



# A Monte Carlo Method for uncertainty calculation in gamma spectrometry

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# Outline

- Why Monte Carlo methods?
- The principle of MCM
- Data sampling
- MC calculations using Excel
- Data analysis
- Examples: activity measurements for two different PDF of a correction factor  $k_{ET}$
- Consequenses on decisions

# Monte Carlo Methods (MCM)

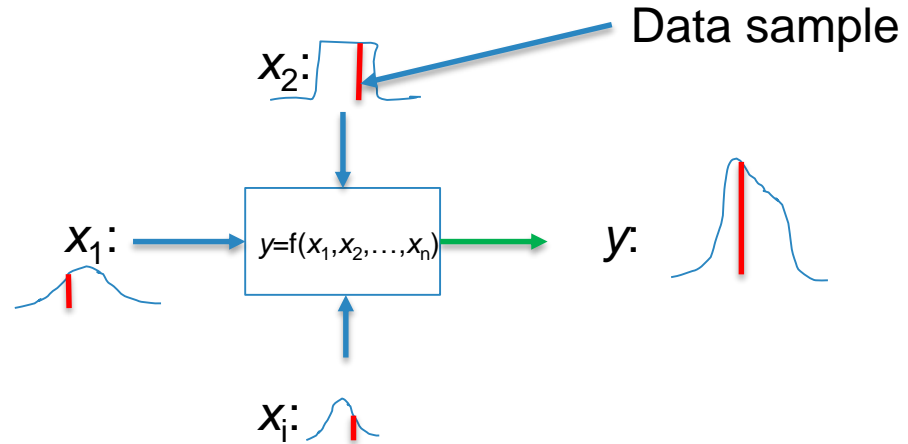
- Provides a better estimate of the uncertainty when:
  - There are non-linearities and the uncertainties are not small enough (*higher-order terms can be used in uncertainty propagation, but it might be 'exhausting', and it will not always solve the problem if uncertainties still are too large*)

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

- There are non-Gaussian distributed input quantities which contributes significantly to the combined uncertainty (PDF known and non-Gaussian, or from assumptions)
- Provides a better estimate of the probability density function (PDF) of the measurand (based on the assumptions of the PDF of the input quantities)
  - Uncertainty propagation: Gaussian distributions assumed for the measurand*

# MC calculation: Principle

Propagation of distributions:



Data is sampled randomly from the PDFs of each input quantity

→ Many data needed to ensure sampling from the tails of e.g. Gaussian PDF

# Calculation tools

- MATLAB
- Other programming language(s)
- Here: Excel
- Advantages using Excel:
  - Widely available
  - No knowledge in programming required
- Disadvantage:
  - Might be somewhat slow(er)...

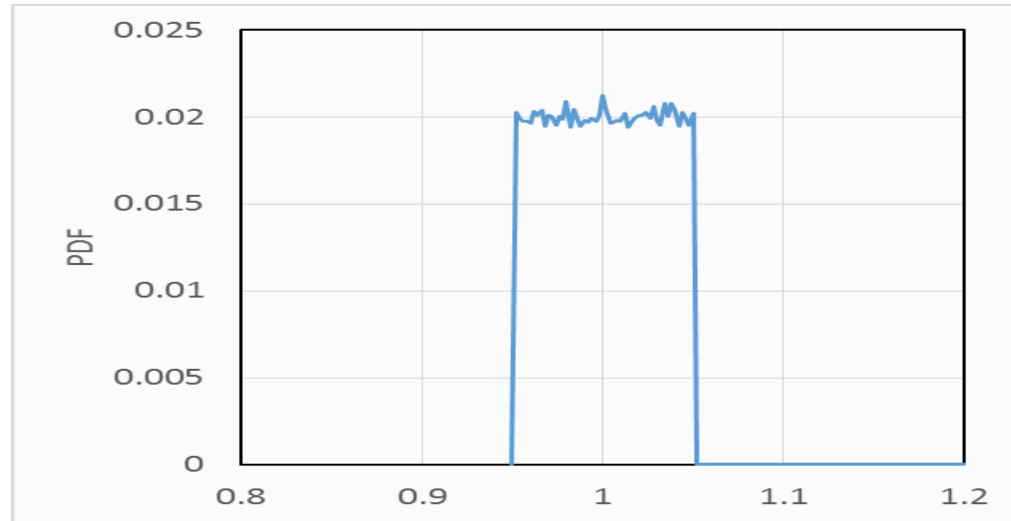
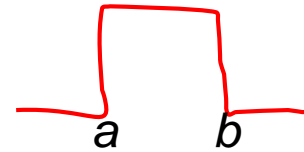
# Excel for MC calculations

