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**Workshop on Understanding and Evaluating Radioanalytical
Measurement Uncertainty**

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Estimation of Uncertainty arising from Sampling - Exercise

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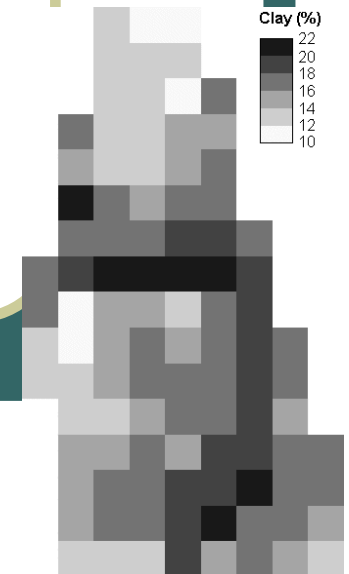
Estimation of Uncertainty arising from Sampling

using variogram parameters

Paolo de Zorzi

Workshop on
"Understanding and Evaluating Radioanalytical
Measurement Uncertainty"

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Environmental Data

- Besides the effects of sampling techniques, sample preparation/reduction, and laboratory analyses, the data also differ because of spatial variation
- Geostatistics enables us to quantify the spatial structure of a measured element separate from the total variance of the data



Geostatistics (1)

According to geostatistics and the **regionalized variable theory**, we assume that a variable (Z) is the sum of three components

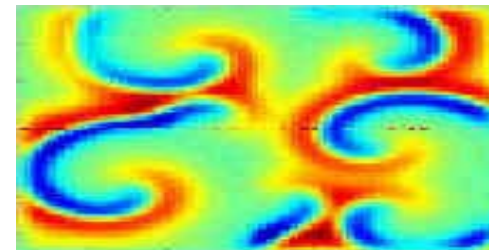
$$Z(x) = m(x) + r(x) + \varepsilon$$

m = structural component

r = spatial correlated component (residual from $m(x)$)

ε = uncorrelated random noise

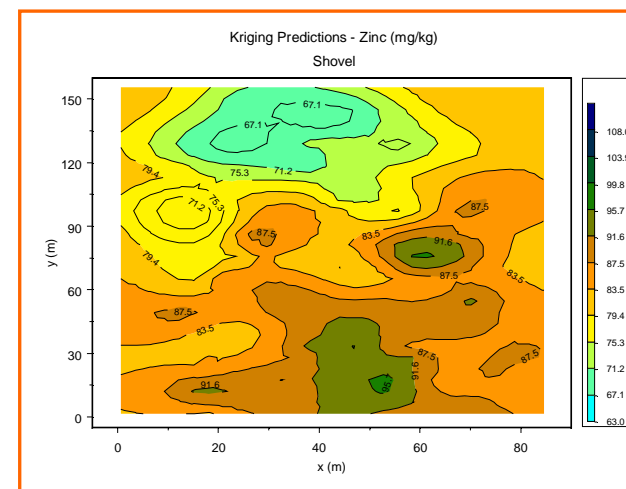
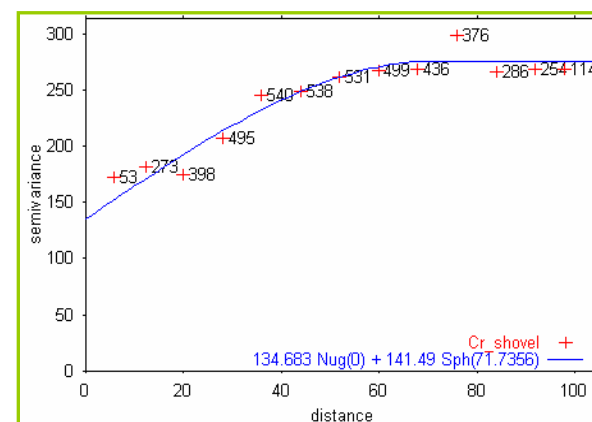
x = location



