



# Introduction to Measurement Uncertainty

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19 November 2019



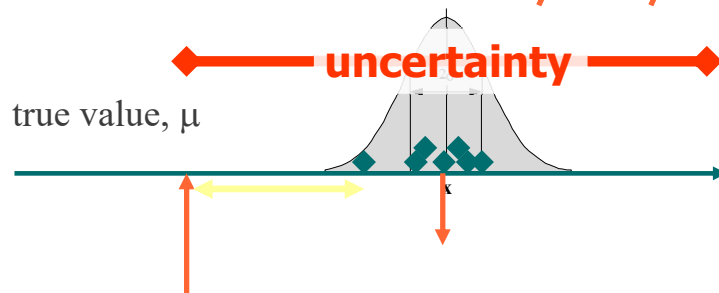
## Outline

- What is measurement uncertainty?
- Quality from a customer ´ s perspective
- Monte Carlo simulation as a universal tool
- Special case of (large) relative uncertainty
- Remaining Problems: Inadequate results from Guidelines and Standards

## Error of measurement vs. Uncertainty of measurement

(total) error of measurement =  
random error + systematic error

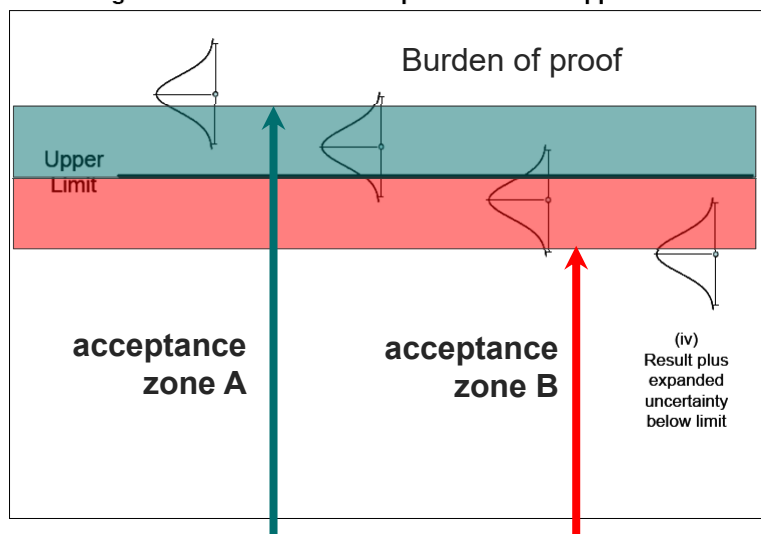
$$(x_i - \mu) = (x_i - \bar{x}) + (\bar{x} - \mu)$$



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## Decisions under uncertainty

Figure 1 Assessment of Compliance with an Upper Limit



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## Size of guard band g: change k or u

$$g = k * u = U \quad k \propto (1-\alpha)_{CI}$$

k...coverage factor

Greater k  
leads to better coverage  
(subject to pdf)

Smaller u  
leads to better decisions

but impairs decision process

but makes development of  
procedures and their  
operation more costly

<http://www.eurachem.org/index.php/publications/guides/uncertcompliance>

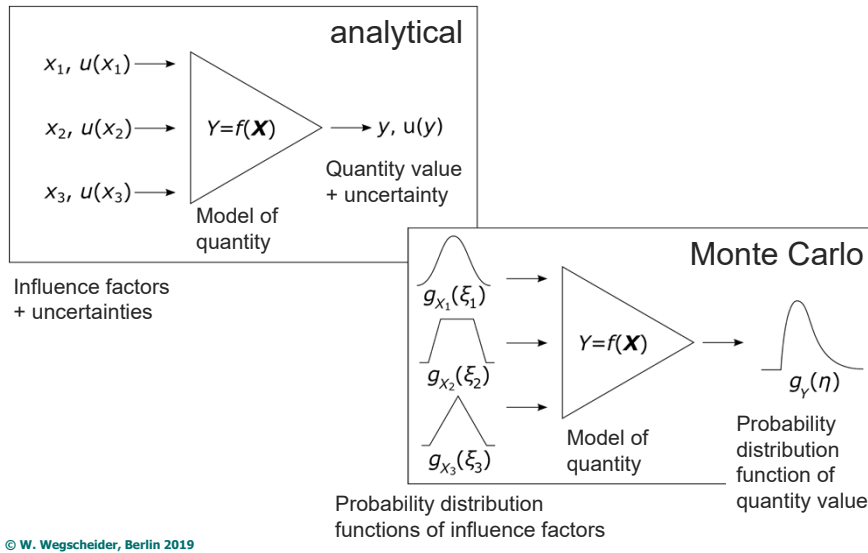
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## Analytical (and difference) vs. Monte Carlo

