

Introduction to Metrology: SI unit system and measurement standards, traceability, calibration and measurement uncertainty

Experimental Design 7.2.2013

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#### Mars Climate Orbiter





#### Impact of metrology: NIST SRM case

#### **Cholesterol Measurements**

Improved Cholesterol Measurement Accuracy Saves Health Care Dollars



NIST Contributions to National Reference System for Cholesterol

1967 - Pure Cholesterol SRM (SRM 911)

1980 - Cholesterol in Serum Definitive Method

1981 - First Cholesterol in Human Serum SRM (SRM 09)

1988 – New Suite of Cholesterol in Serum SRMs at MedicalDecision

1997 – New Suite of Fresh-Frozen Serum
SRMs designed to address clinical
analyzer commutability issues; Total-,
HDL-, and LDL-Cholesterol and
Triglyceride Values

Improvement in precision since 1968 has been estimated to save \$100M/yr in treatment costs



#### **Outline**

- 1. Traceability in measurements
  - 1.1 Basic concepts
  - 1.2 Why we need traceability?
  - 1.3 Infrastructure ensuring availability of traceable measurements
- 2. SI the international system of units
  - 2.1 System of units: from trade to science
  - 2.2 Base and derived units
  - 2.3 Measurement standards and traceability
- 3. Measurement uncertainty part 1: Introduction
  - 3.1 Terminology
  - 3.2 Importance of the measurement uncertainty
- 4. Measurement uncertainty part 2: Methods
  - 4.1 Calculating uncertainty
  - 4.2 Calculations step by step
  - 4.3 Uncertainty calculation in practice





# 1 Traceability in measurements

- 1.1 Basic concepts
- 1.2 Why we need traceability?
- 1.3 Infrastructure ensuring availability of traceable measurements



# 1.1 Basic concepts

#### **Terms**

#### **QUANTITY**

- Property of a phenomenon, body, or substance, where the property has a magnitude that can be expressed as a number and a reference (A reference can be a measurement unit, a measurement procedure, a reference material, or a combination of such.)
- Quantity can be a general quantity (e.g. length) or particular quantity (e.g. wavelength of Sodium D line)

#### **MEASURAND**

Quantity intended to be measured

#### **ESTIMATE** (of the measurand); called also MEASURED QUANTITY VALUE

- measured value of a quantity measured value
- quantity value representing a measurement result

#### MEASUREMENT ERROR

measured quantity value minus a reference quantity value



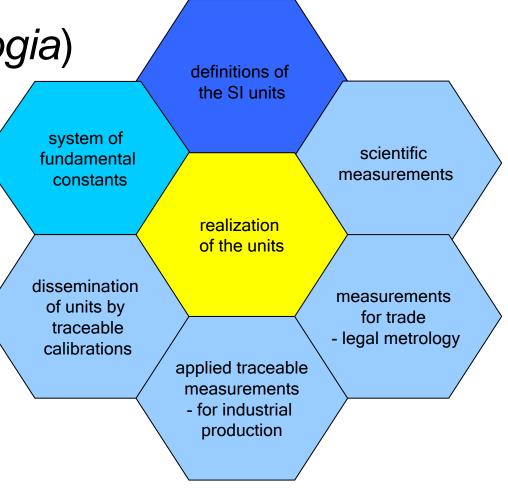
# Metrology (metrologia)

metrology is:

science of measurement and its application

[1.1, 1.2]

Metrology includes all theoretical and practical aspects of measurement, whatever the measurement uncertainty and field of application.





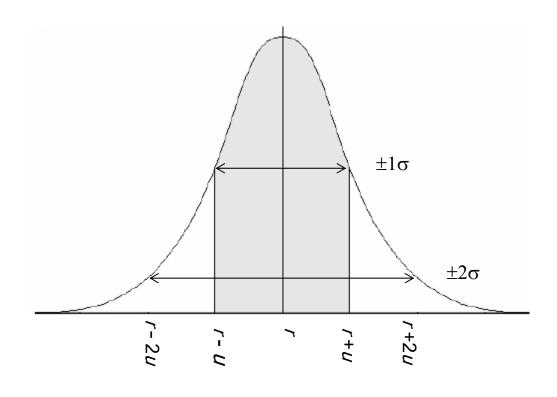
# Metrology (metrologia)

Usually the concept of metrology is limited to:

 Science of measurement studying the relationship between measurands and their estimates (measured quantity values)



#### Uncertainty of measurement (epävarmuus)



non-negative parameter characterizing the dispersion of the quantity values being attributed to a measurand, based on the information used

[1.1, 1.2]



r = estimate = mean value
u = standard uncertainty

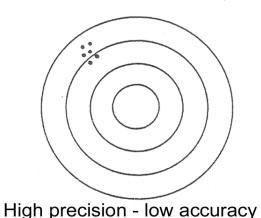


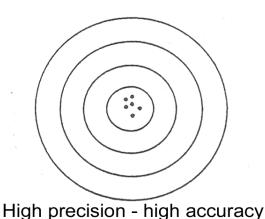
#### Facts about Measurement Results

- Usually a measurement disturbs its target affecting thus the measurement result.
- A measurement result is always a combination of many factors.
   (reading or output signal of the measuring device is only one of them)
- We never know all the factors.
- We never know the "true value" of the factors (we can only estimate).
- The combined effect of unknown factors and inaccurate knowledge on the known factors is described quantitatively with the measurement uncertainty.
- "Absolute certainty is the privilege of uneducated minds ... or fanatics."



# Low precision - low accuracy





**Accuracy and Precision** 

accuracy (tarkkuus)

closeness of agreement between a measured quantity value and a true quantity value of a measurand

precision (täsmällisyys)

closeness of agreement between indications or measured quantity values obtained by replicate measurements on the same or similar objects under specified conditions

[1.1, 1.2]

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#### Calibration (kalibrointi)

operation that, under specified conditions, in a first step, establishes a relation between the quantity values with measurement uncertainties provided by measurement standards and corresponding indications with associated measurement uncertainties and, in a second step, uses this information to establish a relation for obtaining a measurement result from an indication. [1.1, 1.2]

The result of a calibration can be given as

- correction value(s) at discrete measurement point(s)
- calibration equation (curve)
- re-calculated constant(s)
- statement that the error is in given specifications.

A calibration result includes always the uncertainty.

(also the probability level should be given)

Conditions of calibration should be stated when reporting calibration results.



