reliable long-term records. Central points for reference quality is the traceability of its calibration and the analysis of measurement uncertainty. In atmospheric science as well as in other disciplines the discussion of measurement uncertainty is not as common as it should be, often leading to questionable interpretations and conclusions (Moldwin and Rose, 2009).

The purpose of this paper is to provide general guidelines for establishing reference upper-air measurements using both in situ and remote sensing instrumentation. We define the requirements an observation must fulfill in order to serve as a reference which can be used for calibrating or validating other observing systems, in particular, satellite instruments. The challenges associated with satisfying the requirements of reference quality are illustrated by a case study. Because the GCOS Reference Upper-Air Network (GRUAN) is envisaged to be a small, albeit globally distributed, network of ground stations (Seidel et al., 2009) the focus is on ground-based instrumentation but the principles are more universally applicable.

Most of the observations obtained from the higher atmospheric layers are either retrieved from remote sensing or disposable balloon-borne sensors. To make either of these subject to a robust calibration is a big challenge. Our aim is to provide guidelines that maximize confidence, while still considering the constraints of implementation within a global operational network with a finite budget (in contrast to an active research project). As such, we aim to elucidate the theoretical basis for the GRUAN and give some actual examples that demonstrate how upper-air reference observations using radiosondes are currently being made at various sites.

This paper provides a general definition of the term “reference” as context for GRUAN observations. Beyond delivering reference data for other observation systems, GRUAN aims to produce robust long-term upper-air climate records. This implies quantitative constraints on the measurement properties, in particular with respect to their accuracy and their temporal and spatial density. These issues will be considered in other studies, both outside and within GRUAN as outlined in the GRUAN implementation plan (GCOS, 2009a). The following section gives some basic definitions of the most important terminology used. It is complemented by a glossary at the end of the article. Section 3 describes in detail the steps that need to be taken to achieve reference quality measurements. Section 4 shows how these concepts can be realized in practice using temperature profiles from radiosonde as an example. Section 5 provides a summary.

2 Terminology

The formal terminology relating to measurements and uncertainties is set out in the International Vocabulary of Metrology (VIM) guidelines (JCGM, 2008). The following sections discuss the terms of particular relevance to upper air measurements.

2.1 Errors and uncertainty

Every measurement has imperfections that give rise to an error in the result. As a consequence, a measurement is never a perfect indicator of the instantaneous state of the measured parameter. Traditionally, an error is viewed as having two components, a random and a systematic one. A random error is the result of stochastic variation of quantities that influence the measurement and can never be completely avoided. However, its effect can be reduced by increasing the number of observations, since, by definition, its expected value is zero.

A systematic error introduces a difference between measured values and truth that does not average to zero as the number of measurements increases, thus introducing a non-zero offset. Systematic errors may be fixed in time, or they may change slowly and can be dependent upon some operating conditions, which makes their identification and assessment essential for long-term climate studies. The deviation of the measurement result from truth arising from systematic errors defines the measurement bias. Measurement scientists favor the term bias to describe uncertainty arising from systematic effects. If appropriate fundamental standards are available, systematic errors may be detected and quantified. If the magnitude of a known systematic error is comparable to the required measurement accuracy, a correction may be applied to compensate for the systematic effect, although there will still be a residual uncertainty associated with the correction. For example, it is known that there is a bias of up to 18 mK between the temperature determined by a standard platinum resistance thermometer and the true thermodynamic temperature. The magnitude of this bias has been assessed using acoustic thermometry, which utilizes well-founded physical principles to directly ascertain thermodynamic temperature. By taking advantage of this more fundamental method, a correction can be derived for the standard platinum resistance thermometer (Ripple et al., 2007), reducing the uncertainty against thermodynamic temperature from 18 to 2 mK. Although this example deals with temperature
uncertainties that are much smaller than those required for GRUAN, it illustrates a practical and convincing method for reducing systematic error.

Following the “Guide to the expression of uncertainty in measurement” (JCGM/WG 1, 2008, GUM hereafter) it is expected that the result of any measurement has been corrected for all known significant systematic effects and that every effort has been made to identify such effects. It is important not only to correct for systematic effects but also to robustly ascertain and document the uncertainty of this correction. Clearly, this level of knowledge of the systematic effects requires a detailed understanding of all aspects of the measurement. The lack of exact knowledge of the value of the measurand is characterized by a random variable, the uncertainty $U$, which is evaluated from the uncertainties of all input quantities, including the uncertainties of all corrections that were applied for systematic effects. Provided that proper corrections have been made for all systematic effects, the expectation value (or "expected value") of uncertainty $U$ is zero. In this case, the uncertainty of the measurement result can therefore be expressed by one single value, the standard uncertainty $u$ which is the estimated standard deviation of the random variable $U$.

In practice, the only way it can be assumed that all systematic effects have been properly corrected for is that measurements made by very different physical principles agree to each other within their independent uncertainties (that is, a statistically significant difference between them can be rejected at the desired confidence level). So the use of independent measurement methods is needed to confirm that the systematic effects have been correctly compensated for and therefore provide the best estimate of the overall uncertainty in the measured variable.

The GUM considers Type A and B evaluation of standard uncertainty. Type A evaluation can be used if $N$ independent observations $x_i$ of the same quantity have been obtained. The standard uncertainty $u$ of the mean is estimated by

$$ u = \sqrt{\frac{1}{N(N-1)} \sum_{i=1}^{N} (x_i - \bar{x})^2} \tag{1} $$

If no series of $N$ measurements are available, the uncertainty must be determined by other means than the statistical analysis of series of observations. Any of those other means are referred to as “Type B evaluation” in the GUM.