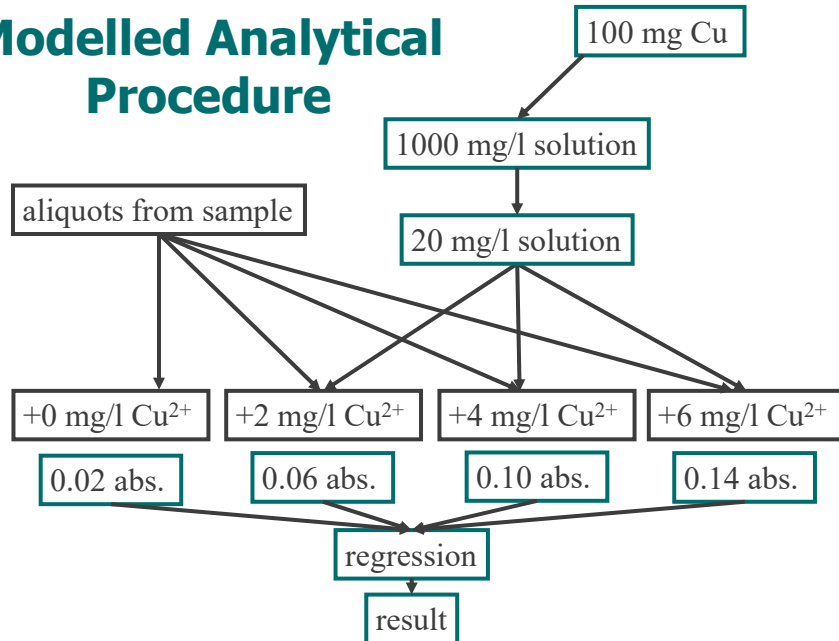


## Uncertainty and Distribution from Standard Additions

- Textbook wisdom:
  - „extrapolation“ to zero signal
  - asymmetric results for confidence limits
- Monte Carlo study with Excel add-in
- Determination of Cu by flame AA
  - Features: preparation of standards from solids, partial correlations, errors in x AND y

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## Modelled Analytical Procedure



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## 17 s for a Monte Carlo simulation

Preparation of Cu standard and standard additions for Cu in Water

	mass	purity	flask1	pipette	flask2	solution	dilution	Signal
20 mg/l								
nominal value	100,08	0,9999	100	20	1000	1000,69992	20,0139984	
uncertainty	0,05	0,0001	0,1	0,03017088	0,31547867			
	mg	ml	ml	ml	ml	mg/l	mg/l	
	norm	triag	rect	rect	rect			
Dummies			repeat_fl1	repeat_pip	repeat_fl2			
			0	0	0			nom add
			0,02	0,007	0,17			add conc
			norm	norm	norm			signal
								0
								2,00139984
								0,060028
								4,00279968
								0,10005599
								6,00419952
								0,14008399
			temp_fl1	temp_pip	temp_fl2			
			0	0	0			
			0,03	0,006	0,3	zero	0,02	
			rect	rect	rect		0,0003	
								slope
								0,02
								intercept
								0,02
+ 2mg/l				pipette	flask2			
nominal value				10	100		2,00139984	0,06
				norm	norm			0,0002