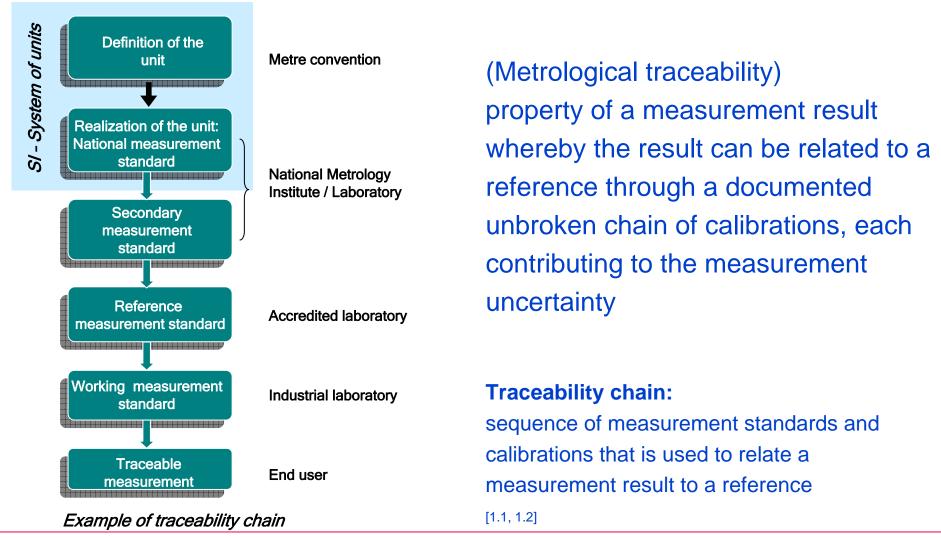
# Adjustment (viritys)

set of operations carried out on a measuring system so that it provides prescribed indications corresponding to given values of a quantity to be measured [1.1, 1.2]

- NOTE 1: Types of adjustment of a measuring system include zero adjustment of a measuring system, offset adjustment, and span adjustment (sometimes called gain adjustment).
- NOTE 2: Adjustment of a measuring system should not be confused with calibration, which is a prerequisite for adjustment.
- NOTE 3: After an adjustment of a measuring system, the measuring system must usually be recalibrated.



# Traceability (jäljitettävyys)

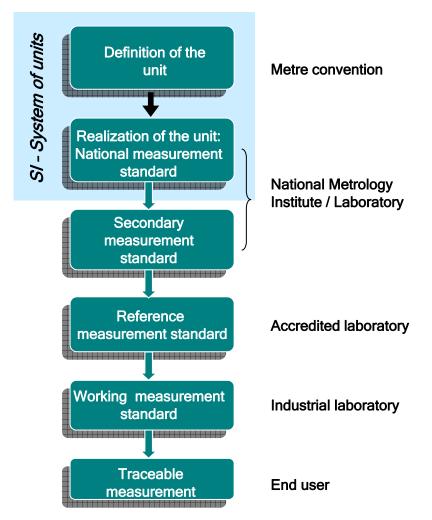




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# Traceability (jäljitettävyys)



Traceability ⇒ Evidence that your unit is of the same size as the internationally accepted one.

Example of traceability chain



#### Measurement standard (mittanormaali)

- realization of a given quantity, with stated quantity value and associated measurement uncertainty, used as a reference
- Measurement standard can be an instrument, a measuring system, material measure or a reference material.

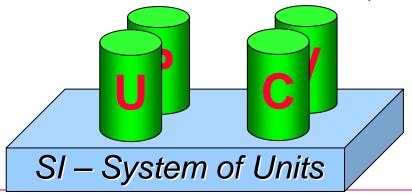
[1.2]



#### Characteristics of Unbroken Traceability

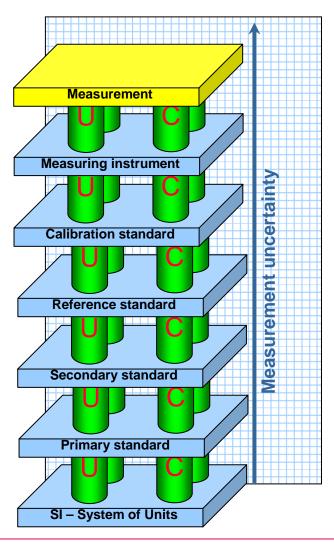
#### For each calibration of the chain:

- Uncertainty estimation
- Documented and generally acknowledged procedures, documented results
- Competence
- Calibration is valid for the application. (interval of calibrations, conditions etc.)





#### **Traceability Tower**



 The tower is collapsed if any part of it is missing or incomplete

i.e.

there is no traceability unless all levels include all the characteristics of traceability

 At any level the measurement uncertainty can't be smaller than levels below.



# Typical problems in traceability

No calibration

Calibration interval too long

No evidence on the traceability in calibration

Calibration was carried out in conditions too different from the application

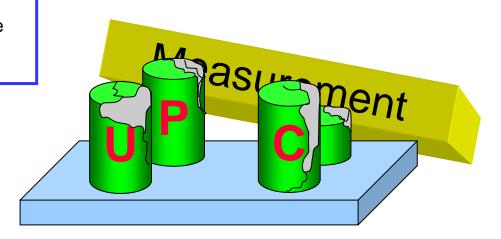
Incomplete traceability chain \_

no traceability

Calibration results have not been used

Calibration covers only a part of the measuring system

There is no evidence on the traceability of the refence materials







1.2 Why we need traceability?

# Traceability – why?

- Modern industrial production is not possible if subcontractors have different scales
- Scientific technical research can not necessarily be repeated if it is done without traceably calibrated instruments
- Traceability is the answer to the questions:
  - From where can I find a reliable measurement standard?
  - How can I convince others of the reliability of my measurement standard?





# Traceability – why?

#### Examples:

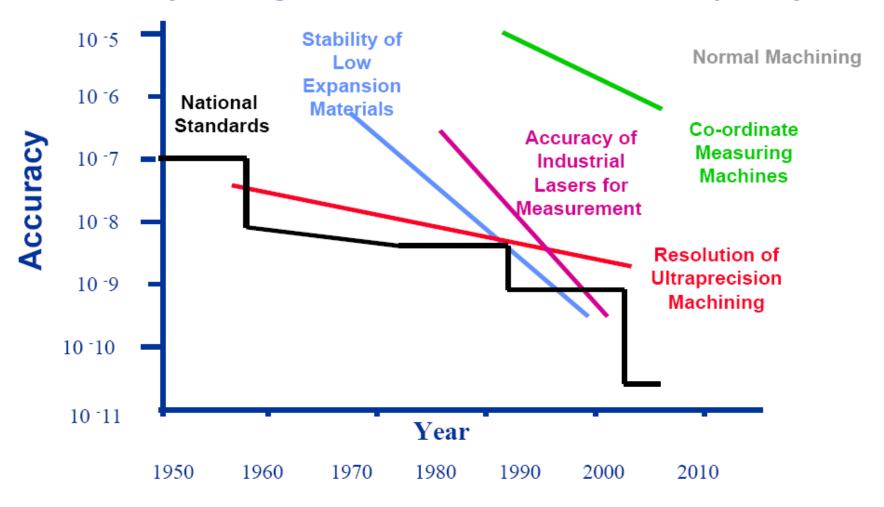
- **Pharmaceutics**
- **Telecommunication**
- **Aviation**
- Space technology
- Safety: Nuclear power plant