- Pseudo random number generation required for data sampling
- Excel:  
RAND() gives pseudo random numbers between 0-1 (rectangular distributed)
- Early Excel versions (<2010) were considered unreliable in calculating random numbers
- Later versions (>2010) has shown to be fit-for-purpose  
*(A. Kallner, Clinica Chimica Acta, 438, 210, 2015)*

# Data sampling: Rectangular distribution

Rectangular distribution:

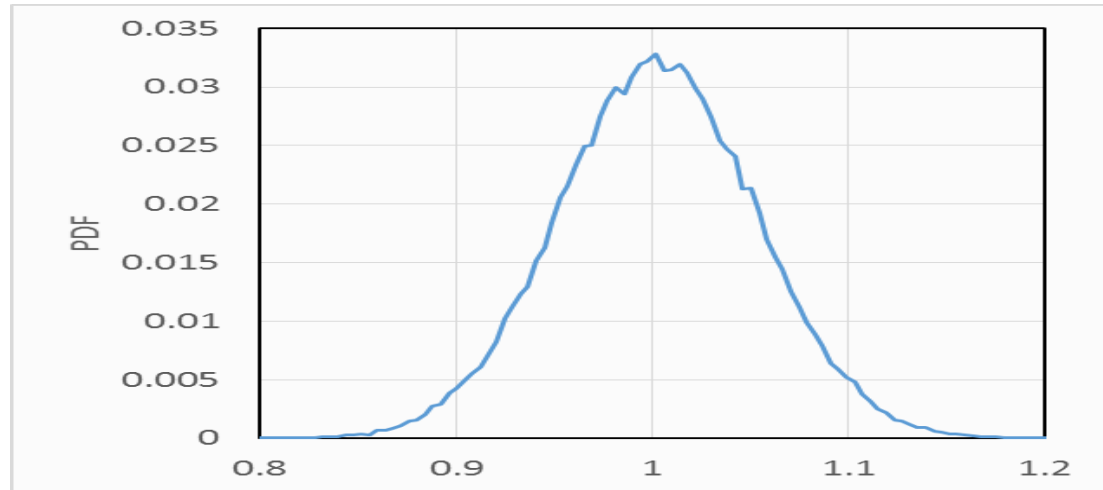
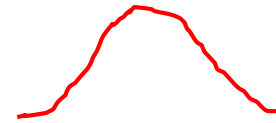
- Random samples from the distribution:
- $x=a+(b-a)\cdot\text{RAND}()$
- $m=100\ 000$ :



# Data sampling: Normal distribution

Normal distribution:

- Random samples from the distribution :
- $x = \text{NORM.INV}(\text{prob}; \text{mean}; \text{std unc})$
- $\text{prob} = \text{RAND}()$
- $m = 100\ 000$ :





# Data analysis

- Analyse the measurand with respect to mean, standard deviation and confidence interval (CI):
  - AVERAGE(*range*)
  - STDEV(*range*)
- CI:
  - PERCENTILE(*range*; *prob.*) gives CL for a given *probability*
- Ex: For 95% CI calculate
  - PERCENTILE(*range*; 0.025) and
  - PERCENTILE(*range*; 0.975)

# Calculation time

Calculation time in Excel:

- A model equation for gamma spectrometry

$$A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$$
$$Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$$

and the generation of 600 000 random samples (6·100 000):  
<1 s to calculate mean, standard deviation and the CI

- With the calculation of the PDF it takes about 4 s... (*might be done in a better way...*)  
→ Good idea to set Excel to manual calculation when a PDF is calculated!