Formula: =RiskOutput("signal")+J54+(K15-J15)\*0,02

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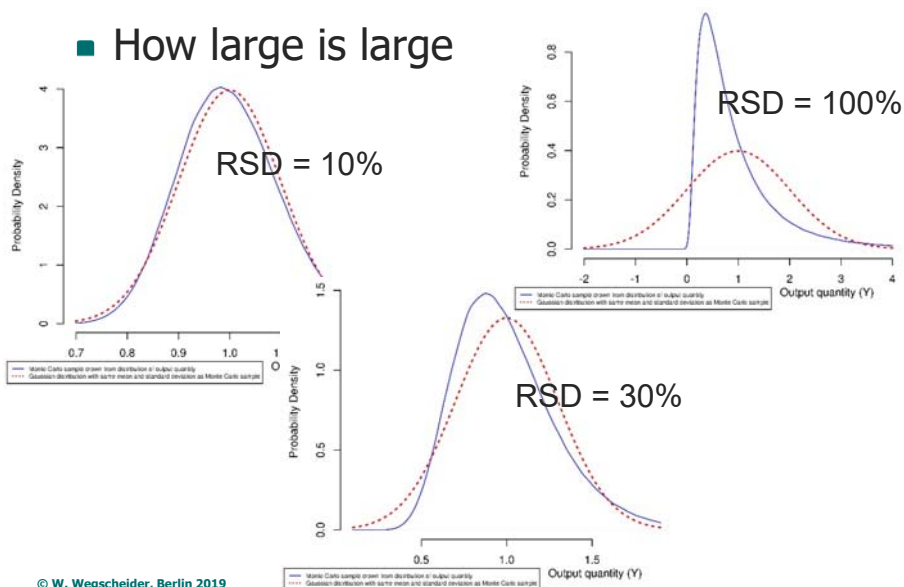
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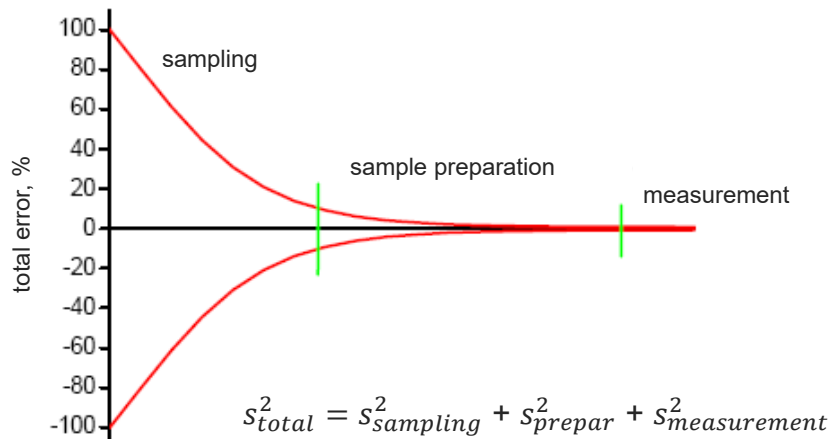
## Large relative uncertainty

- How large is large



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## Typical contributions to uncertainty



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## Consequences of typical contributions to uncertainty

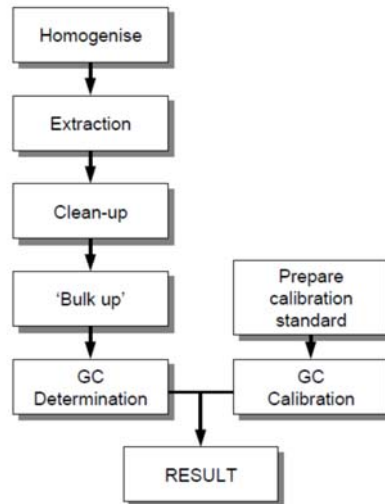
$$s_{total}^2 = s_{sampling}^2 + s_{prepar}^2 + s_{measurement}^2$$

- Sampling requires greatest attention
- Errors in sampling cannot be recovered  
in a later stage
- Only the largest contributions require optimization  
(Pythagoras !!!)