#### Accuracy of Length Standards and Commercial Capability 1950 - 2010



Source: DTI UK



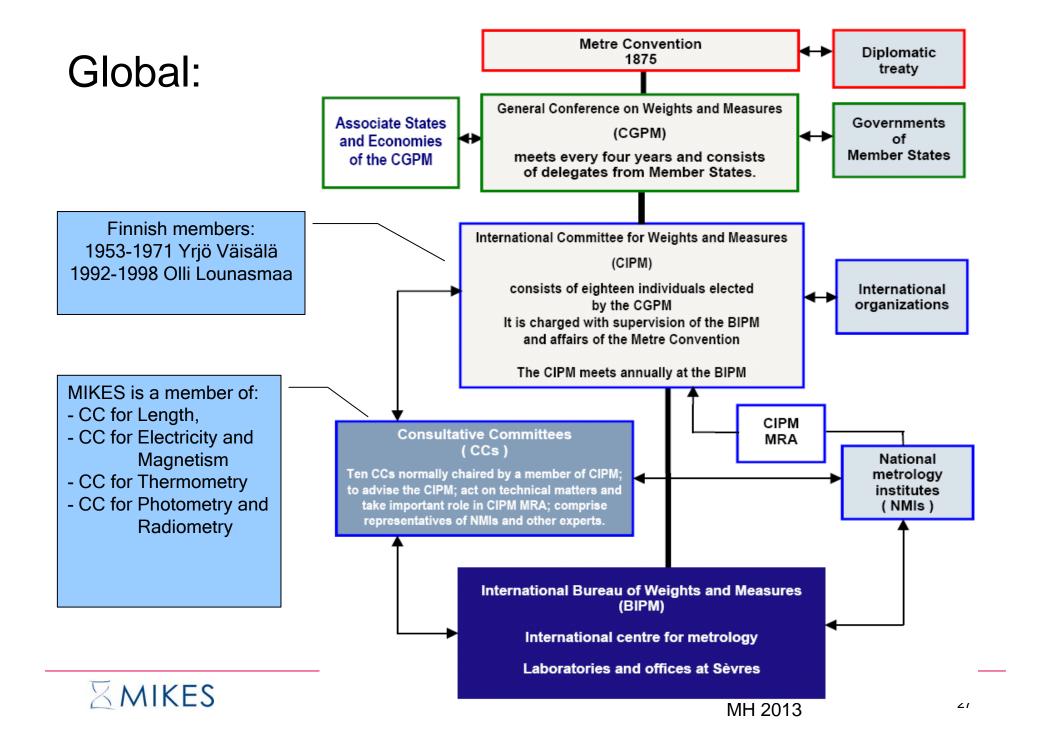


# 1.3 Infrastructure ensuring availability of traceable measurements

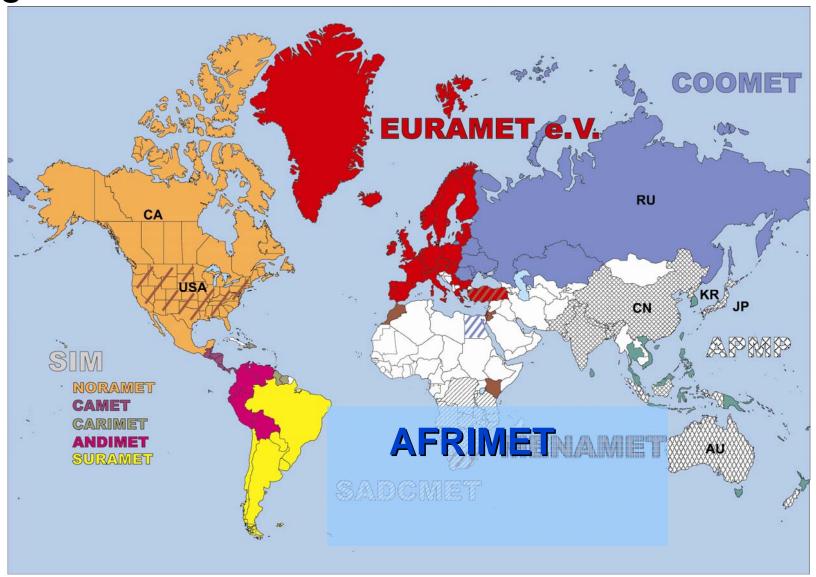
# Metrology Infrastructure

- for ensuring global availability of traceable measurements
- foundation: The Metre Convention a diplomatic treaty first signed in 1875 by representatives of 17 nations
- three levels:
  - Global
  - Regional
  - National



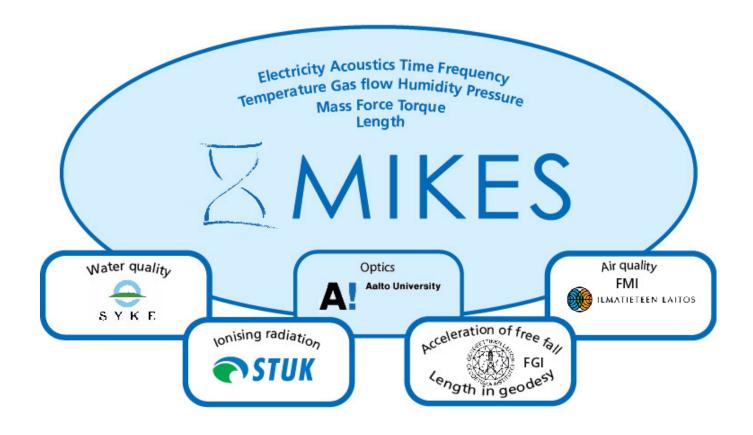


# Regional:





#### National:





National Metrology
Institute (MIKES)
and
Designated Institutes
(STUK, GL, Aalto,FMI, SYKE)

Impact of metrology: Finnish numbers

Approximate amount of traceable calibration and testing certificates issued annually and traceable instruments/measurements

~ 2000

Accredited calibration labs

Accredited testing labs.

~ 20 000

~30

~200 kpl

Calibrations and measurements in industry

Measurements in research institutes

Measurements
by governmental and
communal institutions

~ 2 000 000

Measurements in trade and safety (Legal metroloy)

~2 000 000 000 (00?)

