



# Standard Practice for Characterizing Uncertainty in Air Quality Measurements<sup>1</sup>

This standard is issued under the fixed designation D7440; the number immediately following the designation indicates the year of original adoption or, in the case of revision, the year of last revision. A number in parentheses indicates the year of last reapproval. A superscript epsilon ( $\epsilon$ ) indicates an editorial change since the last revision or reapproval.

<sup>ε1</sup> NOTE—Editorial corrections were made throughout in July 2015.

## 1. Scope

1.1 This practice is for assisting developers and users of air quality methods for sampling concentrations of both airborne and settled materials in characterizing measurements as to uncertainty. Where possible, analysis into uncertainty components as recommended in the ISO Guide to the Expression of Uncertainty in Measurement (ISO GUM, (1)<sup>2</sup>) is suggested. Aspects of uncertainty estimation particular to air quality measurement are emphasized. For example, air quality assessment is often complicated by: the difficulty of taking replicate measurements owing to the large spatio-temporal variation in concentration values to be measured; systematic error or bias, both corrected and uncorrected; and the (rare) non-normal distribution of errors. This practice operates mainly through example. Background and mathematical development are relegated to appendices for optional reading.

1.2 *This standard does not purport to address all of the safety concerns, if any, associated with its use. It is the responsibility of the user of this standard to establish appropriate safety and health practices and determine the applicability of regulatory limitations prior to use.*

## 2. Referenced Documents

### 2.1 ASTM Standards:<sup>3</sup>

[D1356 Terminology Relating to Sampling and Analysis of Atmospheres](#)

[D3670 Guide for Determination of Precision and Bias of Methods of Committee D22](#)

[D6246 Practice for Evaluating the Performance of Diffusive Samplers](#)

[D6552 Practice for Controlling and Characterizing Errors in](#)

### [Weighing Collected Aerosols](#)

### 2.2 *Other International Standards:*

[ISO GUM Guide to the Expression of Uncertainty in Measurement, ISO Guide 98, 1995 \(See Ref \(1\), for an additional measurement uncertainty resource.\)<sup>4</sup>](#)

[ISO 7708 Air Quality—Particle Size Fraction Definitions for Health-Related Sampling<sup>4</sup>](#)

[ISO 15767 Workplace Atmospheres—Controlling and Characterizing Errors in Weighing Collected Aerosol<sup>4</sup>](#)

[ISO 16107 Workplace Atmospheres—Protocol for Evaluating the Performance of Diffusive Samplers, 2007<sup>4</sup>](#)

[EN 482 Workplace Atmospheres—General Requirements for the Performance of Procedures for the Measurement of Chemical Agents<sup>4</sup>](#)

## 3. Terminology

3.1 *Definitions*—For definitions of terms used in this practice, see Terminology [D1356](#).

3.2 *Other terms defined as follows are taken from ISO GUM unless otherwise noted:*

3.2.1 *accuracy*—closeness of agreement between the result of a measurement and a true value of the measurand.

3.2.2 *combined standard uncertainty,  $u_c$* —standard uncertainty of the result of a measurement when that result is obtained from the values of a number of other quantities, equal to the positive square root of a sum of terms, the terms being the variances or covariances of these other quantities weighted according to how the measurement result varies with changes in these quantities.

3.2.2.1 *Discussion*—As within ISO GUM, the “other quantities” are designated uncertainty components  $u_j$  from source  $j$ . The component  $u_j$  is taken as the standard deviation estimate from source  $j$  in the case of a source of random variation.

3.2.3 *coverage factor,  $k$* —numerical factor used as a multiplier of the combined standard uncertainty ( $u_c$ ) in order to obtain an expanded uncertainty ( $U$ ).

<sup>1</sup> This practice is under the jurisdiction of ASTM Committee D22 on Air Quality and is the direct responsibility of Subcommittee D22.01 on Quality Control.

Current edition approved July 1, 2015. Published July 2015. Originally approved in 2008. Last previous edition approved in 2008 as D7440 – 08. DOI: 10.1520/D7440-08R15E01.

<sup>2</sup> The boldface numbers in parentheses refer to the list of references at the end of this standard.

<sup>3</sup> For referenced ASTM standards, visit the ASTM website, [www.astm.org](http://www.astm.org), or contact ASTM Customer Service at [service@astm.org](mailto:service@astm.org). For *Annual Book of ASTM Standards* volume information, refer to the standard's Document Summary page on the ASTM website.

<sup>4</sup> BIPM version available for download from <http://www.bipm.org/en/publications/guides/gum.html>. ISO version available from American National Standards Institute (ANSI), 25 W. 43rd St., 4th Floor, New York, NY 10036, <http://www.ansi.org>.