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# Determination of organo-phosphorus pesticides in bread

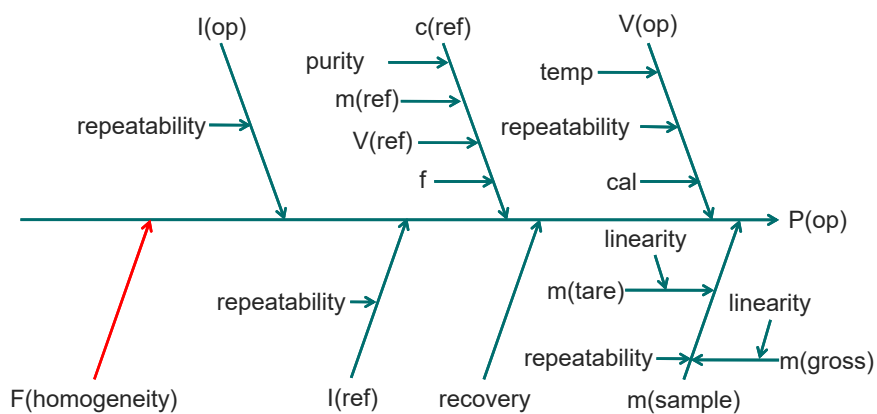
## 1. specification of measurand



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# Determination of organo-phosphorus pesticides in bread

## 2. identification of sources of uncertainty



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## Determination of organo-phosphorus pesticides in bread

### 3. Quantification of components

- Amended measurement equation:

$$P_{op} = \frac{I_{op} \cdot c_{ref} \cdot V_{op} \cdot 10^6}{I_{ref} \cdot m_{Probe} \cdot Rec} \cdot F_{homogeneity} (\mu\text{g/g})$$

 RSD = 27%

 RSD = 20%

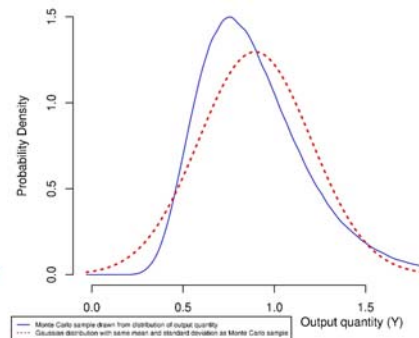
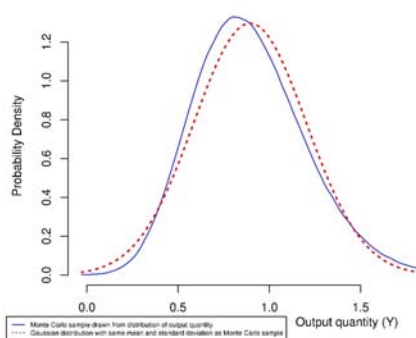
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## Determination of organo-phosphorus pesticides in bread

### 3. Combining the separate contributions

normal  
95% (0.36;1.56)

log-normal  
95% (0.44;1.63)



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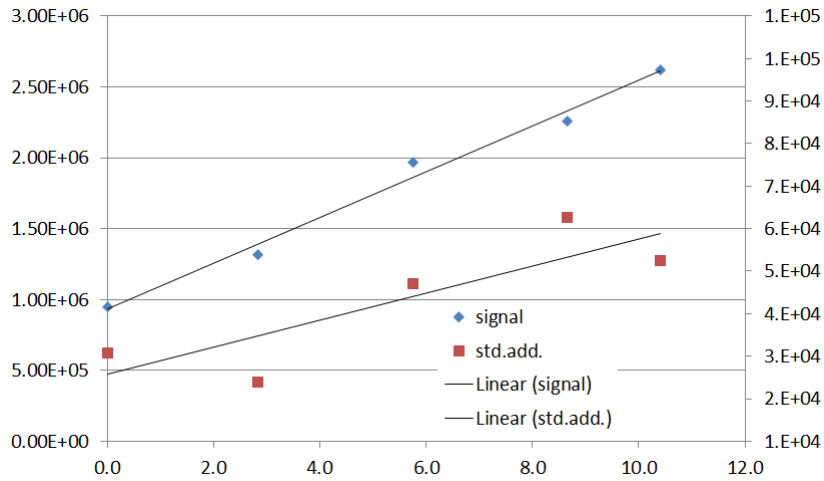
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## Standard on Standard Additions DIN 32633 (2013) 5x5 additions

Ideal cases	s	result	DIN	M.C.
	Const. uniform	0.5 a.u.	0.060 a.u.	0.058 a.u.
	Const. normal	0.5 a.u.	0.027 a.u.	0.026 a.u.
Real cases	from DIN/PTB	µg/g		
Rh by ICPMS	increasing	231.3	12.9	5.6
Rh by ICPMS	intern. std.	233.7	3.3	2.2
		µg/ml		
Br ´ by IC	variable	24.44	0.54	0.25

