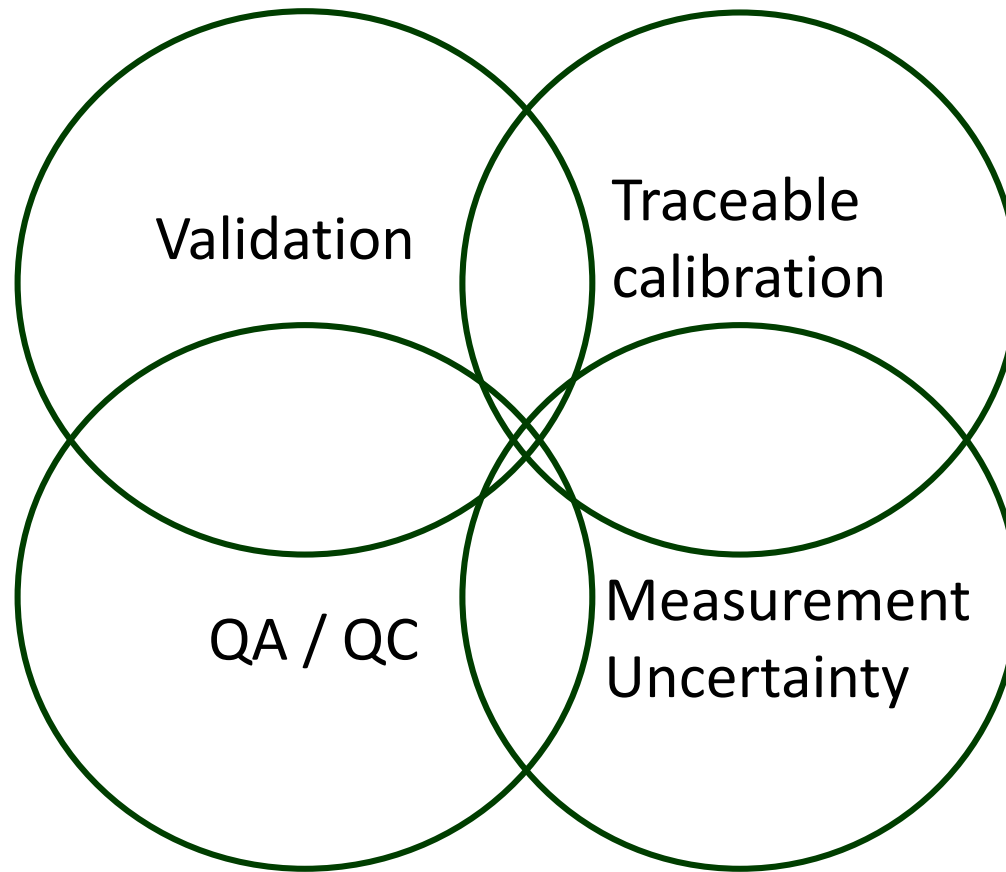


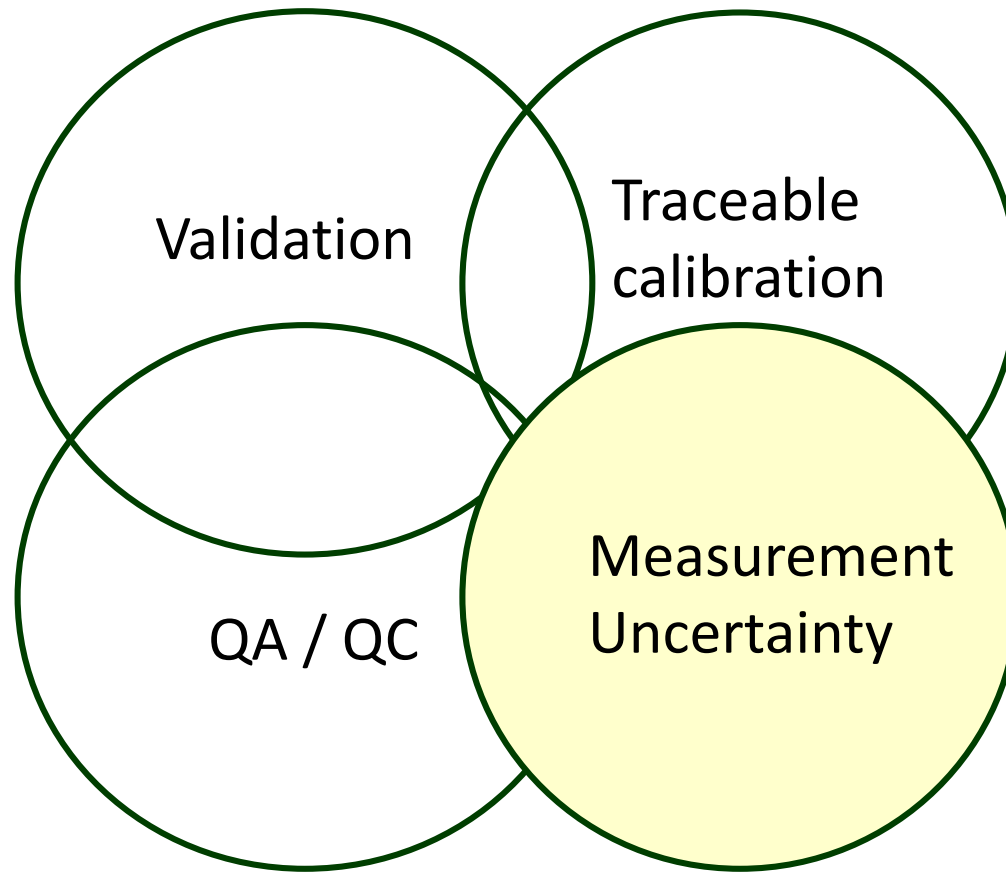
SADCWater PT Chemistry workshop 2018 – Part 3: Uncertainty of Measurement