3.2.3.1 *Discussion*—The factor  $k$  depends on the specific meaning attributed to the expanded uncertainty  $U$ . However, for simplicity this practice adopts the now nearly traditional coverage factor as the value 2, determining the specific meaning of the expanded uncertainty  $U$  in different circumstances. Other coverage factors if needed are then easily implemented simply by multiplication of the traditional expanded uncertainty  $U$  (see 7.1 – 7.4).

3.2.3.2 *Discussion*—The use of a single coverage factor, often through approximation, avoids the overly conservative use of individual component confidence limits rather than root variance estimates as uncertainty components.

3.2.4 *error (of measurement)*—result of a measurement minus a true value of the measurand.

3.2.5 *expanded uncertainty,  $U$* —quantity defining an interval about the result of a measurement that may be expected to encompass a large fraction of the distribution of values that could reasonably be attributed to the measurand.

3.2.5.1 *Discussion*—This definition has the breadth to encompass a wide variety of conceptions.

3.2.5.2 *Discussion*—The expanded uncertainty  $U$  in some cases is expressed in absolute terms, but sometimes as relative to the measurement result. What is meant is generally clear from the context.

3.2.6 *influence quantity*—quantity that is not the measurand but that affects the result of the measurement.

3.2.7 *measurand*—particular quantity subject to measurement.

3.2.8 *measurand value*—(adapted from ISO GUM), unknown quantity whose measurement is sought, often called the true value. Examples are the concentration ( $\text{mg}/\text{m}^3$ ) of a substance in the air at a particular time and place, the time-weighted average of a concentration at a particular position, or the expected mean concentration estimate as obtained by a reference method at a specific time and position.

3.2.9 (*population*) *variance (of a random variable)*—the expectation of the square of the centered random variable.

3.2.10 *random error*—result of a measurement minus the mean that would result from an infinite number of measurements of the same measurand carried out under the same (*repeatability*) conditions of measurement.

3.2.10.1 *Discussion*—Random error is equal to error minus systematic error.

3.2.11 (*sample*) *variance*—the sum of the squared deviations of observations from their average divided by one less than the number of observations.

3.2.11.1 *Discussion*—The sample variance is an unbiased estimator of the population variance.

3.2.12 *standard deviation*—positive square root of the variance.

3.2.13 *symmetric accuracy range  $A$* —the range symmetric about (true) measurand values containing 95 % of measurement estimates.  $A$  is a specific quantification of *accuracy*. (2)

3.2.14 *systematic error (bias)*—mean that would result from an infinite number of measurements of the same measurand carried out under repeatability conditions minus a true value of the measurand.

3.2.15 *Type A evaluation (of uncertainty)*—method of evaluation of uncertainty by the statistical analysis of series of observations.

3.2.16 *Type B evaluation (of uncertainty)*—method of evaluation of uncertainty by means other than the statistical analysis of series of observations.

## 4. Background Information

4.1 Uncertainty in a measurement result can be taken as the range about an estimate, corrected for bias if known, containing the true, or mean reference value—in the language of ISO GUM, the *measurand* value at given confidence. Uncertainty accounts not only for variation in a method's results at application, but also for incomplete characterization of the method when evaluated. In accordance with ISO GUM, uncertainty may often usefully be analyzed into individual components.

4.2 There are several aspects of uncertainty characterization specific to air quality measurements. One of these aspects concerns known, that is, correctible, systematic error or mean bias of a measurement relative to a true measurand value. Several measurement methods exist with such bias left uncorrected because of policy, tradition, or other reason. *Uncertainty* deals only with what is unknown about a measurement, and as such does not include correctible (known) bias. The magnitude of the difference between estimate and measurand value is covered by *accuracy* as defined qualitatively in ISO GUM, rather than *uncertainty*, particularly when the bias is known, but uncorrected. Such methods require specification of both uncertainty and as much as is known of the uncorrected bias, or alternatively the adoption of an accuracy measure.

4.3 Often bias is known to exist, but with unknown value. In the case where only limits may be placed on the magnitude of the bias, ISO GUM generally recommends treating the bias as uniformly distributed within the known limits. Such a distribution refers to independent situations, for example, calibrations, where bias may arise (see 7.4 and Appendix X2), rather than variation at the point of method application. Even though such an equal-likelihood bias distribution may be unrealistic, nevertheless a standard deviation estimate may be made that reveals the limits on the bias. If the even-distribution approximation is clearly invalid for a relevant set of measurements, the procedure may be adjusted slightly by adopting an accuracy measure tailored to the assumed limits.

4.4 Another issue concerns the distribution of measurements. ISO GUM deals only with normally distributed first-order (that is, “small”) variations relative to measurand values. An example to the contrary is afforded by normally distributed data confounded by a small number of apparent outliers (3), which may not detract from the method performance (see Appendix X4 for details). Another example is the determination of an aerosol concentration at one location (perhaps at a worker's lapel) as an estimate of the concentration at a separate

point (such as a breathing zone). In this case the variations can be of the order of the estimate itself and may have the character of a log-normal distribution.