Since it is virtually impossible to observe a variable in the atmosphere at the same location and same time through several independent observations, Type B evaluation will play a major role for determining the uncertainty of aerological data within GRUAN. Using Type B evaluation, the variance $u^2$ or the standard uncertainty $u$ are evaluated by scientific judgment based on all of the available information on the possible variability of $x$. According to the GUM, the pool of information may include:

- previous measurement data;
- experience with or general knowledge of the behaviour and properties of relevant materials and instruments;
- manufacturer’s specifications;
- data provided in calibration and other certificates;
- uncertainties assigned to reference data taken from handbooks.

(JCGM/WG 1, 2008) In atmospheric profile measurements the uncertainty needs to be determined for each data point (at each altitude) individually. All sources of uncertainty should be summarized to an uncertainty budget. The total resulting uncertainty $u(x)$ is calculated from independent sources of uncertainties $u(v_j)$ associated with the input variable $v_j$ according to the rule of uncertainty propagation for uncorrelated input quantities:

$$ u(x) = \sqrt{\sum_{j=1}^{N} \left( \frac{\partial f(v_1, \ldots, v_N)}{\partial v_j} u(v_j) \right)^2} \tag{2} $$

when $x = f(v_1, \ldots, v_N)$ describes the functional relationship between the final result and the input variables.

### 2.1.1 Uncertainty of multiple measurements

When measurement results are averaged over temporal or spatial ranges, the uncertainty $u_a$ of the average $\bar{x}$ is derived from the uncertainties of the individual measurements $u_i$ by applying Eq. (2) to the rule for calculating the mean. Since the partial derivative of $u_a$ with respect to each individual measurement $x_i$ is $1/N$ it follows:

$$ u_a = \frac{1}{N} \sqrt{\sum_{i=1}^{N} u_i^2} \tag{3} $$

This means that the uncertainty is reduced with $1/\sqrt{N}$, by considering a larger set of individual observations. However, this holds only if the input variables (uncertainties) are uncorrelated. When the most significant source of uncertainty is caused by a particular systematic effect, the individual uncertainties are highly correlated. In this case the uncertainty of a mean value over $N$ data points is estimated by

$$ u_a = \frac{1}{N} \sum_{i=1}^{N} u_i \tag{4} $$

If all $u_i$ were equal, Eq. (4) yields $u_a = u_t$ indicating that the uncertainty in this case is not reduced by averaging. This rule should be used e.g. if smoothing is applied to a vertical profile where the uncertainties are caused essentially by the same systematic effect and are therefore highly correlated.
If the total uncertainty of an average calculated from the uncertainties of individual data points obtained from either Eqs. (3) or (4) is less than the statistical uncertainty of the mean calculated by Eq. (1), the variability of the measurand exceeds the accuracy and resolution of the measurement system. In this case, it is possible to distinguish between measurement uncertainty and variability. The variability can then be expressed as the standard deviation of the observed values \( x_i \) by

\[
\sigma = \sqrt{\frac{1}{N-1} \sum_{i=1}^{N} (x_i - \bar{x})^2}
\]  

(5)

The statistical dispersion of the measured values are indicative of the character of the measurand, namely the natural variability in the space and time frame of the atmosphere under consideration, if, and only if, the measurement uncertainty is less than the variability, i.e. \( u_a < \sigma/\sqrt{N} \) or \( u_i < \sigma \).

It is important to note that the uncertainty \( u_a \), correctly evaluated, always characterizes a property of the measuring system, not of the quantity being measured. Therefore, both values \( u_a \) and \( \sigma \) should be reported as significant information when averages of individual measurements have been used to calculate the final result of a measurement.

2.2 Metrological traceability

Metrological traceability is the property of a measurement result whereby the result can be related to a reference through a documented, unbroken chain of calibrations, each of which contributes to the measurement uncertainty. Figure 1 shows the conceptual traceability chain for an upper air measurement, indicating the steps required to link the measurement to the fundamental SI units. Reference data are based on measurements that relate the measurands, i.e. the quantity to be measured, directly to a standard. This standard can either be an intrinsic standard (e.g., a reference standard that realizes a calibration scale based on a reproducible physical or chemical principle, such as a frostpoint hygrometer) or a certified reference standard (e.g., a standard that carries a calibration scale that is tied, according to a reproducible protocol, to a recognized community measurement standard). GRUAN stations should maintain a “GRUAN site working standard” for each basic unit, e.g. a thermometer periodically calibrated to a NMI standard (Fig. 1), that is used for calibrating the sensor for deployment. For example, in a pre-launch recalibration procedure the thermometer of a radiosonde can be adjusted to a thermometer with a certified calibration. These requirements establish traceability. Where the final data product of a reference observation depends on ancillary measurements, these measurements must again be traceable to standards.

![Conceptual traceability chain illustrating how the calibration of a sensor for deployment is tied to the realization of a SI unit. Each calibration step is defined by a comparison between two measurements with a stated, realistic uncertainty.](image_url)

**Fig. 1.** Conceptual traceability chain illustrating how the calibration of a sensor for deployment is tied to the realization of a SI unit. Each calibration step is defined by a comparison between two measurements with a stated, realistic uncertainty. All relevant details of the measurement comparison that can influence the measurement result must be recorded. SI: International System of units, from the French: Système international d’unités. NMI: National Metrology Institute.

2.3 Measurement traceability

In particular, for climate research, it is important that data users have the opportunity to understand completely how the data that they are using for studying climate, were obtained. Therefore, every user should have access not only to the data, but also to a description of the instrument and algorithm used and, in particular, to any changes that occurred to either or both during the complete life cycle of the dataset (Fig. 2). Proper documentation of the measurements and all related metadata is essential.