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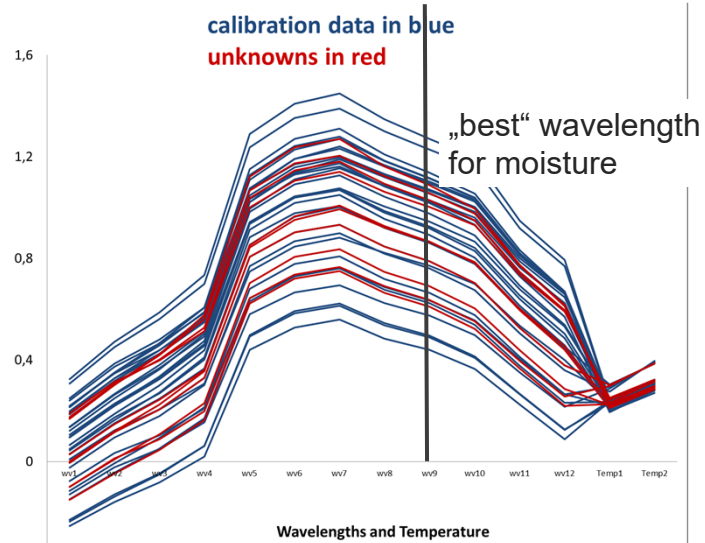
## ICP-MS Data from DIN



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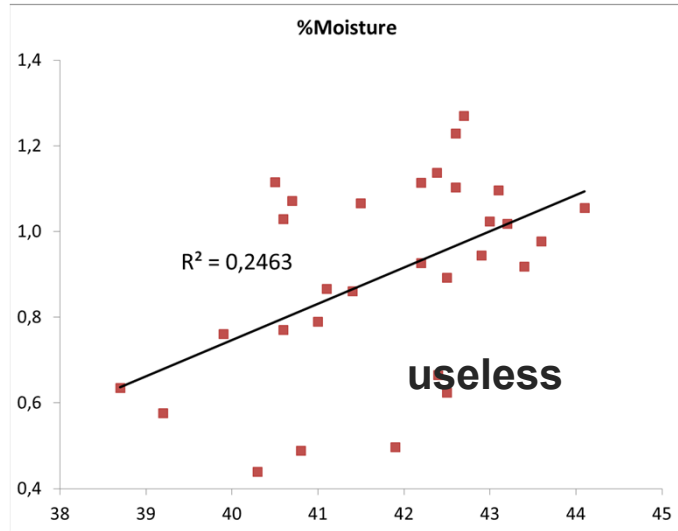
## NIR spectra of brick cheese

Infometrix Applications Overview 1996



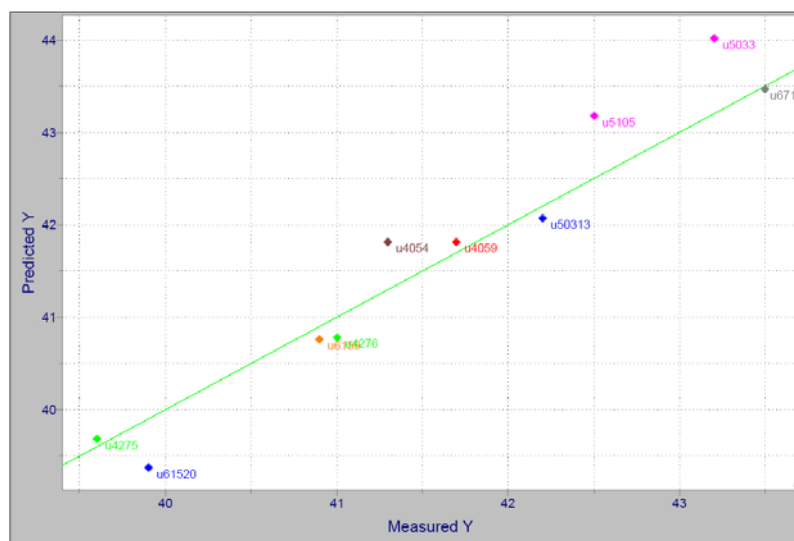
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## Calibration on wavelength 9