Maré Linsky
26-27 November 2018

Ensuring valid Analytical Measurements



Ensuring valid Analytical Measurements



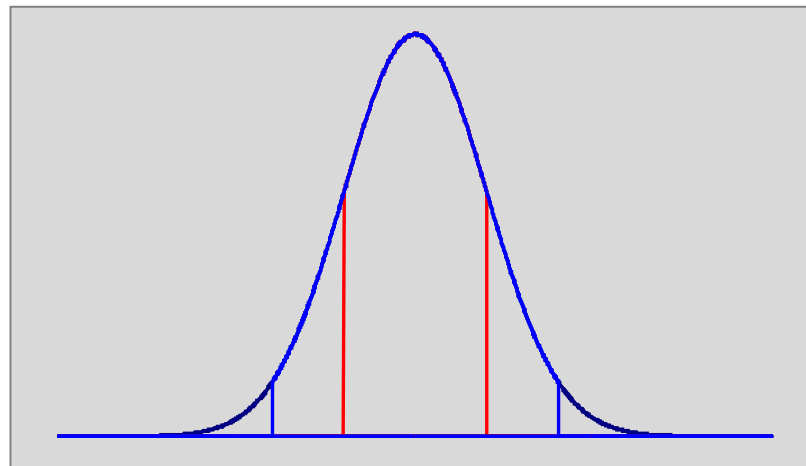
Overview

- What is uncertainty of measurement (UoM)?
- Different approaches to evaluate UoM
 - Bottom Up
 - Top Down
- Basic steps
 - Top Down (simplified)
 - Bottom Up
- Expanded uncertainty

Normal Distribution

Important Properties

- Approximately 68% (68,27%) of the data lie within $\mu \pm 1\sigma$
- Approximately 95 % (95,45%) of the data lie within $\mu \pm 2\sigma$
- Approximately 99,7 % (99,73%) of the data lie within $\mu \pm 3\sigma$



Measurement Uncertainty vs S_{RW}

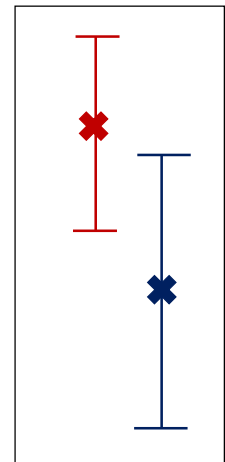
- **Within laboratory reproducibility: S_{RW}**
 - Possible variation in analytical results if same sample submitted to the laboratory at different times
- **Measurement uncertainty**
 - Possible maximum deviation of a single result from the mean or reference value, if the same sample is submitted to several competent laboratories

What is uncertainty of measurement?

- It tells us something about how much you can trust the measurement i.e. the quality of the measurement
- We need two numbers to quantify uncertainty:
 - The width of the margin of doubt, the confidence interval, and
 - The confidence level, how sure we are that the true value is within the margin of doubt.

$$m = 1000.00250 \pm 0.00050 \text{ g} *$$

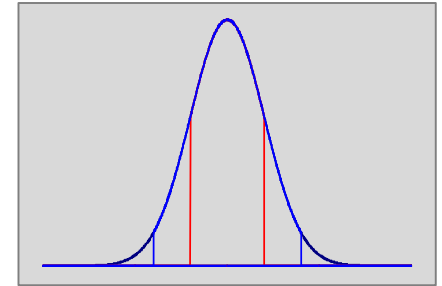
** At level of confidence of 95%*



UoM: Basic concepts

- Standard Uncertainty

$$u(x_i) @ LOC = 68\%$$



- Combined Standard Uncertainty

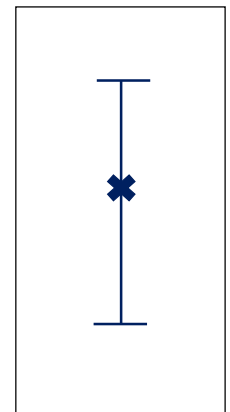
$$u_c(y) = \sqrt{\sum (c_i \cdot u(x_i))^2} \quad \text{OR} \quad u_c(y) = \sqrt{\sum \left(\frac{u(x_i)}{x_i}\right)^2}$$

- Expanded Uncertainty

$$U = k \times u_c(y)$$

k = Coverage factor associated with:

- Level of Confidence (LOC)
- Degrees of Freedom

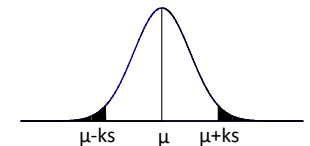
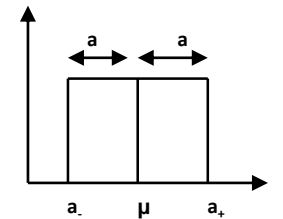
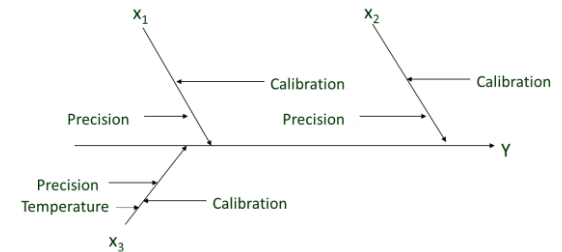


Evaluation: UoM

- Several approaches:
 - Bottom - Up:
 - Based on mathematical model describing the complete measurement procedure
 - Critical to identify all parameters during modelling
 - GUM
 - Top - Down:
 - Use of method validation and quality control data to estimate the uncertainty of measurement
 - No knowledge of model required
 - Approaches: EURACHEM / CITAC, NORDTEST

UoM: Basic steps

- Identify the uncertainty sources
 - Equation / Fishbone
- Quantify individual uncertainties
 - Type A & B uncertainties, OR
 - Reproducibility & Bias
- Calculate combined uncertainty
 - GUM, EURACHEM, NORDTEST
- Calculate the expanded uncertainty
 - $U = k \times u_c$

