# **Resources for Uncertainty Analysis**

Kris Bertness, Physical Measurement Laboratory, National Institute of Standards and Technology, Boulder, CO USA

#### **Overview**

Comparison of experimental results from different experiments or comparison of data with models/theory is only meaningful when uncertainty estimates for data are made.

International organizations publish and periodically revise documents that define best practices and common terminology.

The top level international document of this type is the "GUM", the Guide to the Expression of Uncertainty in Measurement, https://www.bipm.org/en/publications/guides/gum.html

The National Institute of Standards and Technology is the national metrology institute for the United States and publishes additional resources for uncertainty analysis. https://www.nist.gov/pml/nist-technical-note-1297

The NIST Uncertainty Machine: https://uncertainty.nist.gov/

Student presenters at the Electronic Materials Conference may apply for the NIST Student Award by documenting an uncertainty analysis of a numerical result in their presentation due August 31, 2018. https://www.mrs.org/60th-emc-nist-student-award

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And about 200 + more ...

### Combining Uncertainties Propagation of Error

Uncertainty components to a numerical result calculated from data inputs are typically combined by one of two methods:

- Calculated with partial derivatives of the result on the data input variables (see Chapter 5 of the GUM for many examples)
- Monte Carlo simulation varying the input parameters over the uncertainty range of those parameters

#### Example for Statistically Independent Measurements:

Current I calculated from a set of voltage measurements of that current through a resistor with resistance  ${\it R}$ 

I = V/R, where V is the mean value of the voltage measurements

Because errors/variations in *V* and *R* are uncorrelated, these two variables are statistically independent and the combined uncertainty  $u_r$  for I = f(V) is calculated as:  $(u_r)^2 = (1/R)^2 (u_r)^2 + (V/R^2)^2 (u_R)^2$ 

 $u_{\mathsf{c}}^{2}(y) = \sum_{i=1}^{N} \left(\frac{\partial f}{\partial x_{i}}\right)^{2} u^{2}(x_{i})$ 

Or if we multiply both sides by  $(R/V)^2 = (1/I)^2$ ,  $(\mathbf{u}_I/I)^2 = (\mathbf{u}_V/V)^2 + (\mathbf{u}_R/R)^2$ 

#### Example for Correlated Error in Measurements: (taken from GUM, pg. 22)

Ten resistors, each of nominal resistance  $R_i$  = 1 000  $\Omega$ , are calibrated with the same 1 000  $\Omega$  standard resistor  $R_s$  characterized by a standard uncertainty  $u(R_s)$  = 100 m $\Omega$  as given in its calibration certificate. The resistors are connected in series in order to obtain a reference resistance  $R_{ref}$  of nominal value 10 k $\Omega$ . The uncertainty in  $R_{ref}$  is the sum of the uncertainties in each  $R_i$ , that is  $u(R_{ref})$  = 10  $^{\circ}$  100 m $\Omega$  = 1  $\Omega$  because the same standard resistor was used in each calibration and therefore the errors in the sum are perfectly correlated and will add linearly.

### Monte Carlo Example: The NIST Uncertainty Machine



Enter calculation of thermal conductivity of a bar of homogeneous material carrying a heat flow of 4.23 W with temperatures in K and distances in meters. Estimates of uncertainty are entered for each input variable and a distribution format for the deviations (Gaussian above). The NIST Uncertainty Machine returns a value of 0.17 W K<sup>-1</sup> m<sup>-1</sup>  $\pm$  0.038 W K<sup>-1</sup> m<sup>-1</sup> based on the entered standard deviations for each input quantity.

## **Example: Spectroscopy Peak Location**

Position

63

63

61

62

64

59 59

61



(a) Mean = 61.5 eV  $u_p = \sigma / \sqrt{N}$ = 0.65 eV

(b) Curve fit  $61.9 \pm 0.088 \text{ eV}$ Standard uncertainty  $u_n = 0.088 \text{ eV}$ 

Spectrum is a Gaussian peak with noise

Method (a): Acquire 8 spectra and locate peak value in each one, as listed in table. Take mean and uncertainty of the mean.

Method (b) Curve fit (dashed line in figure) with program that returns the uncertainty of parameters for each fit. This method of locating the peak is significantly more accurate, but not infinitely so.

## **A Few Definitions**

Uncertainty components are classified into two categories:

Type A: those which are evaluated by statistical methods Type B: those which are evaluated by other means, such as: experience with, or general knowledge of, the

behavior of relevant materials and instruments, manufacturer's specifications, data provided in calibration and other reports

Type A is loosely referred to "random error" and Type B to "systematic error," but this nomenclature depends on the measurement process and is not absolute.

#### Example: Measuring the temperature T of a liquid bath

- Type A uncertainty: Make ten measurements of the bath temperature with a thermometer and calculate the standard deviation  $\sigma_{\tau}$  of those measurements;  $\sigma_{\tau}$  is a Type A component
- Type B uncertainty: Look up the manufacturer's specified accuracy for the thermometer  $u_{TM}$ 
  - u<sub>TM</sub> is a Type B component

Terminology relating to confidence intervals in a data distribution

Standard uncertainty (k=1) : one standard deviation, 68.3% confidence interval Expanded uncertainty (k=2): two standard deviations, 95.5% confidence interval