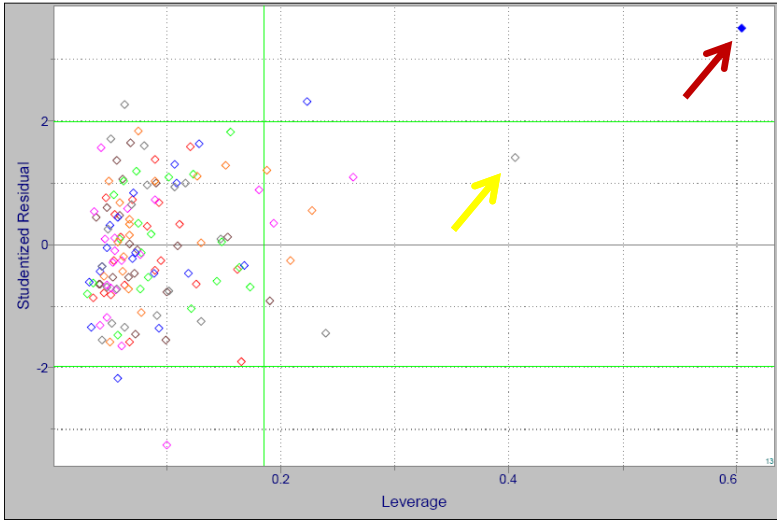
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## Multivariate prediction of moisture



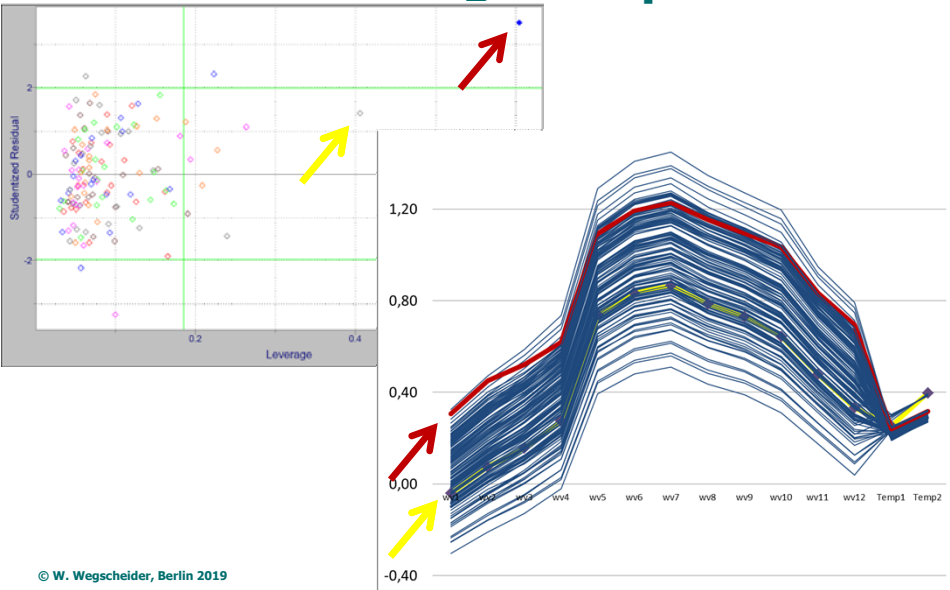
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# h ..... leverage



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# h ..... leverage vs. spectra



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## IUPAC Approach to „uncertainty“

*Pure Appl. Chem.* 78, No. 3, pp. 633–661, 2006

$$\left[ s(c) \right]^2 = h s_c^2 + h (s_r / S_n)^2 + (s_r / S_n)^2$$

$\left[ s(c) \right]^2$  variance of prediction

$h s_c^2$  leverage \* var. of conc. of standards

$h (s_r / S_n)^2$  leverage \* var. of (signals/sensitivity)

$(s_r / S_n)^2$  variance of (signals/sensitivity)