Geostatistics (2)

Geostatistical analysis include two phases:

- spatial modelling (variography);
- spatial interpolation (kriging)



The Experimental Variogram

$$\hat{\gamma}(h) = \frac{1}{2n} \sum_{i=1}^n \{z(x_i) - z(x_i + h)\}^2$$

- **RANGE**

distance beyond which there is no correlation among variables

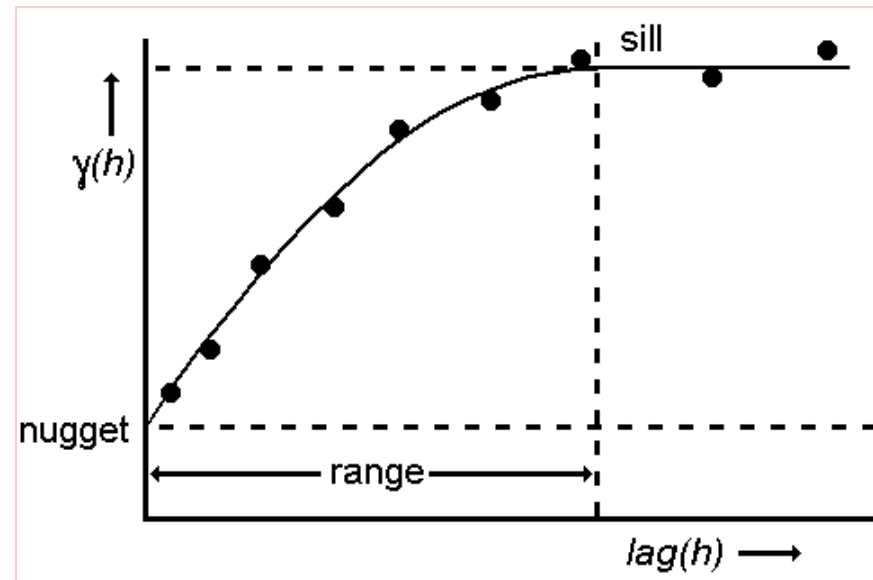
- **SILL**

value that variogram tends to when distances get very large

- **NUGGET**

measurement uncertainties and/or microscale variations that occur over distances less than the shortest sampling interval

The spatial correlated component and the noise term are encapsulated in an **experimental variogram**



Uncertainty from Sampling (1)

Total variance

$$s^2_{\text{tot}} = s^2_S + s^2_T + s^2_A + s^2_{\text{SP}}$$

✓ s^2_{tot} comprises:

- ✓ the variances of sampling s^2_S ,
- ✓ sample treatment/reduction s^2_T ,
- ✓ analysis s^2_A
- ✓ and the spatial variability s^2_{SP}

According to Geostatistics:



The **nugget** variance includes variances due to:

- Sampling
- Analysis
- Spatial correlation that occur over distances less than the shortest sampling interval



Measurement
uncertainty

Uncertainty from Sampling (2)

$$s^2_{\text{nugget}} = s^2_{\text{analysis}} + s^2_{\text{sampling}} + s^2_{\text{sample reduction}}$$

Transponing:

$$s^2_{\text{sampling}} = s^2_{\text{nugget}} - (s^2_{\text{analysis}} + s^2_{\text{sample reduction}})$$

$$s^2_{\text{analysis}} + s^2_{\text{sample reduction}}$$

May be calculated together experimentally analysing replicates (test portions) taken from independent test samples

$$s^2_{\text{nugget}}$$

is determined by geostatistics



Uncertainty from Sampling (3)

The **sampling standard uncertainty** is:

$$u_{\text{sampling}} = \sqrt{s^2_{\text{sampling}}}$$

As **uncertainty relative** to the mean mass fraction of an element becomes:

$$u\%_{\text{sampling}} = (u_{\text{sampling}} / x_{\text{mean}}) * 100$$

The **sampling expanded uncertainty** is:

$$U_{\text{sampling}} = k u_{\text{sampling}} \quad (k = 2)$$



Applicability and assumptions

- Suitable data set: at least **30-100 samples** data value;
- The higher the number of samples the more accurate the fitted model;
- **No correlation** between analytical and sampling variance
- **Subjective assumptions** regarding the model for the experimental variogram
- **Repeatability** of sampling operation



Example: Variogram parameters

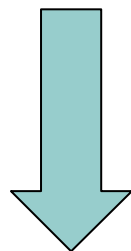
Scope: Estimate the U_{sampling} , due to different soil sampling devices.