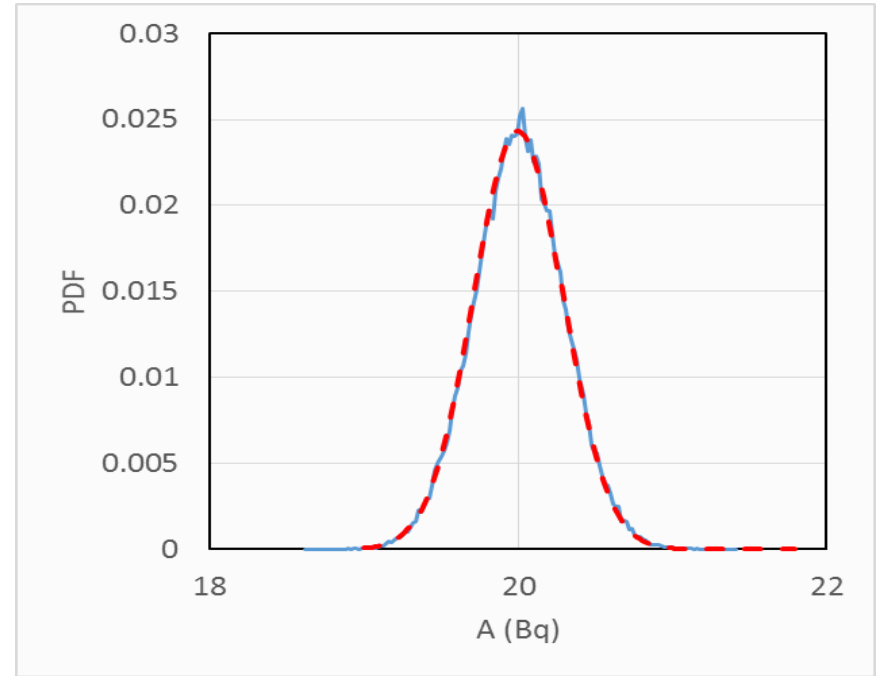
# Validation

- The MC calculation in Excel was validated using GUM Workbench Pro 2.4
- GUM Workbench Pro 2.4 calculates uncertainties using uncertainty propagation, but can also run a MC calculation for the same model
- *For equal no. of data samples, Excel and GUM Workbench were consistent with respect to the calculated average, standard uncertainty and CI*

# Examples: Efficiency transfer

- $A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$   
 $Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$
- Case 1:  
Uncertainties, norm.dist.,  $k=1$ :
  - $N$ : 1%
  - $I_g$ : 0.1%
  - $t$  and  $t_{cal}$  set to constants...
  - $N_{cal}$ : 0.3%
  - $A_{cal}$ : 1%
  - $k_{ET}$ : 0.1% (~ref. geo.)

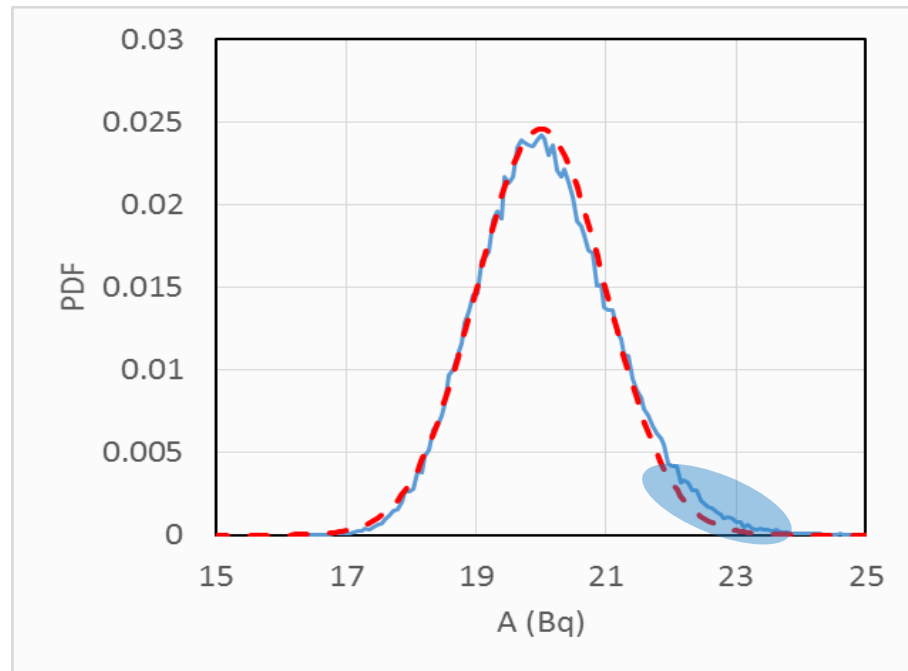
-Small unc → No difference!