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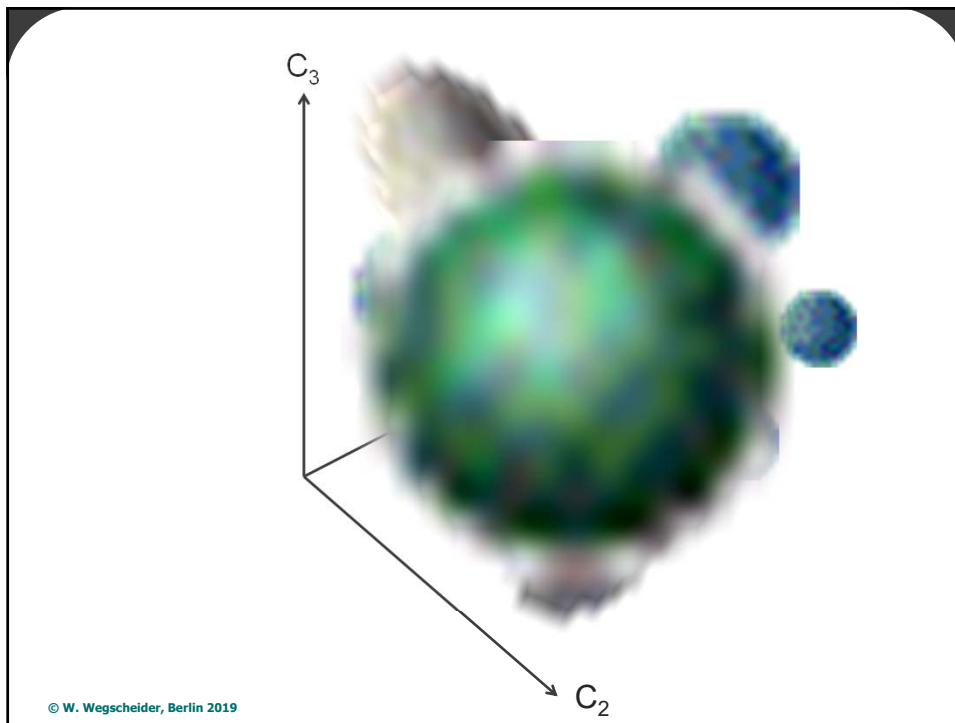
## Effect as extra-RMSEP in % moisture

Noise of 2% added to	Spectra of standards	Spectra of unknowns	Concentration of standards	Sum (IUPAC)	All three
Effect (in %moisture)	0.194				

RMSEP, root mean squared error of prediction

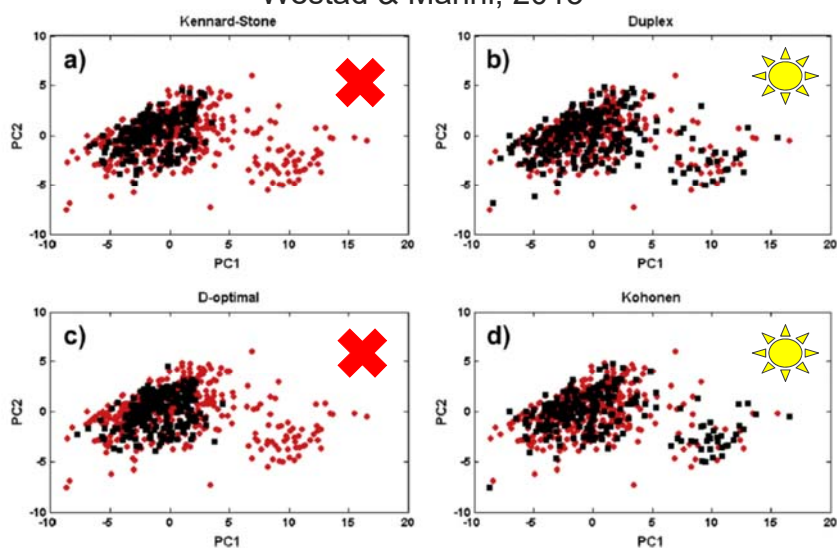
- The IUPAC-proposed summation does not work
- Expected reason: no allowance for significant correlations
- Full Monte-Carlo procedure is required instead

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## Effect of four sampling procedures

Westad & Marini, 2015



## Conclusions

- CITAC/Eurachem Guides have been very well received
- Very good tools are available for free
- Remaining problems should be tackled

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**Thank you for your interest**