2.4 Reference

Reference is a very general term that can refer to the definition of a measurement unit through the practical realization of its basic definition, a measurement procedure that provides sufficient confidence in its results by relating to well-founded physical or chemical principles, or a measurement standard that is calibrated to a recognized standard, in general a standard provided by a National Metrological Institute (NMI). In our context, a fundamental requirement of a reference
Fig. 2. Schematic for establishing reference quality. Reference data must be traceable to an accepted standard. The red boxes contain components jeopardizing traceability. The procedure establishing traceability and determining the uncertainty must be transparent and reproducible.

measurement is that the uncertainty of the calibration and the measurement itself is carefully assessed. This includes the requirement that all known systematic errors are considered and corrected, and that the uncertainty of these corrections is determined and reported. An additional consideration for a reference measurement is that the measurement method and associated uncertainties should be accepted by the user community as being appropriate to the application.

Another important requirement is that the methods by which the measurements are obtained and the data products calculated must be reproducible by any end user, at any time in the future. It should be kept in mind that these end users will continue to look at climate records for decades to come. They should be able to reproduce how measurements were made, which corrections were applied, and be informed as to what changes occurred during the observation and post-observation periods to the instruments and the algorithms.

In brief, reference within GRUAN means that, at a minimum, the observed profiles are tied to a traceable standard at one point (e.g., by an extended, manufacturer-independent ground check of a radiosonde), that the uncertainty of the measurement (including corrections) is determined, and that the entire measurement procedure and set of processing algorithms are properly documented and accessible.

2.5 Redundancy and consistency

One important factor of GRUAN is that independent measurements of the same (or related) variables will be reported in a consistent way. Traditionally, atmospheric observatories operate a large set of instruments, some of which measure the same variable or related variables that strictly depend on each other (e.g., like water vapor profiles and total column water vapor). An important requirement of GRUAN will be that such redundant measurements are cross-checked for consistency as an essential part of the quality assurance procedures. Since all data are to be reported with uncertainties, a consistency check is, in principle, a straightforward task. Roughly speaking, consistency is achieved when the independent measurements agree to within their individual uncertainties.

Speaking in a mathematically more formal way, the hypothesis that two measurements have the same mean value should be tested by statistical methods at a given significance level. For the purpose of most GRUAN quality control tasks the Gaussian test (or “Z-test”) will be the most appropriate way to do this. It requires the knowledge of the measurements uncertainty. It is helpful to introduce the coverage factor $k$ which determines an interval about the mean value as a multiple of the standard uncertainty. Based on the probability density function (PDF) of the dispersion of the uncertainty, the probability that values within this interval are measured can be calculated. Consider two independent measurements $m_1$ and $m_2$ of the same measurand with standard uncertainties $u_1$, and $u_2$, respectively. Assuming that the hypothesis that $m_1 = m_2$ is true and that the uncertainty is normally distributed, the probability that

$$|m_1 - m_2| > k \cdot \sqrt{u_1^2 + u_2^2} \quad (6)$$

occurs only by chance, is roughly 4.5% for $k=2$ and 0.27% for $k=3$. Speaking in statistical terms, if Eq. (6) is true for $k=2$, the null hypothesis that $m_1 = m_2$ can be rejected at a significance level of 4.5%. Simply speaking, it is very likely that the two measurements did in fact not measure the same thing, probably due to some unrecognised or unaccounted for systematic effect. We suggest to call data in this case “significantly different” and if Eq. (6) holds for $k=3$ “inconsistent”.

If the results agree within $k=1$ (i.e. $|m_1 - m_2| < \sqrt{u_1^2 + u_2^2}$) the data are “consistent”, and within $k=2$ they are “in (statistical) agreement” (Table 1). Supporting the hypothesis $m_1 = m_2$ the test loses statistical power with increasing $k$, while the confidence of correctly rejecting the hypothesis increases with $k$.

1 If Type A evaluation of uncertainty was used and both measurement datasets have (about) the same standard deviations, it is more appropriate to use Students t-test for the consistency analysis with the significance levels $\alpha = 5\%$ for defining “significant difference” and $\alpha = 0.3\%$ for defining “inconsistency”. However, since neither of the two mentioned requirements are in general met by atmospheric observations, this method is not expected to play an important role within GRUAN.
Table 1. Terminology for checking a pair of independent measurements of the same quantity for consistency.

| \(|m_1 - m_2| < k\sqrt{u_1^2 + u_2^2}\) | TRUE | FALSE | significance level |
|-----------------------------------|------|-------|-------------------|
| \(k = 1\) consistent             | suspicious | 32%   |
| \(k = 2\) in agreement significantly different | 4.5%   |
| \(k = 3\) inconsistent            | –      | 0.27% |

sets of data are compared and a fraction much larger than 4.5% are significantly different, then either a systematic effect on either or both measurements have been overlooked or the uncertainty was estimated too small. On the other hand, if much less than 32% of data are suspicious the measurement uncertainties are probably smaller than estimated.

If one of the two measurements does not provide uncertainties, the same methodology can still be used. The consistency analysis is made the same way by setting \(u_2\) in Eq. 6 to zero (making the test statistically more powerful, i.e. the risk of yielding false confidence lower, than by arbitrarily assigning some finite value to \(u_2\)). This is equivalent with the notion that this value “does or does not lie within the error bars with a specified coverage factor of the reference measurement”. If none of the measurements has uncertainties attached, a meaningful consistency analysis is not possible.

Problems arise from co-location and co-incidence issues (a radiosonde profile is never obtained at the same time and location as a ground-based or space-based total column measurement). These issues are considered by Seidel et al. (2010). The reader is referred to the GRUAN implementation plan (GCOS, 2009a), for a listing of these and other issues and the working Groups/task teams in charge of addressing them.