Dashed red: Uncertainty propagation

# Examples: Efficiency transfer

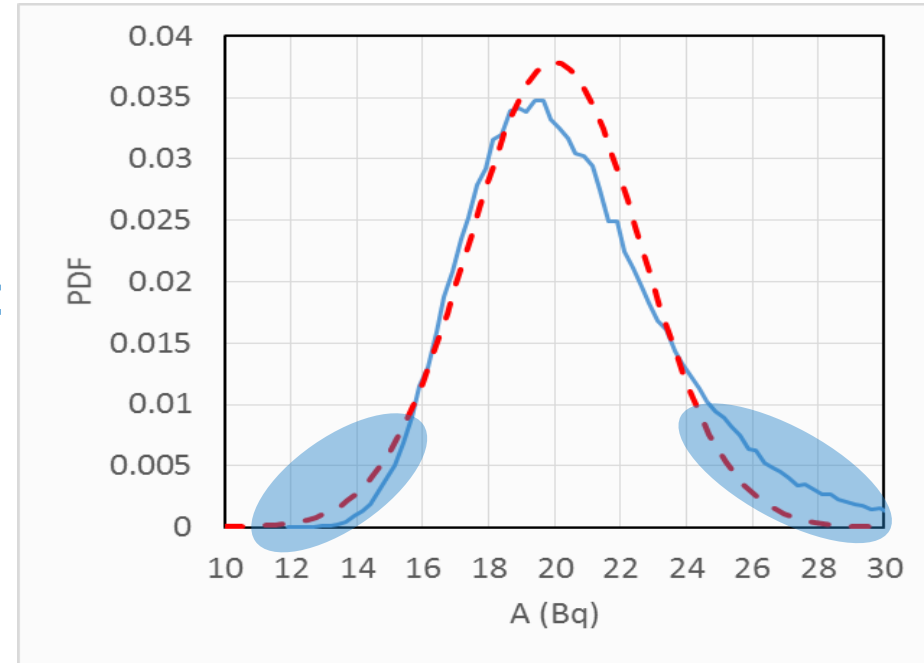
- $A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$   
 $Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$
- Case 2:  
Uncertainties, norm.dist.,  $k=1$ :
  - $N$ : 1%
  - $I_g$ : 0.1%
  - $t$  and  $t_{cal}$  set to constants...
  - $N_{cal}$ : 0.3%
  - $A_{cal}$ : 1%
  - $k_{ET}$ : 5%



Dashed red: Uncertainty propagation

# Examples: Efficiency transfer

- $A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$   
 $Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$
- Case 3:  
Uncertainties, norm.dist.,  $k=1$ :
  - $N$ : 1%
  - $I_g$ : 0.1%
  - $t$  and  $t_{cal}$  set to constants...
  - $N_{cal}$ : 0.3%
  - $A_{cal}$ : 1%
  - $k_{ET}$ : **15%**