- 10000 square meters reference site;
- Hand auger, mechanical auger, shovel
- Comparative sampling (systematic random sampling);
- 105 test samples from 105 primary samples (each sampling device);
- Sample preparation and analysis by k0-INAA (Zn mean concentration value) carried out by a single lab.

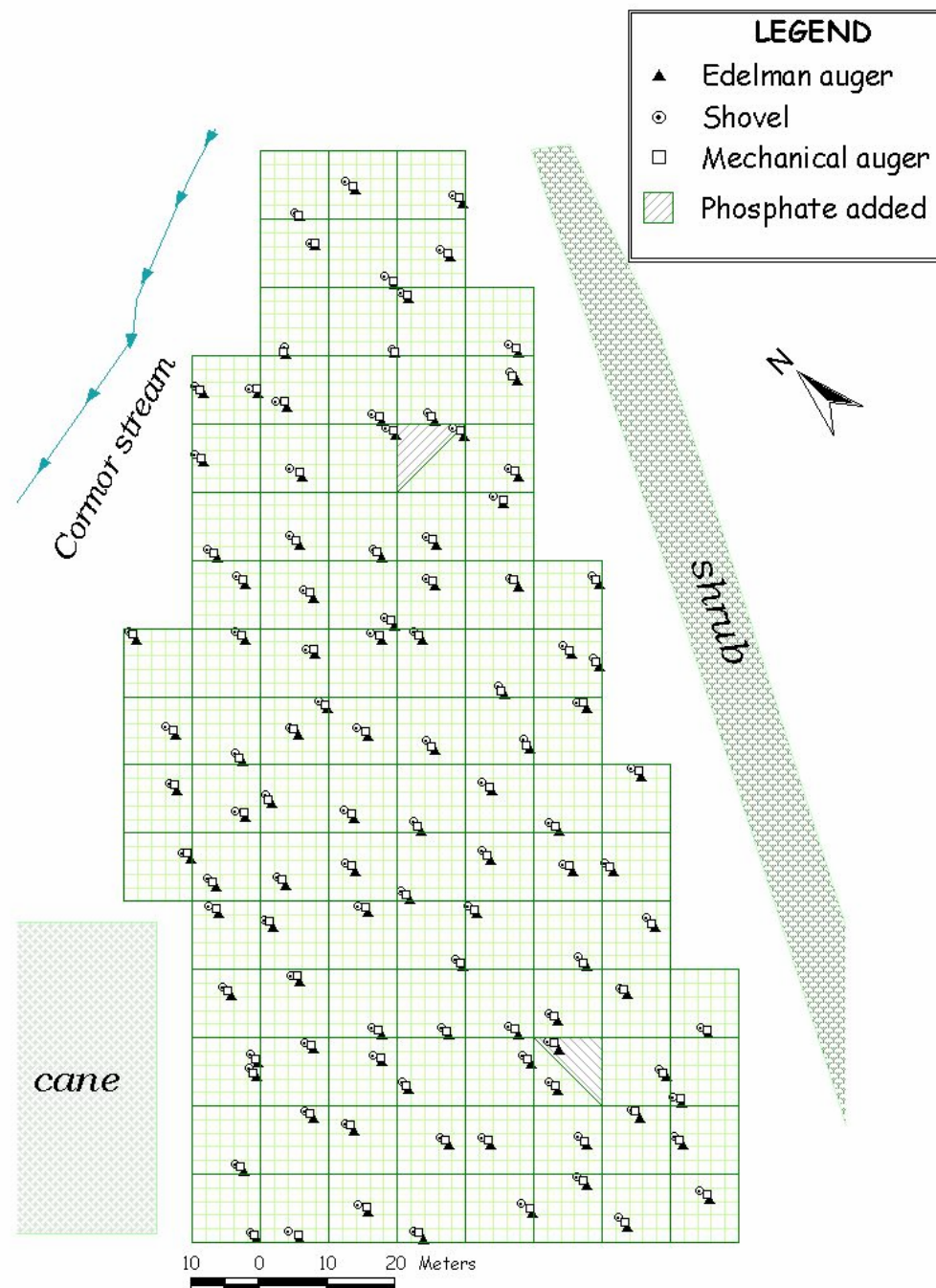


Comparative sampling

105 single samples
collected by 3 sampling
devices



**Data set of 105 values
for each device**





Hand auger



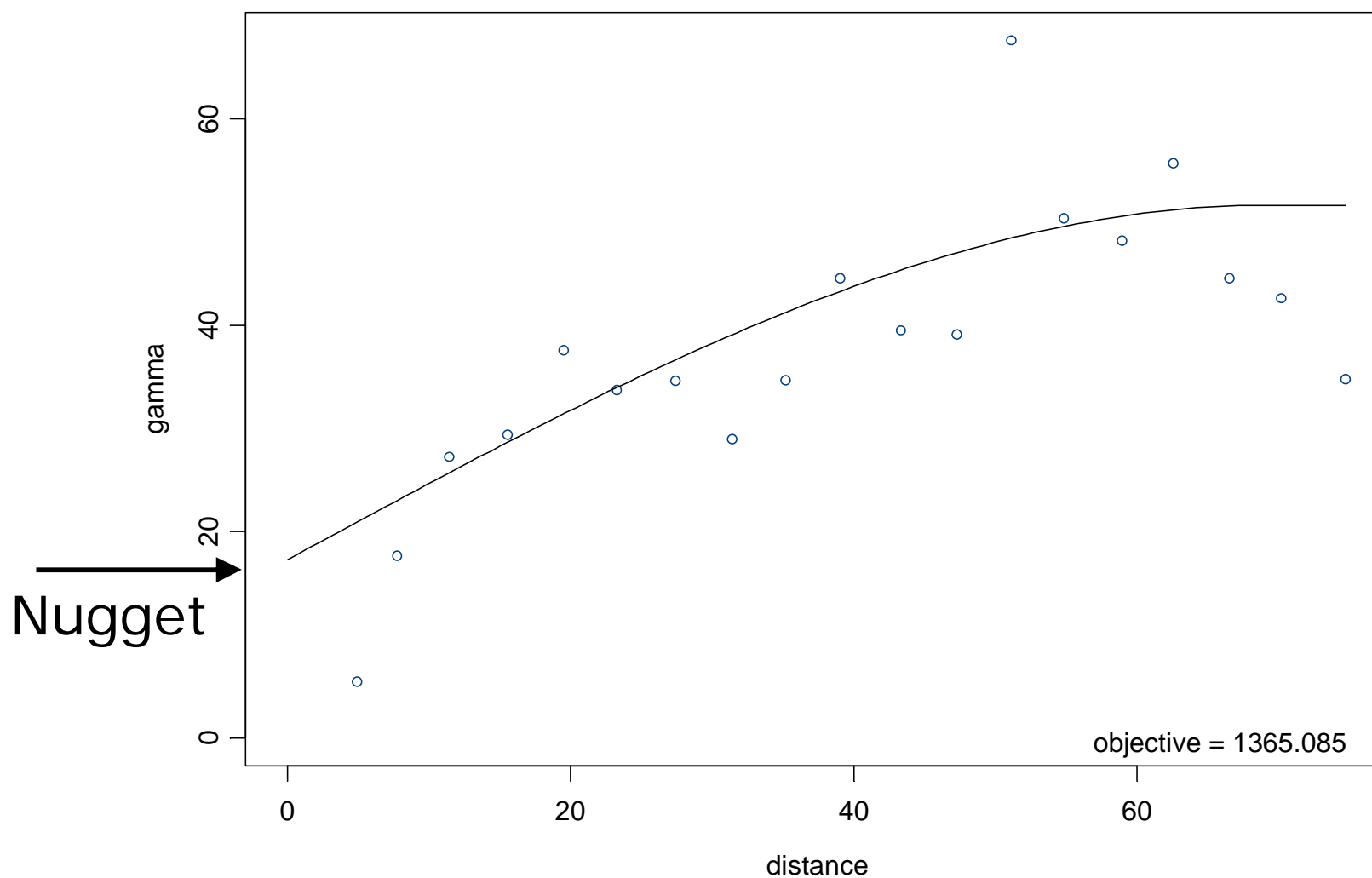