#### Reconnaissance mutuelle

des étalons nationaux de mesure et des certificats d'étalonnage et de mesurage émis par les laboratoires nationaux de métrologie

Paris, le 14 octobre 1999



#### Mutual recognition

of national measurement standards and of calibration and measurement certificates issued by national metrology institutes

Paris, 14 October 1999

#### Comité international des poids et mesures

Bureau international des poids et mesures Organisation intergouvernementale de la Convention du Mètre

#### CIPM MRA objectives:

- to establish the degree of equivalence of measurement standards maintained by NMIs;
- to provide for the mutual recognition of calibration and measurement certificates issued by NMIs; thereby to
- to provide governments and other parties with a secure technical foundation for wider agreements related to international trade, commerce and regulatory affairs

MRA has been signed by 67 NMIs from 45 states and 20 associate states

MRA includes database of NMIs reviewed calibration services with corresonding uncertainties (CMCs)

MIKES has several 100s of different CMC entries





#### 2 SI – the international system of units

- 2.1 System of units: from trade to science
- 2.2 Base and derived units
- 2.3 Unit realisations and measurement standards

# 2.1 A system of units: from trade to science





# SI – system for characterizing physical and chemical phenomena

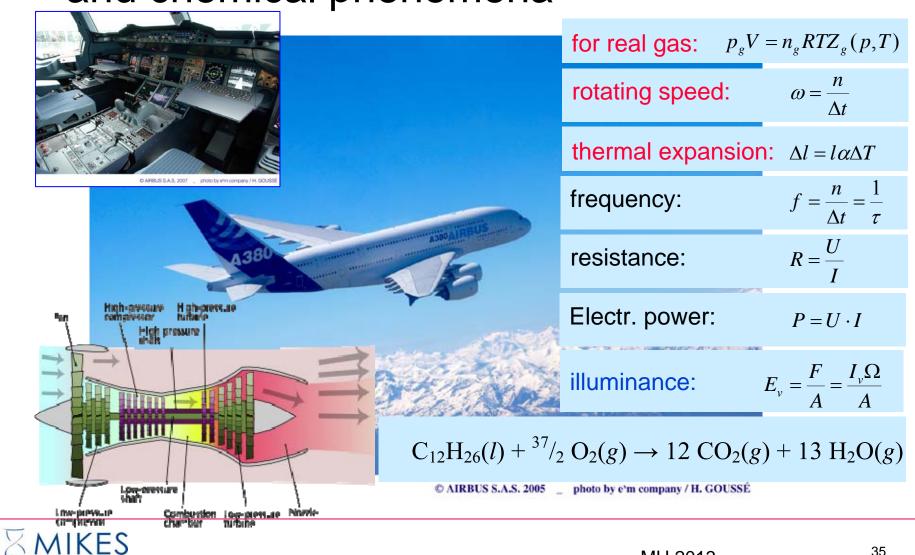


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# SI – system for characterizing physical and chemical phenomena



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#### 2.2 Base and derived units

## SI system – properties

- based on a set of 7 base units
  - by convention these are assumed to be independent
- other units are formed as products of powers from base units (derived units)
- some derived units have special names like Newton
- system is coherent i.e.
  - equations between the numerical values of quantities take exactly the same form as the equations between the quantities themselves
- decimal system is used



# SI system – Base units

Base quantity		SI base unit	
Name	Symbol	Name	Symbol
length	<i>l, x, r</i> , etc.	metre	m
mass	m	kilogram	kg
time, duration	t	second	S
electric current	I, $i$	ampere	A
thermodynamic temperature	T	kelvin	K
amount of substance	n	mole	mol
luminous intensity	$I_{ m v}$	candela	cd

[2.1]



### Definitions of base units

### Kilogram:

The kilogram is the unit of mass; it is equal to the mass of the international prototype of the kilogram.

#### Metre:

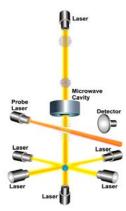
The metre is the length of the path travelled by light in vacuum during a time interval of 1/299 792 458 of a second.

#### Second:

The second is the duration of 9 192 631 770 periods of the radiation corresponding to the transition between the two hyperfine levels of the ground state of the caesium 133 atom.









### Definitions of base units

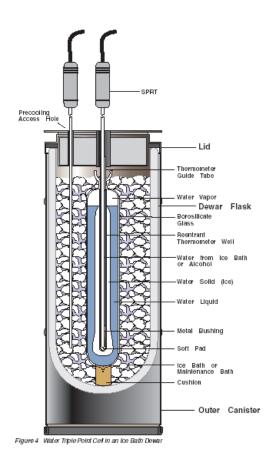
#### • Kelvin:

The kelvin, unit of thermodynamic temperature, is the fraction 1/273.16 of the thermodynamic temperature of the triple point of water.

#### Mole:

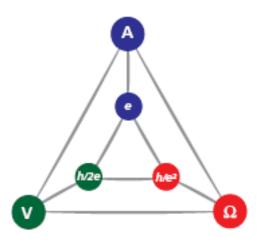
The mole is the amount of substance of a system which contains as many elementary entities as there are atoms in 0.012 kilogram of carbon 12.

 When the mole is used, the elementary entities must be specified and may be atoms, molecules, ions, electrons, other particles, or specified groups of such particles.





### Definitions of base units



#### Ampere:

The ampere is that constant current which, if maintained in two straight parallel conductors of infinite length, of negligible circular cross-section, and placed 1 metre apart in vacuum, would produce between these conductors a force equal to  $2 \times 10^{-7}$  newton per metre of length.

- NOTE 1: Direct realisation of the SI ampere is very difficult in practice
- NOTE 2:  $N = kg \cdot m \cdot s^{-2} \Rightarrow Depends on the prototype of kg$

#### Candela:

The candela is the luminous intensity, in a given direction, of a source that emits monochromatic radiation of frequency 540 x 1012 hertz and that has a radiant intensity in that direction of 1/683 watt per steradian.



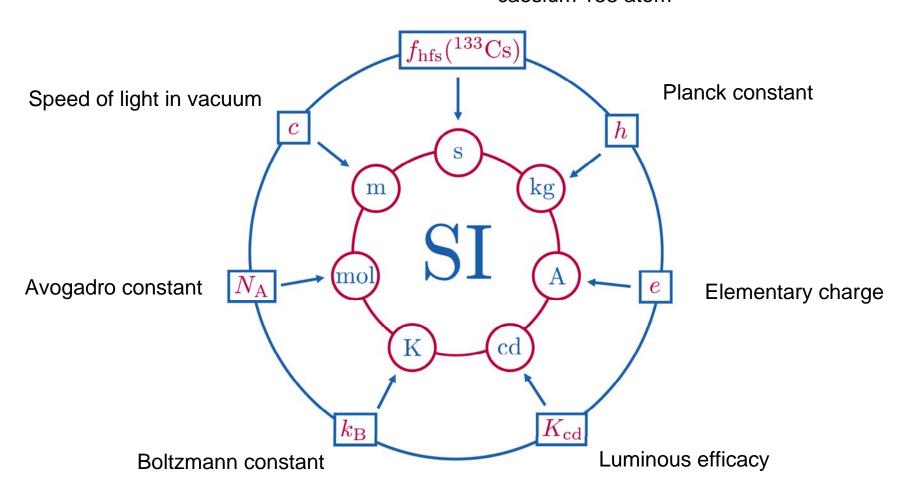
## Need for redefining SI base units

- Drawbacks of the current SI are:
  - Kilogram is defined with an artefact
  - The definition of kelvin is based on material properties
  - The definition of ampere limits the achievable accuracy and is not currently use (quantum standards of ohm and voltage are used instead through the Ohm's law)
- Because of these, drift, non-uniqueness and limitations in accuracy cannot completely be prevented.