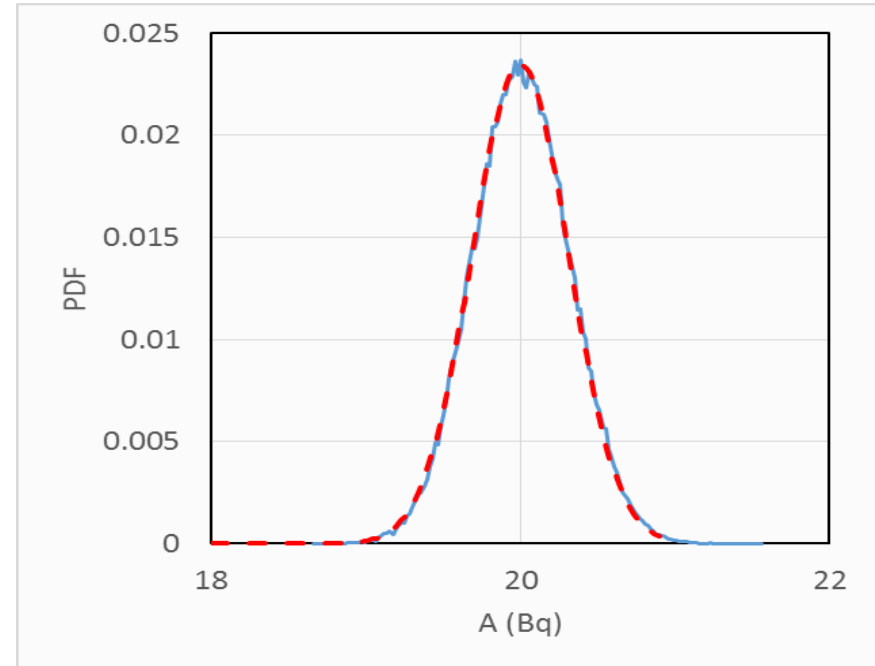


Dashed red: Uncertainty propagation

# Examples: Efficiency transfer

- $A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$   
 $Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$
- Case 4:  
Uncertainties (rect. dist.):
  - $N$ : 1%
  - $I_g$ : 0.1%
  - $t$  and  $t_{cal}$  set to constants
  - $N_{cal}$ : 0.3%
  - $A_{cal}$ : 1%
  - $k_{ET}$ : 1% rect. dist. (half-width)

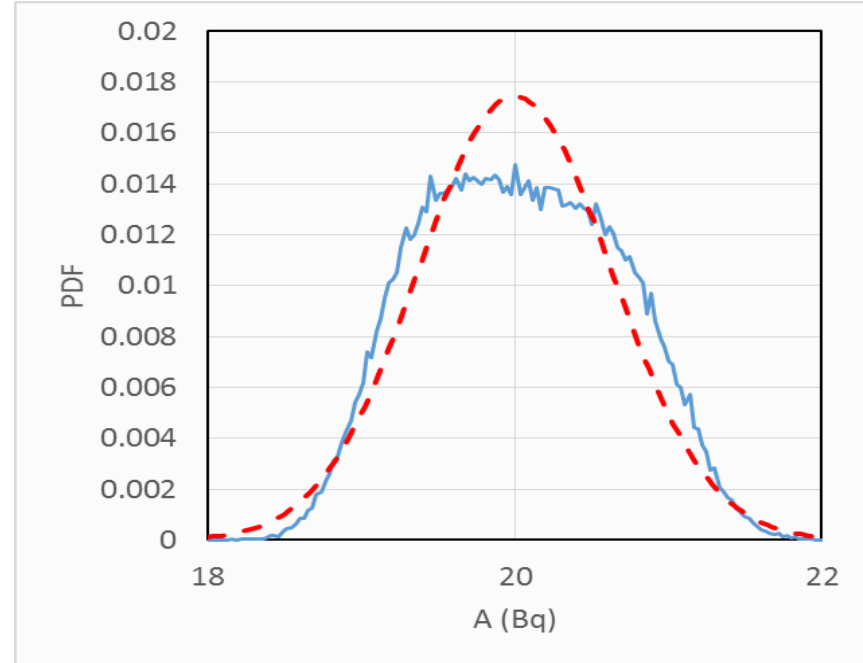
Small unc → No difference!