3 Establishing operational upper-air reference observations

The establishment of upper-air reference observations on an operational basis consists of definition, execution and evaluation phases. First, the requirements for the measurements, which have been assembled through broad participation of the community, must be understood. Second, a review must be conducted to identify the most appropriate measurement technologies. Third, the performance of those technologies must be systematically evaluated. Additionally, validation, re-calibration, and archiving must be designed and implemented for an operational environment.

3.1 Defining requirements

The climate monitoring requirements for upper-air reference observations have been specified in GCOS (2007). They were derived mainly from the demands of potential users of GRUAN data. However, there will be inevitable constraints arising from technical and budgetary limitations of GRUAN stations, affecting the type and frequency of observations. The GCOS Working Group on Atmospheric Reference Observations (WG-ARO) also made recommendations on requirements for GRUAN reference radiosonde (GCOS, 2009b). There is an ongoing discussion on how to deal with the disparity that often exists between the desirable and the feasible. In a first step, GRUAN data are obtained with currently available and affordable equipment, provided they meet the basic requirements outlined in these guidelines which are a traceable calibration and a thorough analysis of the uncertainty. In a second step, efforts are made to reduce the uncertainties to comply with the requirements of GCOS-112 and to encourage new technologies where they cannot be so reduced. These items should be accomplished in the initial phase of GRUAN from 2009–2013. A detailed analysis of the sources of uncertainty is the first, and often most important, step to improve the accuracy.

3.2 Reviewing existing instruments and choosing candidate(s)

A number of factors come into play in assessing the suitability of instrumentation for GRUAN. These factors include:

- Instrumental heritage: how long has a sensor been in use by the community and for what purpose; how substantial is the body of literature documenting its performance and measurement uncertainty; how widely distributed is the knowledge base that facilitates the sensor’s successful operation?
- Sustainability: are the cost of operation of the sensor and the demands of the sensor on personnel consistent with the resources allocated for GRUAN sites; are the demand and technology available to support the production and utilization of the sensor for a meaningful period of time?
- Robustness of uncertainty: is the underlying accuracy claim for sensor and/or its data products strong; i.e. will it pass the scientific scrutiny and will it be useful for GRUAN science objectives?
- Information content: are temporal/spatial resolution, measurement dynamic range, and other sensor characteristics consistent with GRUAN requirements?
3.3 Identifying and quantifying sources of uncertainty

The major step of obtaining a reference quality data product is the identification and quantification of measurement uncertainties. Doing this using a type A (statistical) approach is a well established procedure. The identification and quantification of type B uncertainties in a way that is robust (e.g., likely to hold up to critical scientific inquiry) is a much more challenging project. Examples of success, relevant to GRUAN, are the efforts to establish a standard for total column ozone using Dobson spectrometers (Komhyr et al., 1989), and Keeling’s extremely reliable measurements of carbon dioxide mixing ratios (Keeling 1998) which have been ongoing for more than half a century. Similar methods have been employed in other areas of natural sciences and in the definition and maintenance of physical measurement units by the international community of national standards laboratories. Some examples of this include the utilization of quantum electrical standards to diagnose the biases in standard voltages realized with electro-chemistry (Hartland, 1988), as well as the example of acoustic thermometry used to check contact thermometry described above. GRUAN can take advantage of these successes by utilizing multiple measurement methods for essential geophysical variables, based on different physical principles, and by working to encourage and make use of ongoing research of relevant measurement methods. Synergies with existing networks like the Network for the Detection of Atmospheric Composition Change (NDACC), which has a focus on remote sensing of the free atmosphere, can be particularly helpful in this respect.

Error sources in radiosonde measurements are thoroughly discussed in the CIMO Guide to Meteorological Instruments and Methods of Observation (WMO, 2006, chapter 12.8). For GRUAN data the uncertainty arising from those sources for the specific sensor in use must be readily quantified and reported. Attempts should be made to identify and quantify unknown sources of uncertainty.

Some sensors/measurement devices derive their calibration from a pre-deployment comparison against an established reference. The results of these pre-deployment calibrations need to be checked to maintain the integrity of the measurement. Additionally, the ageing of components and exposure to unfavorable environmental conditions (e.g. extremes of temperature or humidity, chemical contamination) can cause calibration drifts, which necessitate a full recalibration. These pre-deployment procedures generally add contributions to the uncertainty budget. Other sources of uncertainty arise from systematic effects that affect the sensor during deployment. One example is the positive bias on air-temperature measurement caused by solar radiation (Luers, 1990). This effect is generally corrected for operationally. However, there is limited knowledge about the actual parameters that determine the magnitude of the bias (e.g. radiation and ventilation of the sensor). Additionally, the properties of the sensor (e.g. absorption coefficients) and the mathematical model to determine the bias have their uncertainties. In many cases these adjustments are a black box process. The finite sensor response time also causes bias when the dynamic value of the measurand is changing rapidly relatively to the response time of the sensor. This occurs for example in humidity measurements in the troposphere with radiosondes, where rapid changes from humid to dry layers and vice versa can occur during the ascent. The polymer sensors utilized in most radiosondes are comparatively slow, in particular at cold temperatures, giving rise to the so-called ‘time-lag error’ (Miloshevich et al., 2004). Again, this effect can be corrected but introduces additional uncertainty, e.g. due to limited knowledge of the time-lag constant (which is a function of temperature). All these pieces of the puzzle need to be considered when determining the overall measurement uncertainty at each point of an upper-air profile.

3.4 Defining and validating a GRUAN data product

The operational concept that describes measurement method, calibration, procedures, and algorithms, including those used for corrections and estimation of uncertainties, establishes a data product for GRUAN. Such a data product needs to be validated before implementation as a product of the GRUAN network.