### SI base units in future

Ground state hyperfine splitting frequency of the caesium 133 atom





# SI system – Derived units

Derived quantity		SI coherent derived unit			
Name	Symbol	Name	Symbol		
area	A	square metre	$m^2$		
volume	V	cubic metre	$m^3$		
speed, velocity	v	metre per second	m/s		
acceleration	а	metre per second squared	$m/s^2$		
wavenumber	$\sigma$ , $\widetilde{v}$	reciprocal metre	$\mathrm{m}^{-1}$		
density, mass density	ρ	kilogram per cubic metre	kg/m <sup>3</sup>		
surface density	$\rho_{ m A}$	kilogram per square metre	kg/m <sup>2</sup>		
specific volume	v	cubic metre per kilogram	m <sup>3</sup> /kg		
current density	j	ampere per square metre	$A/m^2$		
magnetic field strength	H	ampere per metre	A/m		
amount concentration <sup>(a)</sup> , concentration	С	mole per cubic metre	mol/m <sup>3</sup>		
mass concentration	$\rho, \gamma$	kilogram per cubic metre	kg/m <sup>3</sup>		
luminance	$L_{ m v}$	candela per square metre	cd/m <sup>2</sup>		
refractive index (b)	n	one	1		
relative permeability (b)	$\mu_{ m r}$	one	1		

- (a) In the field of clinical chemistry this quantity is also called substance concentration.
- (b) These are dimensionless quantities, or quantities of dimension one, and the symbol "1" for the unit (the number "one") is generally omitted in specifying the values of dimensionless quantities.



[2.1]

# SI system – Derived units with special names

	SI coherent derived unit (a)			
Derived quantity	Name	Symbol	Expressed in terms of other SI units	Expressed in terms of SI base units
plane angle solid angle frequency	radian <sup>(b)</sup> steradian <sup>(b)</sup> hertz <sup>(d)</sup>	rad sr <sup>(c)</sup> Hz	1 <sup>(b)</sup> 1 <sup>(b)</sup>	m/m m <sup>2</sup> /m <sup>2</sup> s <sup>-1</sup>
force pressure, stress energy, work,	newton pascal joule	N Pa J	N/m² N m	$m kg s^{-2}$ $m^{-1} kg s^{-2}$ $m^{2} kg s^{-2}$
amount of heat power, radiant flux electric charge,	watt coulomb	W C	J/s	$m^2 kg s^{-3}$ s A
amount of electricity electric potential difference, electromotive force	volt	V	W/A	$m^2 kg s^{-3} A^{-1}$
capacitance electric resistance electric conductance	farad ohm siemens	F Ω S	C/V V/A A/V	$m^{-2} kg^{-1} s^4 A^2$ $m^2 kg s^{-3} A^{-2}$ $m^{-2} kg^{-1} s^3 A^2$ [2.1]



### SI system – Derived units with special names 2

	SI coherent derived unit (a)			
Derived quantity	Name	Symbol	Expressed in terms of other SI units	Expressed in terms of SI base units
magnetic flux	weber	Wb	Vs	$m^2 \text{ kg s}^{-2} \text{ A}^{-1}$
magnetic flux density	tesla	T	$Wb/m^2$	$kg s^{-2} A^{-1}$
inductance	henry	Н	Wb/A	$m^2 \text{ kg s}^{-2} \text{ A}^{-2}$
Celsius temperature	degree Celsius (e)	°C		K
luminous flux	lumen	lm	cd sr (c)	cd
illuminance	lux	1x	$lm/m^2$	$m^{-2}$ cd
activity referred to a radionuclide (f)	becquerel (d)	Bq		$s^{-1}$
absorbed dose, specific energy (imparted), kerma	gray	Gy	J/kg	$m^2 s^{-2}$
dose equivalent, ambient dose equivalent, directional dose equivalent, personal dose equivalent	sievert (g)	Sv	J/kg	$m^2 s^{-2}$
catalytic activity	katal	kat		s <sup>-1</sup> mol [2.1



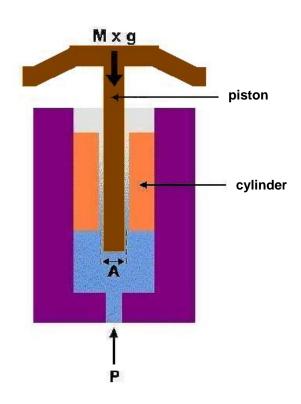
### Realisation of a derived unit

- The realisation forms a link between the measurements of a derived quantity and the SI base units.
- Characteristics of the realisation:
  - Based on the definition of the quantity
  - Measurements in terms of SI units (base or derived but not of the same quantity) with traceability to national/international measurement standards
  - Full uncertainty analysis
  - Comparisons to other realisations of the same quantity
- National Standards Laboratories maintain realisations (or secondary standards) for a set of derived quantities



# Realisation of the pascal

Unit with a special name: 1 Pa = 1 m<sup>-1</sup> kg s<sup>-2</sup>



Definition of pressure:

$$p = \frac{F}{A}$$

Realisation of the unit:

Force lifting the piston  $F_1$ :

$$F_1 = pA$$

Force lowering the piston  $F_2$ :

$$F_2 = mg$$

In equilibrium:

$$F_1 = F_2 \Rightarrow p = \frac{mg}{A}$$

# Realisation of the unit of the dew-point temperature (K or °C)

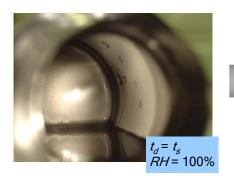
Same unit as of the temperature but different meaning:

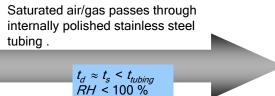
Dew-point temperature  $(t_d)$ :

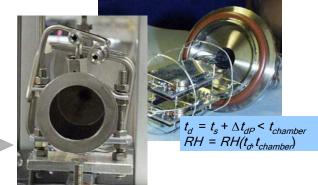
The temperature at which the gas would be saturated with respect to a plane surface of pure liquid water or solid ice at the same gas pressure.

#### A saturator-based primary humidity standard

Air or other gas is saturated with respect to plane water or ice surface:  $\Rightarrow$  dew-point temperature ( $t_d$ ) = air/gas temperature in the saturator ( $t_s$ )







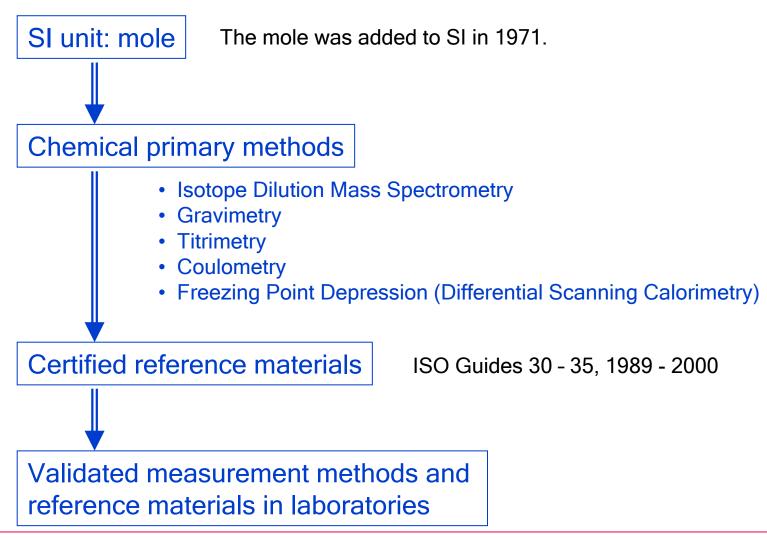
The air or gas enters a measurement chamber. Humidity in the chamber is determined by the temperatures and pressures of the saturator and the chamber