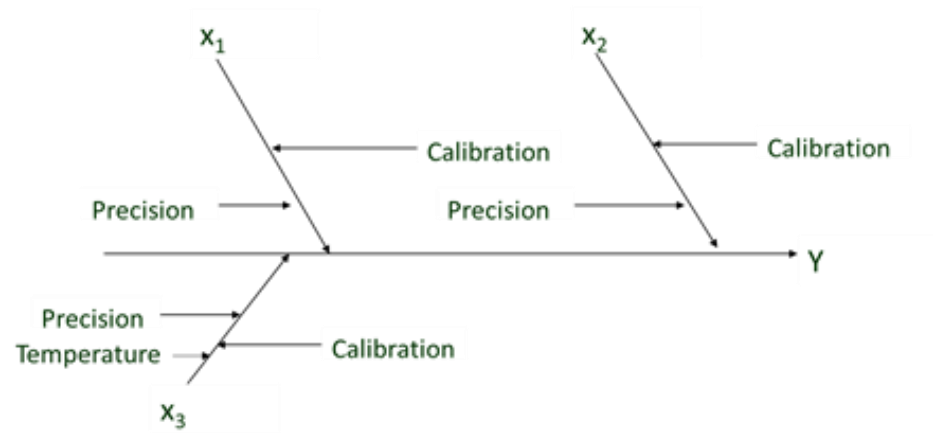


Identify uncertainty sources

- **Mathematical Model**

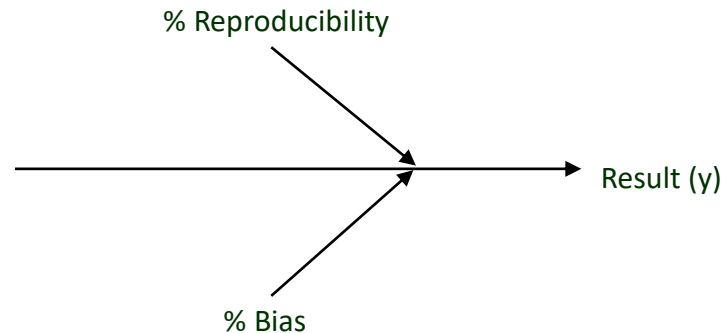
- Bottom-Up

$$Y = \frac{x_1 \times x_2}{x_3}$$



- **Method Validation data**

- Top-Down

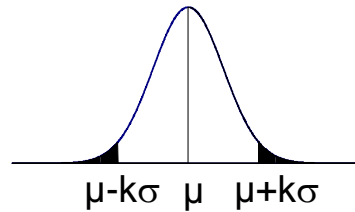


- Bottom Up Approach

Quantify individual uncertainties

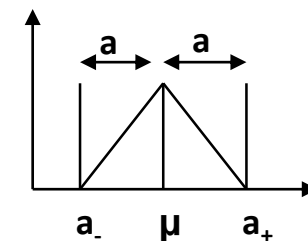
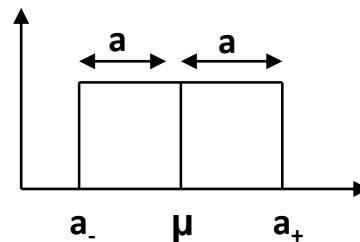
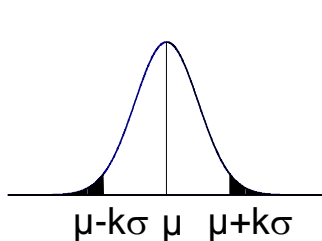
- **Type A:** Estimate and associated uncertainty are directly determined by the current measurement (Statistics)

- Normal distribution:



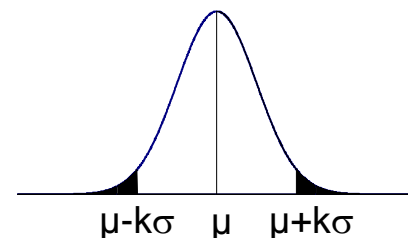
- **Type B:** Estimate and associated uncertainty are brought into the measurement from external sources (Other sources)

- Normal distribution Rectangular distribution Triangular distribution



Quantify individual uncertainties

- Type A:
 - For component of uncertainty arising from random effects
 - Applied when multiple independent observations are made under the same (REPEATABILITY) conditions
 - Normal (Gaussian) probability distribution
 - Examples:
 - **Sample analysed in repeatedly:**
 - Same day, same analyst, same instrument

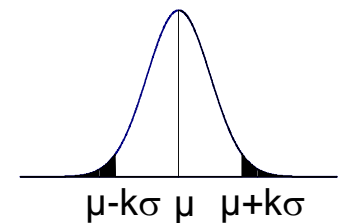


$$u(x) = \frac{s(x)}{\sqrt{n}}$$

Quantify individual uncertainties

- Type B:

- For component of uncertainty arising from random effects
- Applied when results originate from REPRODUCIBILITY conditions
- Normal (Gaussian) probability distribution
- Examples:
 - Results from Certificate of Analysis e.g. CRM
 - Level of confidence / Expanded Uncertainty
 - Method validation data from e.g. control charts
 - Standard deviation



$$u(x) = \frac{U(x)}{k}$$

$$u(x) = s(x)$$

Type B: Normal Distribution

- Example:
- Standard uncertainty (As concentration) associated with a certified calibration standard solution:

Number QC1488-20ML

Lot 019373

Solvent (Matrix) Water, 5% Nitric

Hazard Toxic, Corrosive

Storage & Handling Store at room temperature.

Expiration Date See Sample Label

Certification Date: 11/2/2012

Certified By:



Christopher Rucinski - QA Director

Analyte	Units	Certified ^{1,4} Value	k ⁵
Arsenic, As 1010 Traceable to: NIST SRM 3103a Lot 010713	µg/L	19.4 ± 0.423	1.96
Beryllium, Be 1020 Traceable to: NIST SRM 3105a	µg/L	2.71 ± 0.0614	1.96
Cadmium, Cd 1030 Traceable to: NIST SRM 3108 Lot 060531	µg/L	13.7 ± 0.155	1.96

Type B: Normal Distribution

- **Example:**
- Standard uncertainty (As concentration) associated with a certified calibration standard solution:

- Value:

$$\text{Conc (As)} = 19.4 \mu\text{g/L}$$

- Standard Uncertainty:

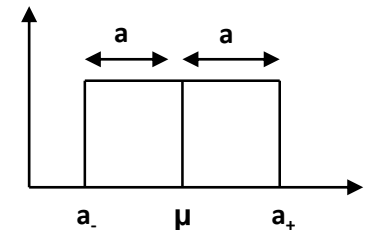
$$u(x) = \frac{U(x)}{k}$$

$$u(x) = \frac{0,423}{2.00} = 0.216 \mu\text{g/L}$$

Quantify individual uncertainties

- Type B:

- Typically only range, half-range (a), minimum or maximum permissible values provided with no additional information
- Rectangular distribution
- Examples:
 - **Manufacturer specifications e.g. balance**



$$u(x) = \frac{a}{\sqrt{3}}$$

Type B: Rectangular distribution

- **Example:**
- Standard uncertainty associated with the linearity of a mass measurement of 5.0 g:

- Value:
 - $m = 5.0 \text{ g}$

- Standard Uncertainty:

$$u(x) = \frac{a}{\sqrt{3}} = \frac{0.0002}{\sqrt{3}} = 0.0012g$$

Model		224	124	613	513	313	213	6102	5102	3102	2102	1102	612
Weighing capacity	g	220	120	610	510	310	210	6,100	5,100	3,100	2,100	1,100	610
Readability	mg	0.1	0.1	1	1	1	1	10	10	10	10	10	10
Repeatability	mg	0.1	0.1	1	1	1	1	10	10	10	10	10	10
Linearity	mg	0.2	0.2	2	2	2	2	20	20	20	20	20	20
Min. sample weight according to USP, typical	g	0.12	0.12	1.5	1.5	1.5	1.5	12	12	12	12	12	12
Temperature limits								-10°C	-20°C				

Quantify individual uncertainties

- Type B:

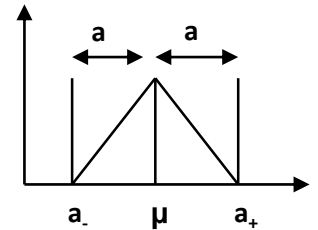
- Typically only range, half-range (a), minimum or maximum permissible values provided with indication that central value is more likely

- Triangular distribution

- Examples:

- Calibration of glassware, e.g. volumetric flasks, pipettes, burettes

$$u(x) = \frac{a}{\sqrt{6}}$$



Combining uncertainties

- Uncertainties must be in same unit, or converted to relative units
- Individual uncertainties (EURACHEM):
 - Rule 1:
 - Individual uncertainties are in the same unit
 - Rule 2
 - For models involving only a product or quotient
- Combine:
 - Continue combining employing rule 1 and 2 until you obtain the combined uncertainty of the result

Combining uncertainties

- Rule 1:

- For models involving only a sum or difference of quantities, *e.g.*

$$y = (p + q - r..)$$

the combined standard uncertainty $u_c(y)$ is given by:

$$u_c(y) = \sqrt{u(p)^2 + u(q)^2 + u(r)^2 + \dots}$$

Example: Rule 1

- Mass by Difference:

$$m_{(sample)} = m_{(boat + sample)} - m_{(boat)}$$

$$u_c(m_{(sample)}) = \sqrt{u(m_{(boat + sample)})^2 + u(m_{(boat)})^2}$$

- Combining individual mass contributions:

$$u_c(m) = \sqrt{u(m_{(readability)})^2 + u(m_{(repeatability)})^2 + u(m_{(linearity)})^2}$$

Model		224	124	613	513	313	213	6102	5102	3102	2102	1102	612
Weighing capacity	g	220	120	610	510	310	210	6,100	5,100	3,100	2,100	1,100	610
Readability	mg	0.1	0.1	1	1	1	1	10	10	10	10	10	10
Repeatability	mg	0.1	0.1	1	1	1	1	10	10	10	10	10	10
Linearity	mg	0.2	0.2	2	2	2	2	20	20	20	20	20	20
Min. sample weight according to USP, typical	g	0.12	0.12	1.5	1.5	1.5	1.5	12	12	12	12	12	12

Temperature limits for verified

+10°C | +30°C

Combining uncertainties

- Rule 2

- For models involving only a product or quotient, *e.g.*

$$y = (p \times q \times \dots) \quad \text{or} \quad y = \frac{p}{(q \times r \times \dots)}$$

the combined standard uncertainty $u_c(y)$ is given by:

$$u_c(y) = \sqrt{\left(\frac{u(p)}{p}\right)^2 + \left(\frac{u(q)}{q}\right)^2 + \dots}$$

This formula was incorrect in the original presentation

Combining uncertainties

- Rule 2

- For models involving only a product or quotient, *e.g.*

$$y = (p \times q \times \dots) \quad \text{or} \quad y = \frac{p}{(q \times r \times \dots)}$$

the combined standard uncertainty $u_c(y)$ is given by:

$$u_c(y) = y \times \sqrt{\left(\frac{u(p)}{p}\right)^2 + \left(\frac{u(q)}{q}\right)^2 + \dots}$$

This is the correct version of the formula.

Example: EURACHEM Rule 2

- Concentration of Mg-calibration standard:

$$\text{Conc}(Mg) = \frac{\text{Conc}(\text{Stock}) \times V(\text{aliquot})}{V(\text{Final Volume})}$$

$$u_c(\text{Conc}(Mg)) = \sqrt{\left(\frac{u(\text{Conc}_{\text{Stock}})}{\text{Conc}_{\text{Stock}}}\right)^2 + \left(\frac{u(V_{\text{aliquot}})}{V_{\text{aliquot}}}\right)^2 + \left(\frac{u(V_{\text{Final Volume}})}{V_{\text{Final Volume}}}\right)^2}$$

Combining uncertainties

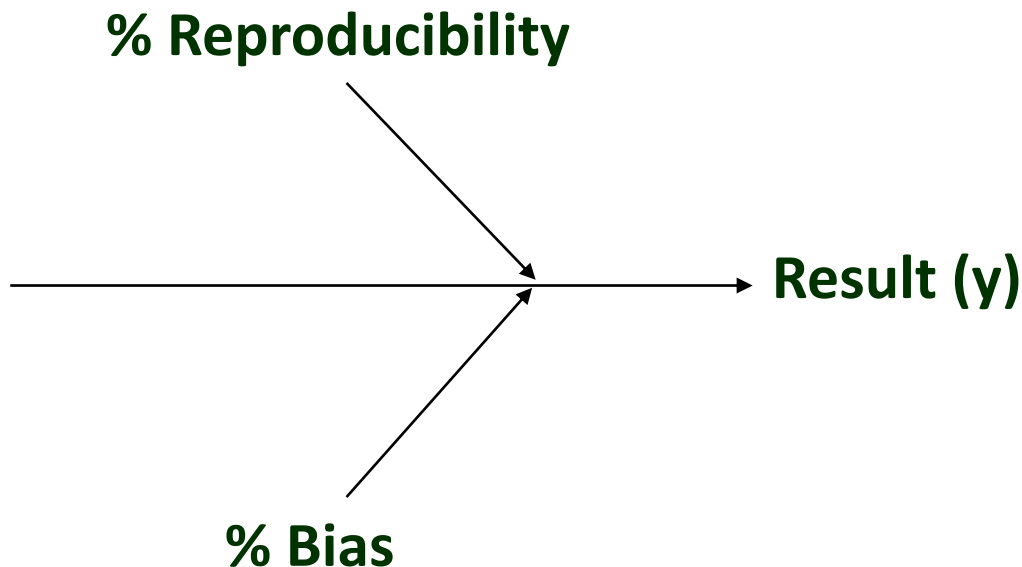
- Uncertainties must be in same unit, or converted to relative units
- Individual uncertainties (EURACHEM):
 - Rule 1:
 - Individual uncertainties are in the same unit
 - Rule 2
 - For models involving only a product or quotient
- Combine:
 - Continue combining employing rule 1 and 2 until you obtain the combined uncertainty of the result