The validation will be made using redundant measurements and testing for agreement as described in Sect. 2.5. Validation is first and foremost a validation of the uncertainty estimates. Agreement of two independent measurements, preferably based on different measurement principles, provides a high degree of confidence that no significant systematic effect was disregarded and uncertainties were not underestimated. As a larger number of comparisons become available, statistical analysis permits the uncertainty estimates to be evaluated further. Referring to the significance levels indicated in table 1, one can deduce that if the measurements agree \( |m_1 - m_2| < 2 \cdot \sqrt{u_1^2 + u_2^2} \) in more than 95% of all cases, the uncertainties are likely to be smaller than estimated. GRUAN includes both in situ and remote sensing methods. In the case of in situ methods, the sensor is generally calibrated directly to the geophysical quantity of interest. In the case of remote sensing methods, the calibrated sensor data are in physical units of radiance and/or frequency, which are then analyzed to provide an estimate of the underlying geophysical variable of interest. Validation of data products for remote sensing methods is therefore a two-step process, whereby the accuracy of both, the sensor calibration and the analysis algorithm (including algorithm parameters), are validated.
Laboratory tests and intercomparisons are fundamental methods for establishing and confirming uncertainty estimates of data products. Laboratory tests provide an opportunity to investigate in detail the performance of sensors under controlled conditions and to measure differences against certified references or other standards. Data from these experiments can be used to detect biases that may be corrected for and to determine calibration uncertainties. Field intercomparisons allow multiple in situ sensors and remote sensing data to be directly compared under the actual atmospheric conditions of the required measurement, and include all of the complex environmental conditions (temperature, humidity, pressure, wind/flow rate, radiation, and chemical composition) that cannot be fully reproduced in the laboratory. These complementary activities increase confidence that measurements are subject to neither unanticipated effects nor undiscovered systematic uncertainties. Therefore field experiments are particularly useful for validating GRUAN data products.

3.5 Implementing a GRUAN data product

From the required steps to develop a GRUAN data product described in the previous section, detailed procedures result. For a data product to be considered established and successfully validated, it needs to be documented in detail including a description of method, algorithms, and the in-field procedures for ensuring and controlling data quality. Results from validation experiments should be published in the peer-reviewed literature or technical notes with a strong preference toward the former. Once this is accomplished, and the data have been shown to meet the requirements of GRUAN regarding accuracy, operability, and stability the product can be considered for operational use at GRUAN sites and suitable for scientific applications. The description of the method and the measurement procedures will constitute an essential part of the GRUAN regulatory materials and procedures.

Implementation of a GRUAN data product at a site involves the installation of the required equipment and training of operators. Essential requirements for GRUAN operations are:

- pre-deployment recalibration to the GRUAN site working standard,
- the routine collection of all relevant meta-data for measurements (e.g. reference values for recalibration, environmental conditions, etc.) and
- on-site quality assurance in general by consistency analysis of redundant measurements.

The latter may be provided by the data processing facility or the Lead Centre.

The schedule of field recalibration and validation procedures should be drawn initially from experience with a given sensor type, then refined according to the results of laboratory tests and intercomparisons. The date and nature of field recalibrations should be included in metadata, so that if future experiments reveal shortcomings in schedules or methods that were in use, uncertainty estimates can be adjusted after the fact to reflect those newly-discovered issues.

Other ways of assuring quality include comparisons to forecast data, visual inspection of curves by experienced staff, or consistency checks to physical principles. These checks do not generally feed directly into uncertainty budgets, but issues identified through such checks usually indicate problems with a specific measurement or unidentified systematic effects. Co-located in situ and remote sensing data are ideal for recurrent consistency analysis, provided that imperfect temporal and spatial co-incidence are considered with respect to the variability of the measurand on the respective scales (Seidel et al., 2010).

3.6 Data archiving and processing issues

Designing proper data archive strategies is essential for establishing a reference measurement network such as GRUAN that has as its over-riding aim long-term stability and traceability of its data products. Data at all intermediate stages of processing need to be archived, documented and disseminated. Raw data (level 0) as produced by the instruments will generally be stored at the sites which need to ensure long-term availability of the data.

A first processing stage, essentially involving conversion to a common data format (e.g. NetCDF), produces level 1 data that will be archived at a dedicated central GRUAN facility. From raw data, a GRUAN data product (level 2) is derived by applying the necessary recalibrations, corrections, and the uncertainty analysis in a consistent and traceable manner across identical instruments from different sites. This data, including its meta-data and documentation, must be easily accessible by end-users.

Data must be processed from one level to the next using algorithms that are fully documented and publicly accessible. Algorithm version control is crucial for this purpose. More details about proposed GRUAN data handling are described in the GRUAN implementation plan (GCOS, 2009a) and will be fleshed out in additional subsequent work.

A uniform processing within the network is strived for in order to ensure absolute commonality of data homogeneity assessment across disparate sites. In the inevitable eventuality that issues arise in the future concerning any aspect of procedures that have been employed to account for data quality, biases, or drifts, it is important to allow for reprocessing of entire data streams to address issues raised. The challenges of climate change require robust and transparent data to base decisions on. Traceability of observations is therefore a key for GRUAN. Traceability in the metrological sense (i.e. traceability to SI) and also in the sense that users should be able to understand in detail how these data were measured.
and processed and able to reprocess as additional knowledge is accrued.