Dashed red: Uncertainty propagation

# Examples: Efficiency transfer

- $A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$   
 $Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$
- Case 5:  
Uncertainties (rect. dist.):
  - $N$ : 1%
  - $I_g$ : 0.1%
  - $t$  and  $t_{cal}$  set to constants
  - $N_{cal}$ : 0.3%
  - $A_{cal}$ : 1%
  - $k_{ET}$ : 5% rect. dist. (half-width)

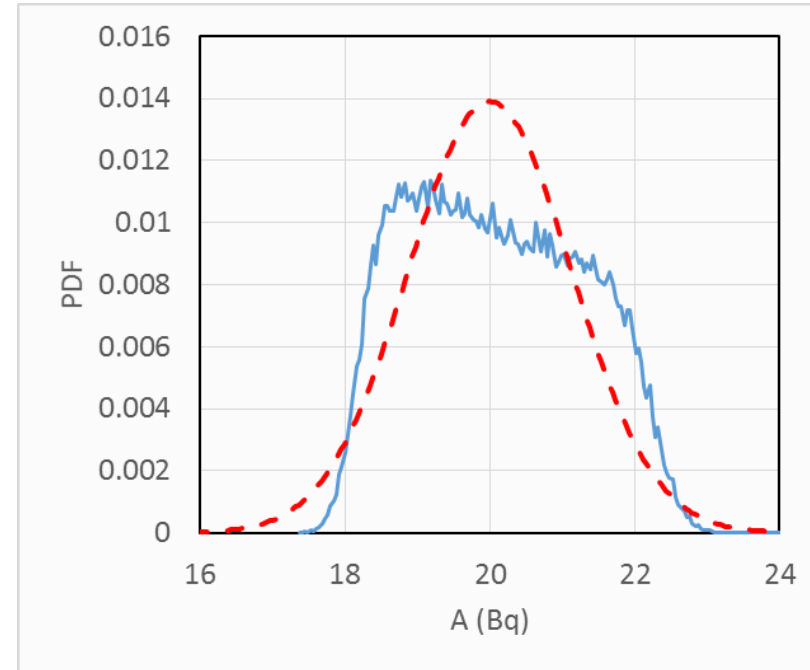


Dashed red: Uncertainty propagation



# Examples: Efficiency transfer

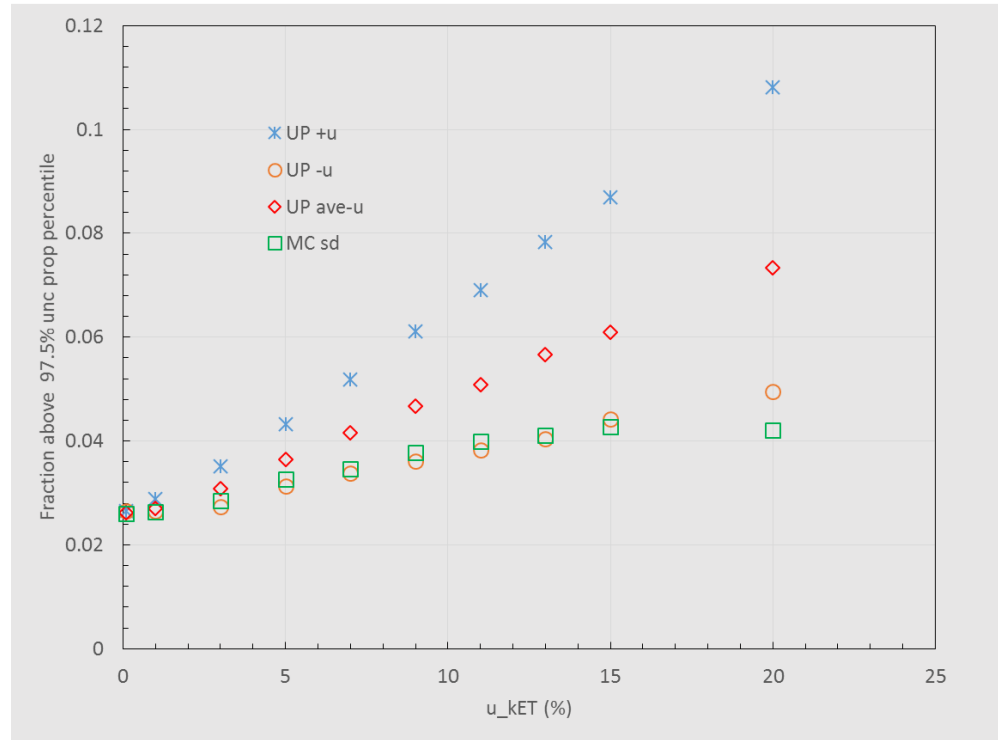
- $A = N / (Eff \cdot k_{ET} \cdot I_g \cdot t)$   
 $Eff = N_{cal} / (t_{cal} \cdot I_g \cdot A_{cal})$
- Case 6:  
Uncertainties (rect. dist.):
  - $N$ : 1%
  - $I_g$ : 0.1%
  - $t$  and  $t_{cal}$  set to constants
  - $N_{cal}$ : 0.3%
  - $A_{cal}$ : 1%
  - $k_{ET}$ : 10% rect. dist. (half-width)