- Top Down Approach

Top Down: Evaluation of UoM

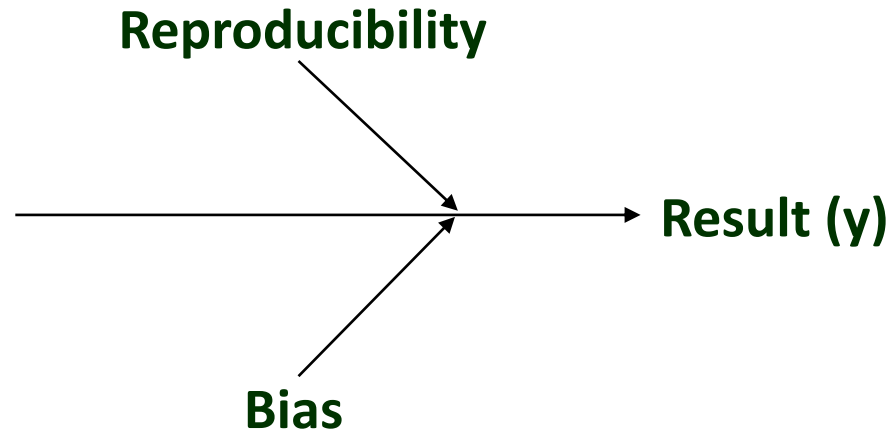
- Top Down:

- % Reproducibility
- % Method and Laboratory Bias



$$\%u = \frac{u(x_i)}{x_i} \times 100$$

Top Down: Evaluation of UoM



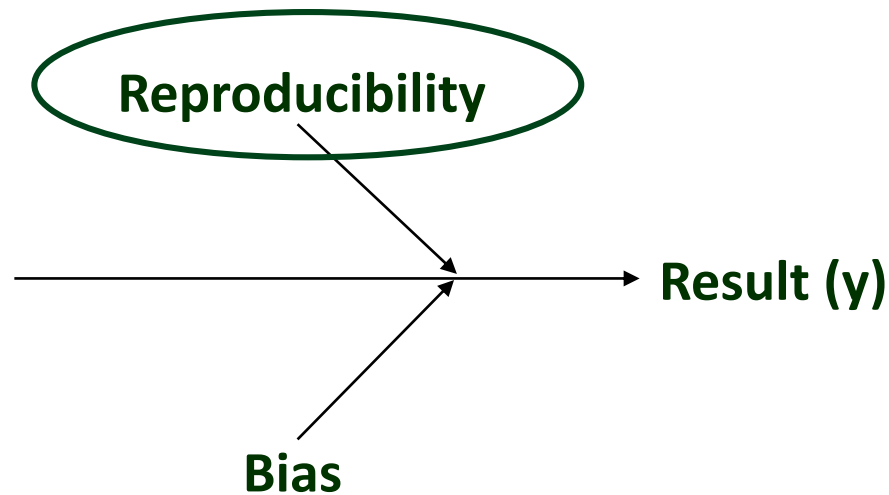
- Provided that reproducibility and bias data is representative:
 - Different stock standard solutions
 - Different batches of reagents
 - Re-calibration of instruments
 - Representative period of time – ideally 1 year
 - Minimum number of results: 50

Top Down: Evaluation of UoM

- Within laboratory reproducibility, R_w
 - Control sample covering the whole analytical process
 - Control sample not covering the whole process, matrix different

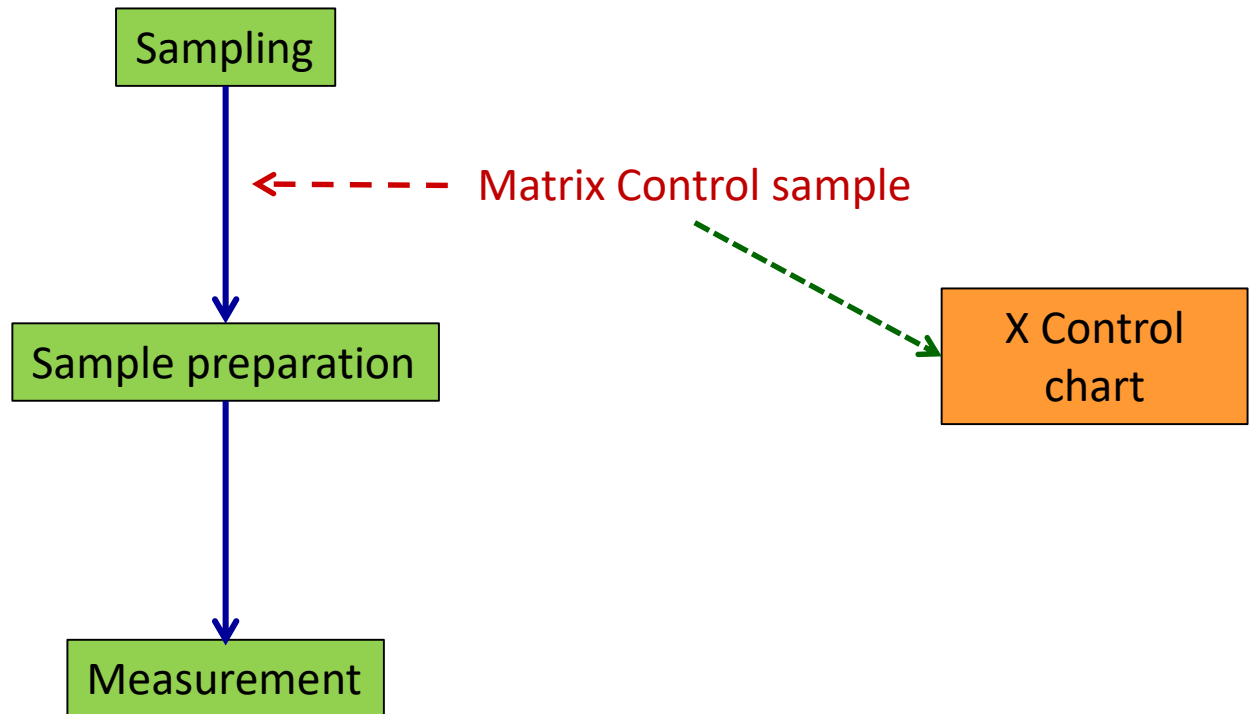
- Method Validation: Method and Laboratory Bias
 - Certified Reference Materials
 - Interlaboratory comparisons / Proficiency testing
 - Recovery experiments