Mechanical auger



Shovel

Variogram parameters

Directional Variogram (90°) - Zinc (mg/kg) - Auger



Calculation (1)

$$s^2_{\text{sampling}} = s^2_{\text{nugget}} - (s^2_{\text{analysis}} + s^2_{\text{sample reduction}}) =$$

$$17,3 - 4,1 = 13,2$$

$$s^2_{\text{analysis}} + s^2_{\text{sample reduction}}$$

Were calculated together experimentally analysing 10 replicates (test portions) taken from 3 independent test samples

Calculation (2)

The **sampling standard uncertainty** is:

$$u_{\text{sampling}} = \sqrt{s_{\text{sampling}}^2} = \sqrt{13,2} = 3,6 \text{ mg/kg}$$

As **uncertainty relative** to the Zn mean concentration (90,2 mg/kg) becomes:

$$u\%_{\text{sampling}} = (3,6 / 90,2) * 100 = 4 \%$$

The **sampling expanded uncertainty** is:

$$U_{\text{sampling}} = k * 3,6 = 7,3 \text{ mg/kg} \quad (k = 2)$$

U_{sampling} VS. U_{meas}



Measurement standard uncertainty (from nugget value)

$$U_{\text{meas}} = 4,2 \text{ mg/kg}$$

Sampling uncertainty (subtracting analytical uncertainty from measurement uncertainty)