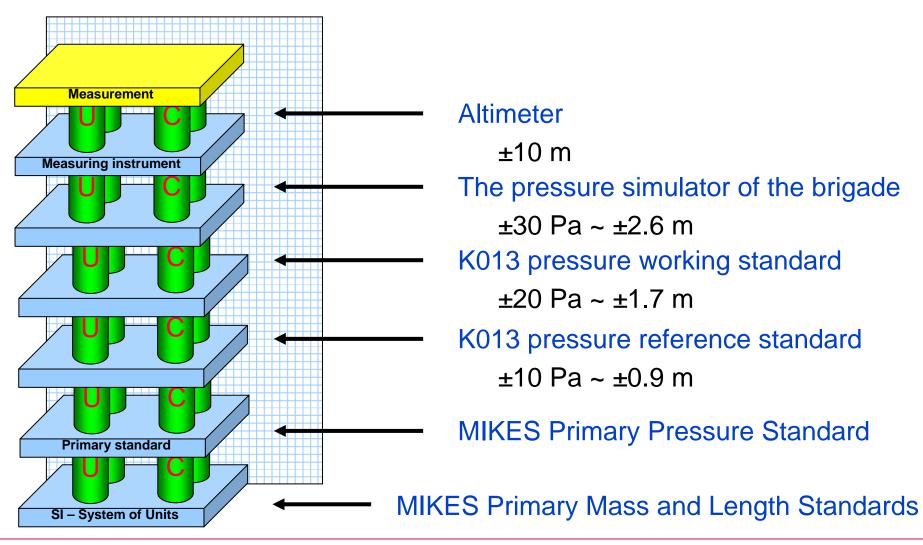
# 2.3 Measurement standards and traceability

## Traceability in chemical measurements





# Traceability to altitude measurements in a military aircraft







# 3 Measurement uncertainty – part 1: Introduction

- 3.1 Terminology
- 3.2 Importance of the measurement uncertainty



# 3.1 Terminology

### Terms

#### **MEASUREMENT REPEATABILITY**

measurement precision under a set of repeatability (similar) conditions of measurement

#### MEASUREMENT REPRODUCIBILITY

measurement precision under reproducibility (changed) conditions of measurement

#### RANDOM ERROR

 Component of measurement error that in replicate measurements varies in an unpredictable manner

#### SYSTEMATIC ERROR

 Component of measurement error that in replicate measurements remains constant or varies in a predictable manner

[1.1, 1.2]





# 3.2 Importance of the measurement uncertainty

## Measurement result and its uncertainty

- Estimated quality of a result is expressed as the uncertainty
- The uncertainty is an essential part of a measurement result:

Measurement result = Estimate ± uncertainty

- The uncertainty gives the limits of the range in which the "true" value of the measurand is estimated to be at a given probability.
- Too often the uncertainty is not presented explicitly with the estimate
  - ⇒ confusion, incorrect conclusions, non-equal users etc.
- If the uncertainty is not taken into account, incorrect conclusions are drawn and the number of unsatisfactory products increases.
- When you know the uncertainty in a measurement, then you can judge its fitness for purpose.

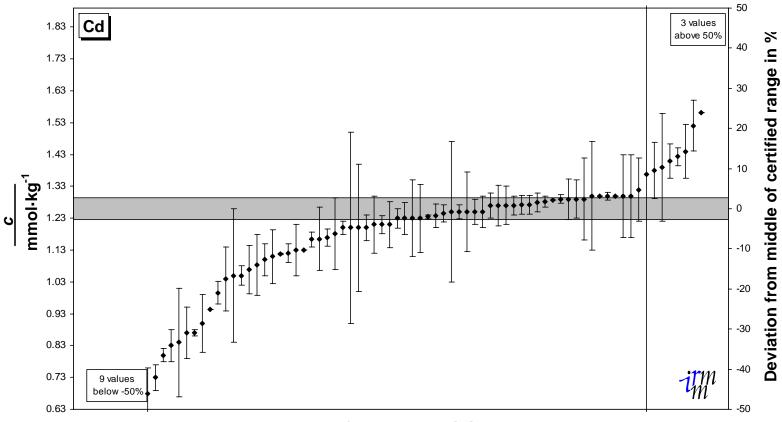


### Importance of uncertainty of measurements

- Measurements are never absolutely accurate, but there is always some uncertainty in the measured values.
- Measurement result without uncertainty estimate is meaningless.
- Estimation of measurement uncertainties is one of the most important parts of practical metrology.
- A proper uncertainty budget indicates what parts of the measurement should be developed to decrease the overall uncertainty most effectively.



#### Certified range [ $U=k \cdot u_c$ (k=2)]: 1.226 - 1.294 mmol·kg<sup>-1</sup>



Results from all participants.

[Mittaustulosten epävarmuus, MIKES 26.6.2005]





# 4 Measurement uncertainty – part 2: Methods

- 4.1 Calculating uncertainty
- 4.2 Calculations step by step
- 4.3 Uncertainty calculation in practice



# 4.1 Calculating uncertainty

## Calculating a measurement result

- A measurement result is calculated from input data. In addition to the measurement values, the data often include information from earlier measurements, specifications, calibration certificates etc.
- The calculation method is described with an equation (or a set of equations) called measurement model (mathematical model)
- The model is used for both calculation of the estimate and the uncertainty of the results.
- The model should include all factors (input quantities) affecting significantly the estimate and/or the uncertainty.
- The model is never complete; approximations are needed.



### 6 steps to evaluating uncertainty

- 1) Measurement model: List essential input quantities (i.e. parameters  $x_i$  having a significant effect on the result) and build up a mathematical model (function) showing how they are related to the final result:  $y = f(x_1, ..., x_i)$
- 2) Standard uncertainty: Estimate the *standard uncertainty* of each input quantity  $(x_i)$
- 3) Using the model in uncertainty calculations: Determine the uncertainty due to standard uncertainty of each input quantity  $(x_i)$ .
- 4) Correlation:

  Determine correlation between the input quantities (if relevant)
- 5) Calculate the *combined standard uncertainty*
- 6) Calculate the expanded uncertainty.