Top Down: Evaluation of UoM



Within laboratory reproducibility, R_w

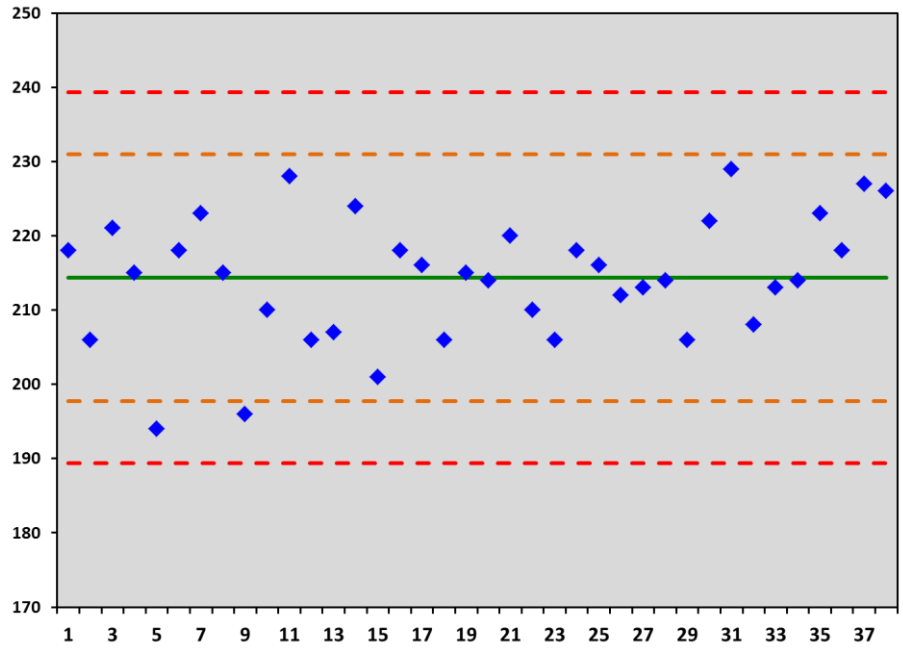
- I: Control sample covering the whole analytical process



Within laboratory reproducibility, R_w

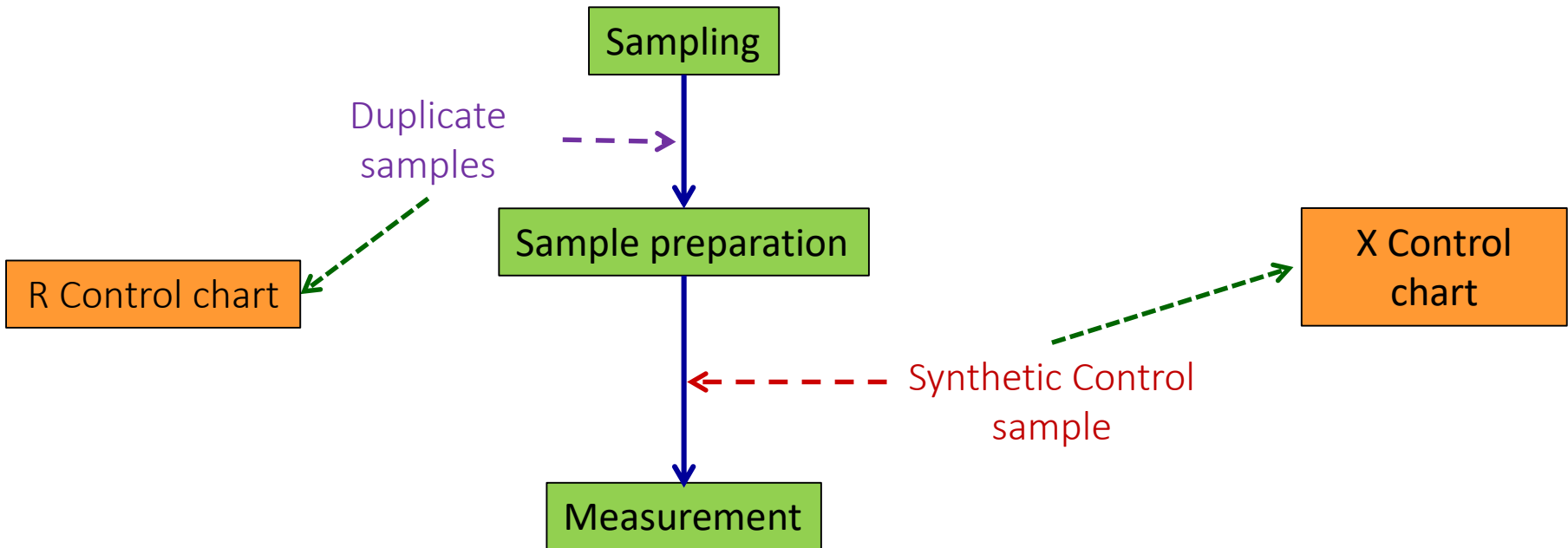
- I: Control sample covering the whole analytical process
 - Mean control chart

$$\%R_w = \frac{S_x}{\bar{x}} \times 100$$



Within laboratory reproducibility, R_w

- II: Control sample not covering the whole process, matrix different



Within laboratory reproducibility, R_w

- II: Control sample not covering the whole process, matrix different

- Mean control chart:

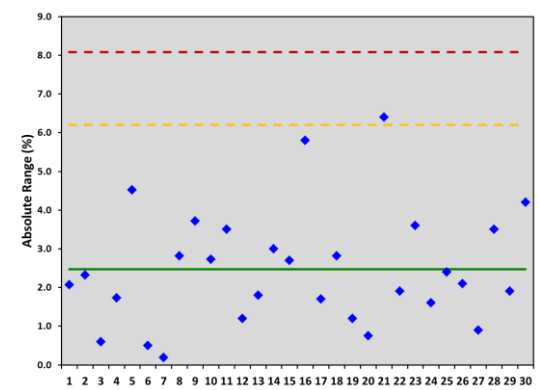
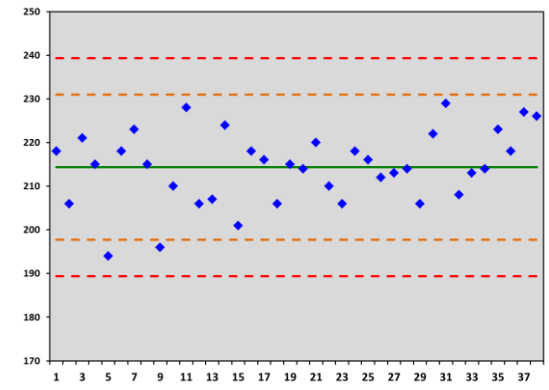
$$\%S_R = \frac{S_x}{\bar{x}} \times 100$$

- Range control chart:

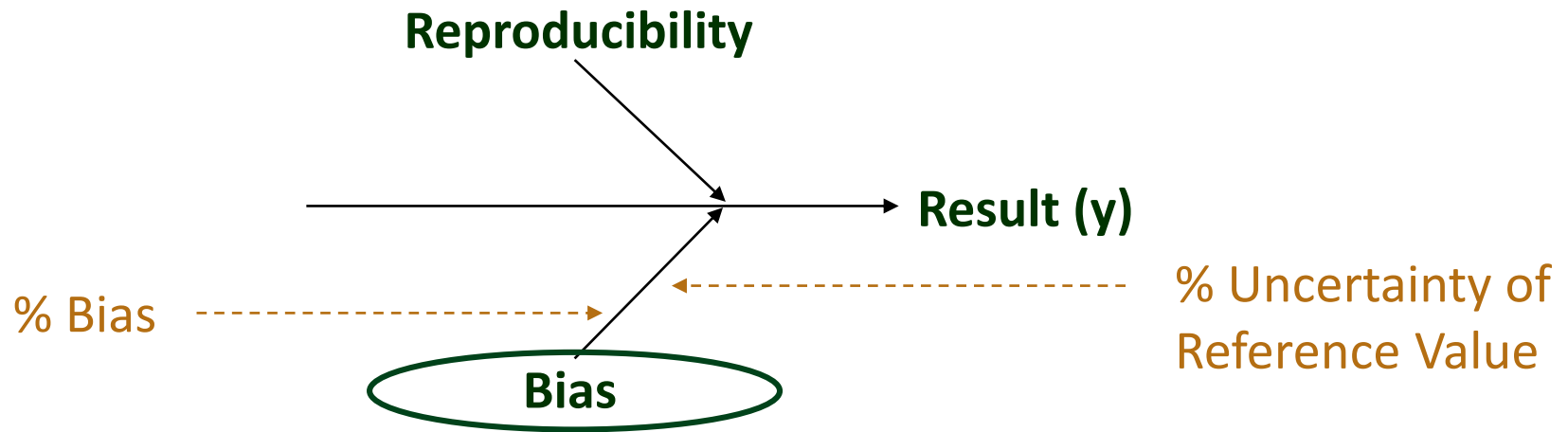
$$\%S_r = \frac{MeanRange}{d_2} \times 100$$

- Within laboratory reproducibility, R_w

$$\%R_w = \sqrt{(\%S_R)^2 + (\%S_r)^2}$$



Top Down: Evaluation of UoM



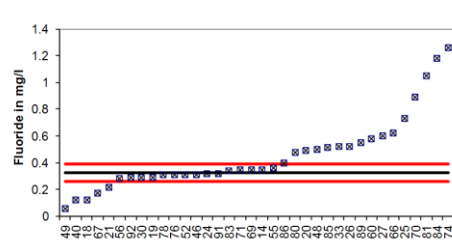
Method and Laboratory Bias (u_{Bias})

- Combination of:

- Bias, % Bias
- Uncertainty associated with the reference value, % $u_c(\text{Ref})$

- Experimentally:

- Certified Reference Materials
- Interlaboratory comparisons / Proficiency testing
- Recovery experiments



Method and Laboratory Bias (u_{Bias})

- Bias, % Bias

$$\%Bias = \frac{C_{meas} - C_{Ref}}{C_{Ref}} \times 100$$

- Combined Bias (several CRMs/PTs/Recovery experiments)

$$RMS_{bias} = \sqrt{\frac{\sum (bias_i)^2}{n}}$$

Method and Laboratory Bias (u_{Bias})

- Uncertainty associated with the reference value, $\%u_c(\text{Ref})$
 - CRM:
 - Expanded uncertainty, $U(x)$:
$$u(x) = \frac{U(x)}{k}$$
 - %Standard uncertainty, $\%u(x)$:
$$\%u(x) = \frac{u(x)}{x} \times 100$$
 - Proficiency test:
 - Reproducibility – all participants: $\%S_R$
 - Number of participants: n
 - Recovery (EURACHEM):
 - $\%u_c(\text{spike})$

Method and Laboratory Bias (u_{Bias})

- Combination of:
 - Bias, % Bias
 - Uncertainty associated with the reference value, % $u_c(\text{Ref})$

$$u_{\text{bias}} = \sqrt{RMS_{\text{bias}}^2 + u(C_{\text{ref}})^2}$$

Top Down: Combining Uncertainty

- Calculate Combined Standard Uncertainty (u_c):
 - Combine Reproducibility and Bias components
 - Reproducibility (R_w): From control samples and other estimations
 - Bias (u_{bias}): From CRM, PT or recovery tests

$$\%ou_c = \sqrt{\%ou(R_w)^2 + (\%ou_{bias})^2}$$

Evaluation: UoM

- Top Down:

- Determine the expanded uncertainty (U):

$$U = k \times u_c(y)$$

- Assume $k=2$ for an approximate level of confidence of 95% with assumed effective degrees of freedom > 30

Which approach to use?