Dashed red: Uncertainty propagation

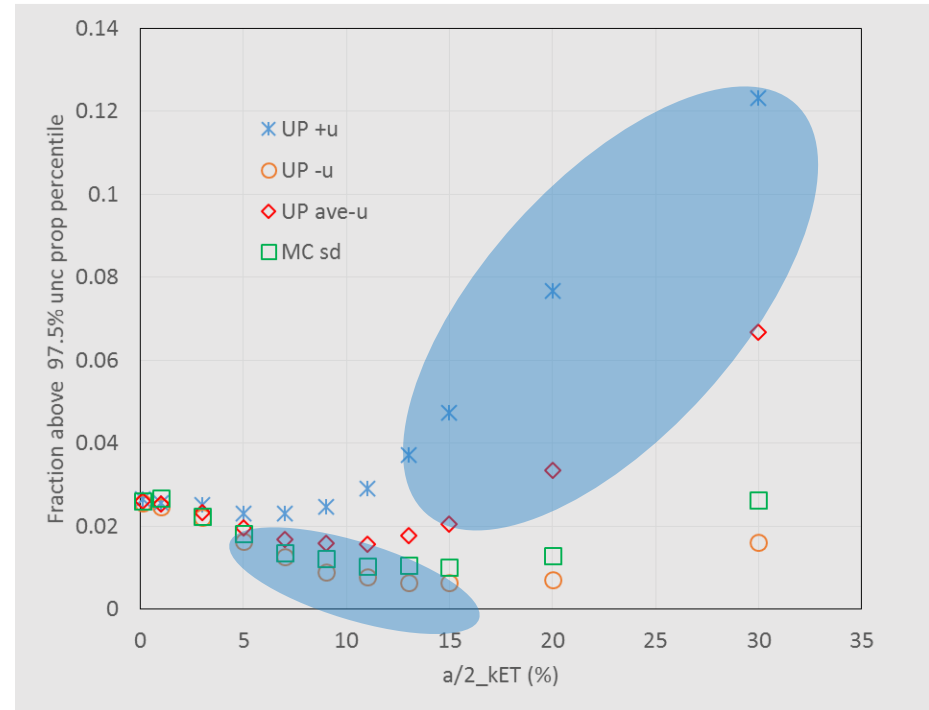
# Consequences: $k_{ET}$ normal distribution

Increased risk  
due to an  
underestimation  
of the  
uncertainties  
using uncertainty  
propagation!



# Consequences: $k_{ET}$ rectangular distribution

Initially an increased cost using uncertainty propagation (overestimation)...later an increased risk (underestimation)



# A general reference to MCM for uncertainty calculations

- *Evaluation of measurement data – Supplement 1 to the "Guide to the expression of uncertainty in measurement" – Propagation of distributions using a Monte Carlo method, JCGM 101:2008*

# Summary

- Excel was used for MC calculation of measurement uncertainty
- Excel showed to be *fit-for-purpose* for MC calculations of the measurement uncertainties in gamma spectrometry, and resulted in consistent results compared to MCM using GUM Workbench Pro 2.4
- The analyst should be aware of the limitations of uncertainty propagation when 'large' uncertainties of non-linear input quantities exist
- Of course, this also applies to other measurements we might do and when non-linearities exists...