4 Example: determining uncertainty in radiosonde temperature profiles

In this section we give an example of how a reference quality measurement, in the sense described above, can be achieved for radiosonde temperature measurements using Vaisala RS92 or Graw DFM-06 radiosondes. This process is depicted schematically in Figs. 1 and 2. According to these figures, these steps include: substantiating the traceability of the temperature sensor calibration to the SI (in this case the ITS-90 temperature scale and thereby the Kelvin), evaluating the maintenance of that traceability through the ground check procedure, documenting and applying necessary corrections for systematic effects (particularly the radiation correction), and critically assessing the final uncertainty achieved in the atmospheric temperature measurement. The most important step is the determination of the measurement uncertainty. There is ongoing research on these issues and the results discussed below should be considered preliminary. A final assessment with more details will be the subject of a dedicated paper that is currently in preparation.

4.1 Requirements

The requirements for GRUAN measurements of temperature have been specified in GCOS (2007), with an uncertainty of 0.1 and 0.2 K at a vertical resolution of 100 and 500 m in the troposphere and the stratosphere, respectively. Within the current state-of-the-art, these targets seem unrealistic, since the perhaps most accurate temperature sonde, the “Accurate Temperature Measuring Radiosonde” (ATM) (Schmidlin, 1991), claims an uncertainty of 0.3 K throughout most of the upper troposphere and the stratosphere. However, while maintaining the GCOS-112 specification as an ultimate goal for GRUAN, the current focus is on working out the steps described in Sects. 3.3 to 3.5 to establish a reference network in the near future using the best measurement systems currently available.

4.2 Reviewing existing instruments

Instrument review is an ongoing process within the initial phase of GRUAN. It is not expected that all sites use identical instrumentation. Establishing the uncertainty budgets of these instruments is an important step in ensuring the comparability of the measurements from different sites and identifying the technology that is best suited to fulfil the long-term goals of the network.

4.3 Establishing the uncertainty budget

4.3.1 Uncertainty arising from of the indication of the measuring system

The capacitive sensors of the RS92 or DFM-06 change the frequency of a resonant circuit depending on the sensor temperature. This frequency is of the order of 10 kHz and is measured and transmitted with a resolution of 0.01 Hz. The dependency of the frequency on temperature is roughly 0.5 Hz/K. The accuracy of the indication is therefore about 0.02 K and much lower than the stated uncertainty of the sensor of 0.15 K. It can be assumed that the contribution of the frequency measurement to the total uncertainty of the temperature sensor is negligible.

4.3.2 Calibration

The sensors of commercial radiosondes are generally calibrated by the manufacturer who should be able to provide a certificate stating the uncertainty of calibration. If the certificate is issued by a National Metrology Institute or another accredited agency, it generally ensures traceability to SI. A copy of the calibration certificate should be submitted to the GRUAN meta database. The accuracy of the calibration is generally high, i.e., well below 0.1 K, throughout the entire temperature range under consideration (180 K to 310 K). The random error of the RS92 calibration (repeatability) is 0.15 K \((k=2)\) according to the 2005 brochure (Vaisala, 2006). The calibration uncertainty is considered to be an altitude-independent absolute systematic contribution to the uncertainty profile. Altitude-dependent uncertainties are characterized separately. Some radiosondes are recalibrated before launch by a ground check station – this is the case for the Vaisala RS92 radiosonde. This recalibration needs to be handled with the same care as the manufacturer’s calibration. The reference sensors of the ground check station should be regularly calibrated by a certified agency to ensure traceability to SI. In case the reference sensor could be considered a “GRUAN site working standard” (Fig. 1).

The RS92 is recalibrated in a ground check station (GC25) where the sensor is put into a chamber equipped with two reference sensors (Pt 100). These references are supposed to be recalibrated with a cycle of two years. The Lindenberg GRUAN station holds a certificate (issued in 2009) indicating “traceability to the National Institute of Standards and Technology” and states an uncertainty of 0.02 K.

The indications from the two sensors are not visible to the user during the ground check. This data would be very helpful for assessing the uncertainty of this recalibration procedure. From experience it is known that in-air calibration has limited accuracy due to strong temperature fluctuations that are highly dependent on the ventilation of the sensors. The ground check adjustment is typically around \(-0.3\) K (Fig. 3)
with a standard deviation of 0.2 K which was derived using Eq. (1). The reason why the mean value of these adjustments is larger than the claimed uncertainty of the calibration is not known and highlights the dangers of black box processes in ensuring the uncertainty chain (Fig. 2).

Here, the available knowledge about the calibration may not be sufficient to determine the uncertainty in a traceable way. We suppose the overall uncertainty of the calibration is better than 0.2 K but we have to use this number as long as we do not have direct evidence to support a lower uncertainty.

The temperature sensor of the Graw DFM-06 Radiosonde is calibrated in a chamber by the manufacturer to a standard that is traceable to SI. According to the calibration certificate, uncertainty of the references, given here with a 95% coverage probability (i.e. \( k = 2 \)), is better than 0.02 K. The calibration curve of the radiosonde temperature sensors is determined from 12 comparisons in the range from 193 K to 303 K. The calibration curve is a polynomial least-square fit of degree 5 with differences to the measurement less than 0.015 K. Additional errors can arise from the compensation for temperature effects during flight which is obtained using “reference capacities”. This part of the measuring system is not included in the calibration but only in the in-flight measurement. Its contribution to the uncertainty is currently not known. The manufacturer GRAW specifies the total uncertainty of the temperature sensor of the DFM-06 with 0.2 K.

Tests at the Lindenberg Observatory showed that the difference between the DFM-06 sensor and a reference thermometer in a ventilated chamber is below 0.1 K, suggesting that the integration of the sensor in the radiosonde does not significantly change the calibration. Upon request, GRAW disclosed the certificate of their calibration reference, a sample of a calibration protocol of an individual radiosonde sensor, the algorithms used for calculating the temperature from the measured frequencies at the thermocapacitor, and the radiation correction scheme that is applied. Raw data are stored during the radiosounding and are easily accessible. The measurement chain of this sensor is completely retraceable.