4.5 The spatial inhomogeneity alluded to in 4.4 relates to another point regarding the focus of this practice. The spatio-temporal variations in air quality characteristics are generally so large (4) as to preclude evaluation of a method during application through the use of replicate measurements. In this case, often an initial single method evaluation is undertaken with the purpose of determining uncertainty present in subsequent applications of the method. Confidence in such an evaluation can be specified and relates to the concept of *prediction-intervals* (5) (see 7.2).

4.6 A related subject is measurement system control. The measurement system must remain in a state of statistical control if an introductory evaluation is to characterize later practical applications of the method. Measurement system control is evaluated using an ongoing quality control program, testing critical performance aspects for detecting problems which may develop in the method.

## 5. Summary of Practice

5.1 The essential idea behind ISO GUM is the *analysis* to the fullest extent practical of the elemental sources of what is unknown in the estimate of a measurand value. This contrasts with a *global* or *top-down* determination of uncertainty, which could for example be done ideally by comparing replicate estimates to known measurand values over all conditions expected in application of the method. Although a global uncertainty evaluation may sometimes seem inexpensive, there is a difficulty in covering essential contingencies of the method application.

5.2 Uncertainty component analysis further has several specific advantages over global analysis. The results may be applicable to a variety of situations. For example, an aerosol sampler might be (globally) evaluated as to particle-size-dependent error by side-by-side comparison to a reference sampler in several coal mines. The knowledge obtained may not be as easily applied for sampler use in iron mines, for example, as more detailed information on how the sampler performs over given dust size distributions may be needed. Furthermore, specific problem areas of a given method may be pinpointed. The detailed itemization of uncertainty sources leads to a transparency in covering the essential problems of a measurement method. Examples of potentially significant uncertainty components are listed in Table 1.

### 5.3 Type A and B Uncertainty Components:

5.3.1 Components that have been statistically evaluated during method application may be classified as Type A. (See Section 7 for specific examples.)

5.3.2 Some components are often statistically evaluated during an initial method evaluation, rather than at application. Also acknowledged is a common situation that components may not have been characterized in a statistically valid manner and therefore may require professional judgment for itemizing. Such components are termed Type B uncertainties. Type B uncertainties are often associated with unknown systematic

**TABLE 1 Common Potential Uncertainty Components**

Sampling
personal sampling pump flow rate: setting the pump and subsequent drift
sampling rate of diffusive sampler
sampler dimension (aerosol and diffusive sampling)
collection efficiency of a sampler or sampling medium (also, see (6))
Analytical
aerosol weighing
recovery (for example, chromatographic or spectroscopic methods)
Poisson counting (for example, in XRD methods)
instrument or sensor variation
operator effects giving inter-lab differences (if data from several labs are to be used)
Sample
sample stability
sample preparation (for example, handling silica quasi-suspensions)
sample loss during transport or storage
Evaluation
calibration material uncertainty
evaluation chamber concentration uncertainty
other bias-correction uncertainty
Environmental Influence Parameters
temperature (inadequacy of correction, if correction is made as with diffusive samplers)
atmospheric pressure
humidity
aerosol size distribution (if not measured by a given aerosol sampling method)
ambient wind velocity
sampled concentration magnitude itself (for example, sorbent loading)

error or bias; however, random variation may also fall into this category. For example, a common assumption (see, for example, EN 482) regarding personal sampling in the workplace is that the relative standard deviation associated with personal sampling pump variations is <5 % at essentially 100 % confidence.

### 5.4 Intrinsic versus Environmentally Associated Components: Influence Quantities:

5.4.1 Some uncertainties may be intrinsic to a method. For example, estimates from aerosol samplers may depend critically on sampler dimensions, which if variable leads to intersampler estimate variation.

5.4.2 On the other hand, a sampler's performance may depend on the environment. For example, suppose a sampler is sensitive to temperature changes that are impractical to measure in the field; that is, sampler estimates are not temperature-corrected. Then measurement of this sensitivity during method evaluation together with knowledge of the temperature variation expected for a given field application can be used to determine the uncertainty associated with this effect.

5.4.3 A quantity such as the temperature is known as an *influence quantity*. A common example where influence variables are important involves diffusive monitors, where wind velocity, temperature, pressure, and fluctuating workplace concentrations can affect diffusive monitor uptake rates (Practice D6246, ISO 16107).

5.4.4 Situations exist for which the distribution of an influence quantity is unknown. For example, the deviation between aerosol concentration estimates and samples taken according to accepted convention (for example, ISO 7708) generally depend on the aerosol size distribution sampled. Only limits on the distribution of size distributions (the