### 4.2 Calculations step by step

Step 1: Measurement model

Step 2: Standard uncertainty

Type A evaluation of standard uncertainty

Type B evaluation of standard uncertainty

Step 3:Using the model in uncertainty calculations

Step 4: Correlation

Step 5: Combining the uncertainty components

Step 6: Expanded uncertainty

## Step 1: Measurement model

### Equation which describes the measurement:

Measurand 
$$\longrightarrow Y = f(X_1, X_2, ..., X_n) \longleftarrow$$
 Input quantities  $X_i$ 

- The model should include:

  Measurement results, corrections, reference values, influence quantities...
- The magnitude of a correction can be zero but it can still have uncertainty
- The values and uncertainties of the input quantities should be determined

### Measurement result (y) is:

$$y = f(x_1, x_2, ..., x_n)$$

•  $x_i$  is the value (estimate) of the input quantity  $X_i$ 

Example: 
$$t_x = t_{ind} + \delta t_{Cal} + \delta t_D + \delta t_{resol} + \delta t_G$$



### Step 2: Standard uncertainty

- All uncertainty components should be comparable  $\Rightarrow$  standard uncertainty  $u_i$
- The variance of the sum of non-correlating random variables is the sum of their variances
- standard uncertainty is the square root of variance

• all uncertainty components should be expressed as standards

uncertainties

 For normal distribution standard uncertainty corresponds to about 68% confidence level



# Two methods for estimating the standard uncertainty of an input quantity

### • **Type A**:

Evaluated from a number of observations (usually > 10)

### Tyyppi B:

- Evaluated from a single (or a small number of) data value(s)
- Often taken from data reported earlier or by others



## Type A evaluation of standard uncertainty

- Uncertainty is evaluated by statistical analysis of a series of observations q<sub>i</sub>
  - The spread of the results is assumed to be random
  - An estimate for the value of the quantity is the arithmetic mean  $\bar{q}$

$$\overline{q} = \frac{1}{n} \sum_{i=1}^{n} q_i$$

- An estimate for the variance of the probability distribution is  $s(x)^2$ :
- *s*(*q*) is termed the experimental standard deviation

$$s^{2}(q) = \frac{1}{n-1} \sum_{i=1}^{n} (q_{i} - \overline{q})^{2}$$

• An estimate for the variance of the mean  $s^2(\overline{q})$  (the experimental variance of the mean) is:

$$s^2(\overline{q}) = \frac{s^2(q)}{n}$$

• The standard uncertainty of *q* equals the experimental standard deviation of the mean:

$$u(q) = s(\overline{q}) = \sqrt{\frac{1}{n(n-1)} \sum_{i=1}^{n} (q_i - \overline{q})^2}$$

If type A measurement uncertainty is based on few measurements the estimation of u(x) is not reliable and normal distribution can not be assumed.

(unless other information on the distribution is available)

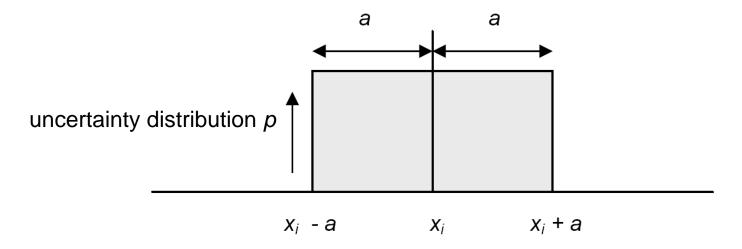


## Type B evaluation of standard uncertainty

- To be applied for estimates of input quantities that has not been obtained from repeated measurements
- Typical examples :
  - uncertainties of values and drifts of reference standards
  - uncertainties of environmental quantities
  - uncertainties from specifications of instrument
  - uncertainties from literature values
  - uncertainty due to the method or calculation
  - uncertainty due to staff
  - uncertainties from calibration certificates

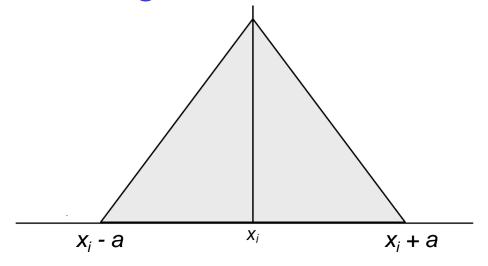


### Rectangular distribution



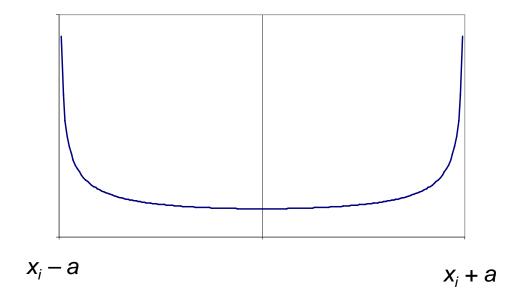
- All values in the range  $x_i$  a ... $x_i$  + a have equal probability
- Standard uncertainty  $u(x_i) = \frac{a}{\sqrt{3}} \approx 0,577a$
- Examples: specifications, resolution
- Applied if only limiting values are known

## Triangular distribution



- Example: convolution of two rectangular distribution
- Standard uncertainty:  $u(x_i) = \frac{a}{\sqrt{6}} \approx 0,408 \ a$

### U-shape distribution



- Example: sinusoidal variation between limits ± a
- Standard uncertainty:

$$u(x_i) = \frac{a}{\sqrt{2}} \approx 0,707 \ a$$

### Step 3:Using the model in uncertainty calculations

- The contribution of  $u(x_i)$  to the uncertainty of y is determined by the sensitivity coefficient  $c_i$
- The sensitivity coefficient can be determined
  - from partial derivative of  $f(X_1, X_2,...,X_n)$  with  $X_i$  i.e.  $c_i = \partial f / \partial X_i$  (at  $x_1, x_2,...,x_n$ )
  - by numerical methods  $c_i = \Delta y / \Delta x_i$
  - experimentally by changing xi by  $\Delta x_i$  and determining  $\Delta y$ ;  $c_i = \Delta y / \Delta x_i$
- The contribution of  $u(x_i)$  to the uncertainty of y is:  $u_i(y) = c_i u(x_i)$



# Step4: Correlation

The covariance  $u(x_i, x_j)$  of two random variables is a measure of their mutual dependence.

If  $X_i = F(Q_i)$  and  $X_j = G(Q_i)$  depend on the same quantities  $Q_i$  (l=1..n) then  $u(x_i, x_j) = \sum_i \frac{\partial F}{\partial q_i} \frac{\partial G}{\partial q_i} u^2(q_i)$ 

• Correlation coefficient :  $r(x_i, x_j) = \frac{u(x_i, x_j)}{u(x_i)u(x_j)}$ 

The covariance can increase or decrease uncertainty.

If the correlation coefficient is r=1 the components will be added in a linear way.