### 4.3.3 Radiation correction

The largest part of the overall uncertainty arises from the radiation that is absorbed or emitted by the sensor, in particular during day-time measurements. Radiation can affect the measurement in different ways:

- Incoming radiation heats the sensor directly
- Indirect radiative heating: Incoming radiation heats the sensor framework, the mount that surrounds the radiosonde or any other part of the sounding equipment (incl. the balloon). This heat can then reach the sensor by conduction or via air passing over this part, warming up and then passing over the temperature sensor.
- The sensor emits (long-wave) radiation and is thereby cooled. This effect plays a significant role for sensors with white coatings, but is considered negligible for metallic coatings as used for the RS92 and DFM-06 (WMO, 2006).

Generally, a radiation correction is applied to the temperature by the software in the receiving station. This correction should be documented in the accessible literature and depends on pressure, ventilation (ascent rate), and the incoming solar radiation. The latter is often parameterized using only the solar zenith angle (SZA). However, it depends on many more parameters, in particular the ground albedo, aerosols and clouds.

To assess the magnitude of the direct radiation correction several steps need to be taken:
- the radiation correction \( CR(p, SZA) \) provided by the manufacturer needs to be validated by experiment. The Richard-Assmann-Observatory (RAO) in Lindenberg has recently measured the effect of direct radiation on the Vaisala RS92, InterMet 1, and Graw DFM-06 radiosonde. The details of these measurements will be published in a separate paper. A formula can be derived that relates the radiation effect to pressure, ventilation and incoming radiation.
- The variability of the radiation field is determined using a radiation transfer calculation and varying the above mentioned parameters within the ranges that are to be expected to occur at the measurement site. Figure 4 shows profiles derived from the radiative transfer model “streamer” (Key and Schweiger, 1998) for two cloud scenarios for a November day in Lindenberg, Germany (52.21°N, 14.12°E) at noon. According to the model, the ground fluxes of radiation through the surface of a unit sphere (“actinic flux”) are 21.5 W/m² in the cloudy case and 948 W/m² in the cloud-free case. From the radiation measurements performed at the
Fig. 4. Total radiative field (actinic flux) derived from a radiative transfer model (streamer) for a November day at noon at Lindenberg (52.21° N, 14.12° E) for a scenario without clouds (green) and with strong cirrus and stratocumulus cloud layers (red) as a function of altitude. The blue curve shows the pdf of observed ground total radiation (direct and diffuse)×(1+ground albedo) derived from 10 years of (BSRN) measurements in November between 11:00 to 12:00 UTC (arb.units).

When the radiosonde emerges into dryer air above a cloud, evaporation of the condensed water cools the sensor and creates a cool bias in this region (wetbulb effect). The RS92 seems to be less affected than other sensors, but, this effect can lead to deviations up to 1 K above a cloud and the data need to be flagged appropriately, e.g., by assigning a correspondingly increased uncertainty to data in such regions.

Another issue is the time-lag bias that was mentioned in Sect. 3.3. The time-lag of the temperature sensor of the RS92 is of the order of less than a second over the entire temperature range (Vaisala, 2007). The temperature during the ascent varies generally by less than a tenth of a degree in this time frame (along an adiabatic profile at a typical balloon ascent speed of 5 m/s the temperature gradient is 0.04 K/s). Therefore, it may be assumed that the bias caused by the time lag of the temperature sensor can be neglected.

4.4 Validating the temperature measurements

In fall 2008 an intercomparison campaign was conducted at the RAO Lindenberg in which a number of radiosonde manufacturers participated to check the performance of their products. Figure 6 shows the results of a temperature comparison. It depicts the difference in temperature recorded by each
Fig. 6. Temperature profiles from radiosondes (left) launch with one balloon (L002) on 5 November 2008 at 10:45 UT during the Lindenberg Upper-Air Method Intercomparison campaign (LUAMI). The right panel shows the differences with respect to the Vaisala RS92. The thick blue lines show the estimated standard (solid) and expanded (k=2, dashed) uncertainty of the Vaisala RS92 temperature measurements.

sensor with respect to RS92. The thick blue lines indicate the uncertainty of the RS92 derived in the previous section. In the troposphere, above the boundary layer, the differences lie within the estimated uncertainty, indicating consistency between all instruments. An exception is the range at about 1–2 km where the balloon had passed through a water cloud causing a wetbulb effect.

In the stratosphere, the differences are in some cases larger than the calculated uncertainties. These discrepancies are clearly due to the radiation effect since it increases significantly above a thick cirrus layer which was present at about 11 km. Most likely, the differences between the Vaisala APS instrument (which has the same temperature sensor as the RS92) and the RS92 are due to the indirect radiation effect enhanced by the way this radiosonde was attached to the rig which was not ideal for accurate temperature measurements (the focus of this campaign, and the APS in particular, was on humidity).

In summary this comparison demonstrates, that the estimated uncertainties are consistent with measurements from other instruments in the troposphere and into the lower stratosphere, where there is no wetbulb effect. In the stratosphere some instruments (RS-90 FN, Intermet BAT-4G) show significant differences to the RS92. This is most probably due to larger (direct or indirect) effects of solar radiation on these other sensors. It should be noted, that this was not a proper validation experiment since there was no reference instrument available. It is quite possible that all sensors have biases that can not be revealed by this experiment.

4.5 Improved ground check for RS92

At Lindenberg, every routine radiosonde is tested in an isolated vessel that contains purified water and is slightly heated and ventilated to ensure that the relative humidity in the vessel is at 100%. Since June 2009 this routine check for the humidity sensor has also included a certified temperature sensor. This enables an independent check of the calibration to be routinely obtained. Initial results indicate that the temperatures agree to better than 0.1 K. As discussed in Sect. 4.3, the calibration uncertainty is probably much smaller than the one estimated from the RS92 groundcheck calibration. By simply using an independent ground recalibration to a certified reference this error (and hence the overall uncertainty) could be considerably reduced.