$$U_{\text{sampling}} = 3,6 \text{ mg/kg}$$

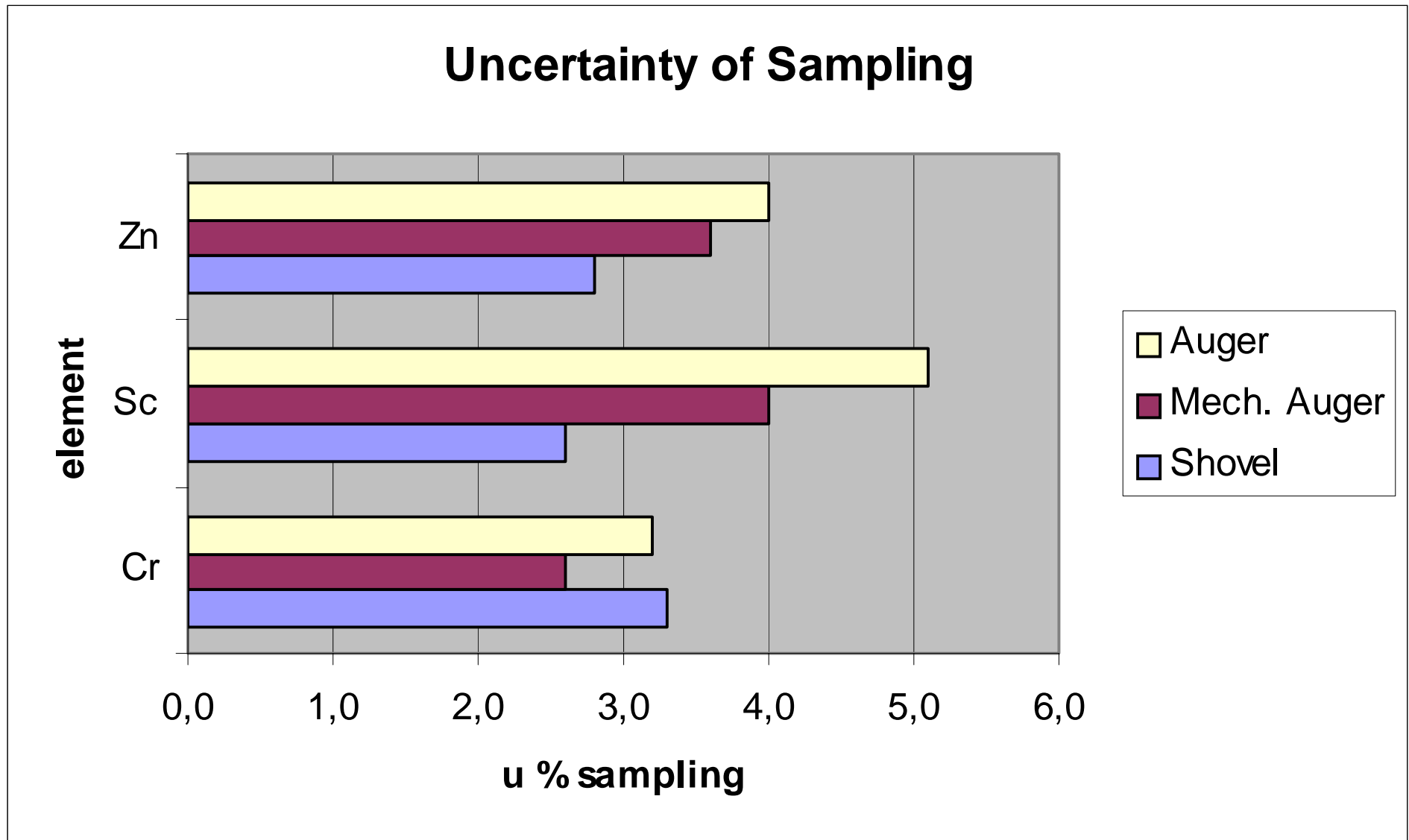
The contribution of the sampling to the measurement uncertainty is:

$$u\%_{\text{s/meas}} = (3,6/4,2) * 100 = 76 \%$$

Uncertainty budget

Zinc	Auger
Element mean value (n=105) x_{mean} (mg kg ⁻¹)	90,2
Nugget variance: s^2_{nugget}	17,3
Analytical variance: $s^2_{\text{analytical}}$	4,1
Sampling variance: s^2_{sampling}	13,2
Sampling standard uncertainty: u_{sampling} (mg/kg)	3,6
Relative sampling uncertainty: $u\%_{\text{sampling}}$ (%)	4,0
Measurement standard uncertainty: u_{meas} (mg/kg)	4,2
Sampling uncertainty vs. the measurement uncertainty $u\%_{s/\text{meas}}$ (%)	76

Sampling uncertainty by element and device



In conclusion (1)

- The sampling contribution due to different sampling devices/techniques is calculated
- It represents the repeatability of sampling operations;
- No bias (systematic) effects are considered both for sampling and analysis;
- The sample preparation is included in sampling uncertainty (from primary sample to test sample) and in the analytical uncertainty (from test sample to test portion)

In conclusion (2)

- The sampling uncertainty calculated is site-specific and is applicable:
 - to analogue soil situation and similar range of mass fractions;
 - To new independent measurements of soil collected in the same area.
- Sampling within the site can be the dominant component of the measurement uncertainty (typical in most environmental matrix);
- The spatial variation component is erased in the calculation considering only the nugget.