### Step 5: Combining the uncertainty components

Uncorrelated input quantities:

$$u_c(y) = \sqrt{\sum_{i=1}^{N} u_i^2(y_i)} = \sqrt{\sum_{i=1}^{N} \left(\frac{\delta f}{\delta x_i}\right)^2} u^2(x_i)$$

Correlated input quantities:

$$u_c(y) = \sqrt{\sum_{i=1}^{N} \left(\frac{\delta f}{\delta x_i}\right)^2 u^2(x_i) + 2\sum_{i=1}^{N-1} \sum_{j=i+1}^{N} \frac{\delta f}{\delta x_i} \frac{\delta f}{\delta x_j} u(x_i, x_j)}$$

 $u_c(y)$  = combined standard uncertainty;  $u(x_i, x_j)$  = covariance



## Step 6: Expanded uncertainty

Often the result of the measurement is reported with a higher level of confidence than given by the standard uncertainty.

 Expanded uncertainty *U* is the standard uncertainty multiplied by a coverage factor *k*:

$$U = ku_c(y)$$

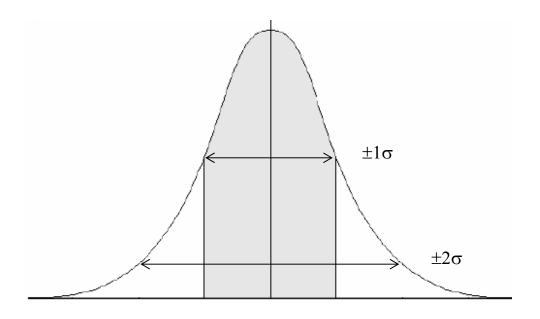
- In calibration it is recommended to report 95 % level of confidence.
- For normal distribution this corresponds to k=2 (approximately).

Normal distribution:

Coverage probability	Coverage factor
p	k
68,27 %	1,00
90 %	1,65
95 %	1,96
95,45%	2,00
99 %	2,58
99,73%	3,00



#### Normal distribution



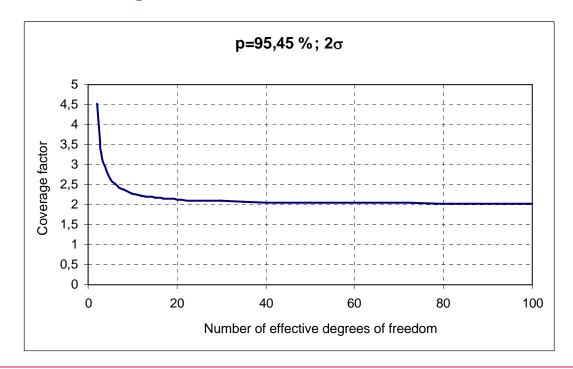
Measurement result is approximately normally distributed if

- it is a combination of several random variables (independent of distribution)
- none of the (non-normally distributed) components is dominating.



### Degrees of freedom and the coverage factor

- For a combined standard uncertainty, we can calculate the effective number of degrees of freedom ( $v_{eff}$ ):
- The figure shows that we need a coverage factor larger than 2 to obtain 95 % confidence level if the number of degrees of freedom is small.







# 4.2 Uncertainty calculation in practice

# Example: Measurement of SO<sub>2</sub> content

- An analyzer with electrical current signal output was used for measuring SO<sub>2</sub> content in exhaust gas.
- The signal was measured with a DMM and the total error in the current measurement was estimated to be within ±0,1 mA.
- The arithmetic mean of the 15 recorded DMM readings is 9,59mA and the corresponding standard deviation is 0,49 mA.
- An accredited laboratory has determined the calibration function for the analyzer:

$$f_c(I_m) = -7,64 \text{ mg/m}^3 + 3,25 \frac{\text{mg/m}^3}{\text{mA}} \cdot I_m$$

The reported expanded uncertainty (k=2) is 6 mg/m<sup>3</sup>

 When comparing two last calibrations, we can conclude that the drift of the analyzer is less than 5 mg/m³/year (calibr. interval is 1 year)



The measurement result is calculated as follows:

$$C_{SO2} = f_c (I_m + \delta I_m) + \delta f_c + \delta_{Drift}$$

$$= -7,64 \text{ mg/m}^3 + 3,25 \frac{\text{mg/m}^3}{\text{mA}} \cdot (I_m + \delta I_m) + \delta f_c + \delta_{Drift}$$

 The variables can be assumed independent on each other; therefore we can calculate the uncertainty:

$$u(C_{SO2}) = \sqrt{[c_1 u(I_m)]^2 + [c_2 u(\delta I_m)]^2 + [c_3 u(\delta f_c)]^2 + [c_4 u(\delta f_c)]^2}$$

The sensitivity coefficients are:

$$c_{1} = \frac{\partial C_{SO2}}{\partial I_{m}} = 3,25 \frac{\text{mg/m}^{3}}{\text{mA}}$$

$$c_{2} = \frac{\partial C_{SO2}}{\partial \delta I_{m}} = c_{1}$$

$$c_{3} = \frac{\partial C_{SO2}}{\partial \delta f_{c}} = c_{4} = \frac{\partial C_{SO2}}{\partial \delta Drift} = 1$$

Thus:

$$u(C_{SO2}) = \sqrt{c_1^2 [u^2(I_m) + u^2(\delta I_m)] + u^2(\delta f_c) + u^2(\delta_{Drift})}$$

#### Standard uncertainties of the components:

$$u(I_m) = 0,49 \text{ mA}$$
 type A, normal distribution 
$$u(\delta I_m) = \frac{0,1 \text{ mA}}{\sqrt{3}} = 0,06 \text{ mA}$$
 type B, rectangular distribution 
$$u(\delta f_c) = \frac{6 \text{ mg/m}^3}{2} = 3 \text{ mg/m}^3$$
 type B, normal distribution 
$$u(\delta f_c) = \frac{5 \text{ mg/m}^3}{\sqrt{3}} = 2,9 \text{ mg/m}^3$$
 type B, rectangular distribution

Estimate for the SO<sub>2</sub> content:

$$C_{SO2} = -7,64 \text{ mg/m}^3 + 3,25 \frac{\text{mg/m}^3}{\text{mA}} \cdot (9,59 \text{ mA} + 0 \text{ mA}) + 0 \text{ mg/m}^3 + 0 \text{ mg/m}^3$$
  
= 23,5 mg/m<sup>3</sup>

and its combined standard uncertainty:

$$u(C_{SO2}) = \sqrt{\left(3,25 \frac{\text{mg/m}^3}{\text{mA}}\right)^2 \left[ (0,49 \text{ mA})^2 + (0,06 \text{ mA})^2 \right] + (3 \text{ mg/m}^3)^2 + (2,9 \text{ mg/m}^3)^2}$$

$$= 4.5 \text{ mg/m}^3$$



• Thus the expanded uncertainty at about 95 % confidence level (k = 2) is:

$$U = k \times u = 2 \times 4.5 \text{ mg/m}^3 = 9.0 \text{ mg/m}^3$$

As a conclusion, the measurement result is :

$$C_{SO2} = (24 \pm 9) \text{ mg/m}^3$$



#### References and literature

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- [1.2] International vocabulary of metrology Basic and general concepts and associated terms (VIM), 3rd ed., JCGM 200:2008 (can be downloaded at http://www.bipm.org/en/publications/guides/)
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MIKES has published several guides in Finnish on the uncertainty estimations in different fields.



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