4.6 Data archiving issue

The RS92 ground receiver system (DigiCoraIII) produces a data-base file (*.dc3db) that contains all the measured raw data and most of the relevant meta-data including calibration coefficients, ground-check corrections, surface observations, etc. Therefore, it is useful to archive these files as raw data at least at the site. Data products concerning temperature profiles provided by the DigiCora system generally are
already corrected for the radiation effect. It is important to track the corrections schemes that are used by Vaisala which have for the first time very recently been made available on their web-site (www.vaisala.com) in support of GRUAN converting what was a black box process into one that is now transparent. These data products are produced by scripts that generally are individually installed at each station. In order to provide homogeneous data it is necessary to install a common ’GRUAN’ script on all participating stations that produces a common and well defined (with respect to the applied corrections and filtering) temperature profile necessary for the processing of higher level GRUAN data.

5 Conclusions

A pathway is described for the establishment of reference quality in upper-air climate observations, beginning with the choice of an appropriate instrument and proceeding through data archiving and documentation issues. We conclude that the essential requirement for a reference measurement is that all aspects of the measurement uncertainty are carefully determined and documented. Reference measurements must be traceable to the definition of a SI unit or to an accepted standard. The data must be corrected for known systematic effects and the uncertainty budget of the measurement needs to be established, which includes the uncertainties associated with any applied corrections. The resulting data product must be validated with in-field inter-comparisons. The mathematical tool to evaluate redundant measurements were briefly described and it is demonstrated that uncertainty estimates are vital for performing a meaningful analysis of co-located measurements and validating their error budgets.

Proper documentation and data archiving strategies allow the user of reference data to understand in detail how the measurement was calibrated, conducted, corrected and quality controlled. A comprehensive set of meta-data, collected along with the measurements, are necessary to track artificial effects in long-term records. There is never a guarantee that there are no unrecognized systematic effects or that all such effects are properly accounted for. Therefore, additional measures must be implemented in order to ensure long-term stability of climate records, in particular when it comes to instrumental changes at a site. This includes the necessity of the ability to reprocess entire data streams if new issues are found.

In an example we demonstrate how the determination of the uncertainty budget is obtained in the case of a temperature profile measured with a radiosonde. Based on knowledge of the calibration accuracy, additional laboratory tests, and pre-deployment tests an estimate of the calibration uncertainty was derived. Additional contributions of the uncertainty budget arise from the application of a radiation correction that is necessary for daytime soundings which are impacted by direct radiative heating. A preliminary validation campaign was undertaken based upon results from an intercomparison campaign carried out in Lindenberg in 2008 (LUAMI). Clearly, given the demands of determining the uncertainty and its validation, there is ample work left to be done. However, an altitude-dependent uncertainty profile has been derived that is deemed a reasonable representation of the uncertainty of this sensor for the specific environmental conditions.

The framework presented here provides guidelines for obtaining reference quality measurements to be implemented in the framework of the GCOS Upper-Air Reference Network (GRUAN). GRUAN, which is also a pilot project of the WMO Integrated Global Observing System (WIGOS), aims to provide long-term climate records of essential upper-air variables that can also serve as reference data for the calibration and validation of other observing systems, including satellite-borne sensors. For this application the data quality requirements described above are particularly useful. However, it should be noted that reference quality is just one ingredient necessary for reaching the goals of GRUAN. Other issues concern the maintenance of long-term stability, and the scheduling and accuracy requirements of measurements with regards to the determination of trends.

Appendix A Glossary

<table>
<thead>
<tr>
<th>Term</th>
<th>Definition</th>
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<tbody>
<tr>
<td>Measurand</td>
<td>Quantity intended to be measured.</td>
</tr>
<tr>
<td>Uncertainty</td>
<td>Property of a measurement, characterizing the dispersion of a set or distribution of quantity values for the measurand, obtained by available information. Where possible, this should be derived from an experimental evaluation but can also be an estimate based on other information.</td>
</tr>
<tr>
<td>Standard uncertainty</td>
<td>Measurement uncertainty expressed as a standard deviation.</td>
</tr>
<tr>
<td>Coverage probability</td>
<td>Probability that the set of true quantity values of a measurand is contained within a specified coverage interval.</td>
</tr>
<tr>
<td>Coverage factor</td>
<td>Number larger than one by which a combined standard uncertainty is multiplied to obtain an expanded measurement uncertainty.</td>
</tr>
<tr>
<td>Type A evaluation of uncertainty</td>
<td>Evaluation of a component of the measurement uncertainty by a statistical analysis of measured quantity values obtained under defined measurement conditions.</td>
</tr>
<tr>
<td>Type B evaluation of uncertainty</td>
<td>Evaluation of a component of the measurement uncertainty determined by means other than a Type A evaluation of measurement uncertainty.</td>
</tr>
<tr>
<td>Variability</td>
<td>Standard deviation from the mean value of a variable in a given temporal or spatial range, not to be confused with the measurement uncertainty.</td>
</tr>
<tr>
<td>Accuracy</td>
<td>Closeness of agreement between the result of a measurement and a true value of the measurand.</td>
</tr>
<tr>
<td>Reference standard</td>
<td>Measurement standard designated for the calibration of other measurement standards for quantities of a given kind in a given organization or at a given location.</td>
</tr>
<tr>
<td>Working standard</td>
<td>Measurement standard that is used routinely to calibrate or verify measuring instruments or measuring systems.</td>
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References