- **Bottom Up (GUM, EURACHEM/CITAC)**
 - Mathematical model needed
 - Complex calculations
 - Smaller uncertainties
- **Top Down (NORDTEST, EURACHEM/CITAC)**
 - No model needed
 - Simpler combination of data already available in accredited laboratory
 - Uncertainties are larger, but perhaps more realistic?
- **Fit for purpose?**

Conclusions

- **Method Validation**

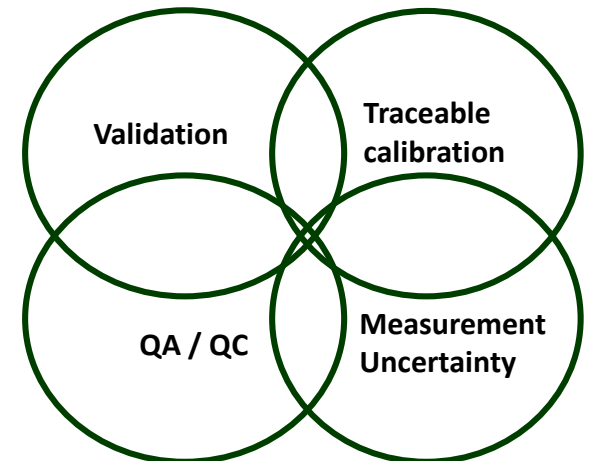
- One part of ensuring valid, traceable results
- Fit-for-purpose
 - Performance characteristics
 - Acceptance criteria

- **Quality control**

- Internal processes
- External processes

- **Uncertainty of Measurement**

- Bottom Up
- Top Down



Trueness: Outlier testing

- View results graphically
- Grubbs' test
 - Small number of samples
 - ISO recommended

$$G = \frac{|SuspectValue - \bar{x}|}{s}$$

- Outlier if $G_{calc} > G_{crit}$
- Dixon's test (Q-test)
 - Sample sizes: $n = 3 - 7$

$$Q = \frac{|SuspectValue - NearestValue|}{LargestValue - SmallestValue}$$

- Outlier if $Q_{calc} > Q_{crit}$

n	Q_{crit} CL at 90%	Q_{crit} CL at 95%	Q_{crit} CL at 99%
3	0.941	0.970	0.994
4	0.765	0.829	0.926
5	0.642	0.710	0.821
6	0.560	0.625	0.740
7	0.507	0.568	0.680
8	0.468	0.526	0.634
9	0.437	0.493	0.598
10	0.412	0.466	0.568

Dixon Test

The Dixon test can be used to test for a single outlier in a univariate data set. This test is primarily used for small data sets (Dataplot limits the sample to be between 3 and 30).

Specifically, given a set of ordered observations Y_1, Y_2, \dots, Y_N , the Dixon test is computed as follows:

Sample Size	Test for Minimum	Test for Maximum
$3 \leq N \leq 7$	$(Y_2 - Y_1) / (Y_N - Y_1)$	$(Y_N - Y_{N-1}) / (Y_N - Y_1)$
$8 \leq N \leq 10$	$(Y_2 - Y_1) / (Y_{N-1} - Y_1)$	$(Y_N - Y_{N-1}) / (Y_N - Y_2)$
$11 \leq N \leq 13$	$(Y_3 - Y_1) / (Y_{N-1} - Y_1)$	$(Y_N - Y_{N-2}) / (Y_N - Y_2)$
$14 \leq N \leq 30$	$(Y_3 - Y_1) / (Y_{N-2} - Y_1)$	$(Y_3 - Y_1) / (Y_{N-2} - Y_1)$

Dixon Test

Dixon's Q test, or just the "Q Test" is a way to find outliers in very small, normally distributed, data sets. Small data sets are usually defined as somewhere between 3 and 7 items

$$Q_{exp} = \frac{x_2 - x_1}{x_n - x_1}$$

Finding the Q statistic for different sample sizes (n) of between 8 and 30 (in Step 2 above):

8 < n < 10: use R_{11} :

$$r_{11} = \frac{x_2 - x_1}{x_{n-1} - x_1}$$

11 < n < 13: use R_{21} .

$$r_{21} = \frac{x_3 - x_1}{x_{n-1} - x_1}$$

14 < n < 30: use R_{22} .

$$r_{22} = \frac{x_3 - x_1}{x_{n-2} - x_1}$$

References

- Eurachem / CITAC Guides:
 - The Fitness for Purpose of Analytical Methods, 2007
 - Traceability in Chemical Measurement, 2003
 - Quantifying Uncertainty in Analytical Measurement
 - The Selection and Use of Reference Materials
- Statistics and Chemometrics for Analytical Chemistry, JN Miller, JC Miller
- Validation of Analytical Methods, Ludwig Huber, Agilent
- GUM: Guide to the expression of uncertainty in measurement,
- Internal Quality control, NORDTEST Report TR 569
- Handbook for Calculation of Measurement Uncertainty in Environmental Laboratories, NORDTEST Report TR 537
- MUKit software, NORDTEST

Sodium in Food: Proficiency testing scheme

Round 1	Savoury Stock Powder (Oct 2018)
Round 2	Bread (Dec 2018)
Round 3	Instant Noodles (Feb 2019)
Round 4	Fat Spread (Apr 2019)
Round 5	Flavoured Snack/Crisp (May 2019)
Round 6	Cured processed meat product (Jul 2019)

Sodium in Food: Proficiency testing scheme

Main parameter: Salt (sodium) content	
Optional Parameters:	
Iron and Zinc	Moisture
Protein	Fat
Total sugar	Cholesterol
Dietary fibre	Vitamins A, B1, B2, B3, B6, folic acid
Energy	

dprevoo@nmisa.org



We measure what matters

Thank you

Maré Linsky
mlinsky@nmisa.org