



# Uncertainty Estimation on the Quantification of Major Proteins in Milk by Liquid Chromatography

Contribution to a Chemical Reference Measurement System

**F. Cordeiro**

*Institute for Reference Materials and Measurements*

*JRC - EC*

## Introduce... the Objectives / ..the Analytical Problem

### 1. Specify the Measurand

#### Basic Statistics

### 2. Identify Uncertainty Sources

#### Introduce Stated References / Calibrants

### 3. Quantify Uncertainty

### 4. Combine Uncertainties / Report Uncertainty

#### Conclusions

**“Guide to the Expression of Uncertainty in Measurement”**, (GUM), ISO, 1995 (JCGM 100:2008)

**“Quantifying Uncertainty in Analytical Measurement”**,  
EURACHEM/CITAC Guide, 2<sup>nd</sup> Ed., 2000

**“The Fitness for Purpose of Analytical Methods”**,  
EURACHEM, 1998

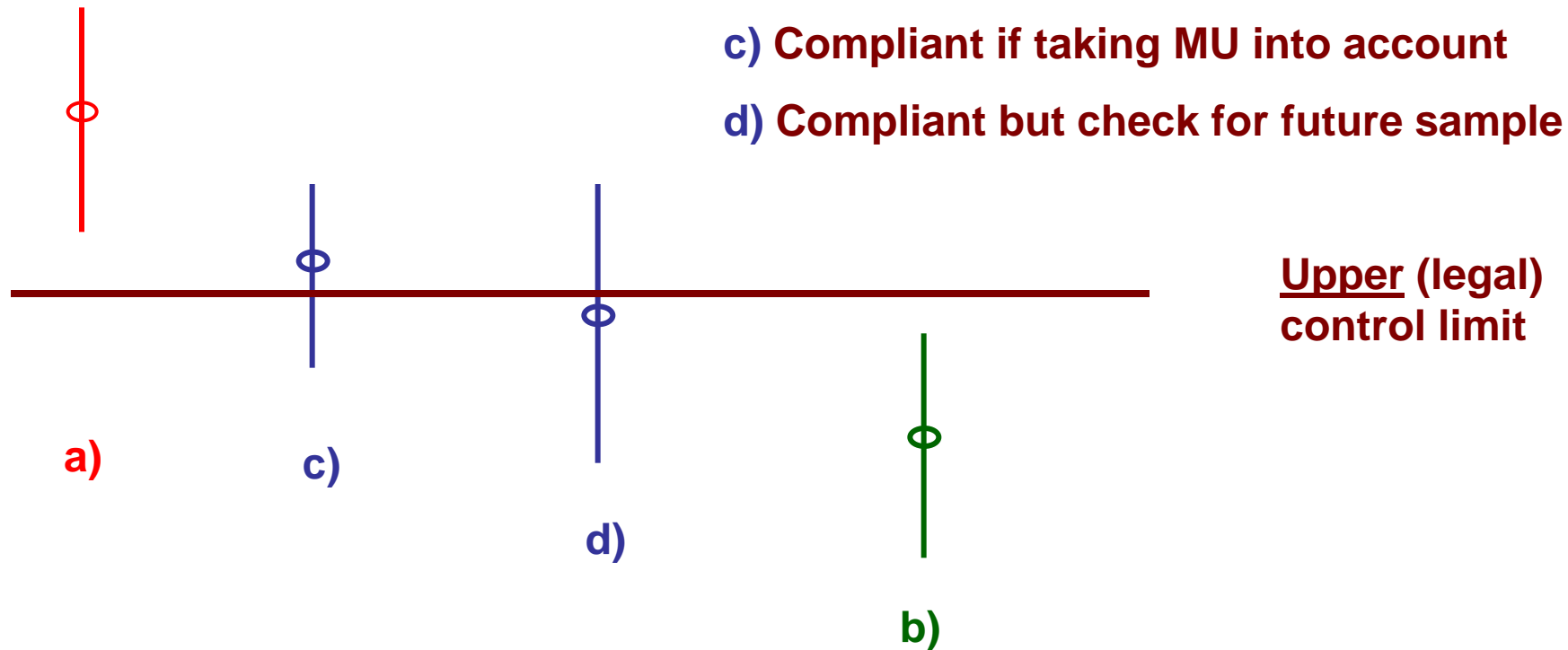
## Measurement Uncertainty (MU)

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

VIM, 2008.

- ✓ Compliance with legal limits (or contractual)
- ✓ Confidence in analytical results
- ✓ Quality Assurance
- ✓ Demonstrate “*Fitness for purpose*”
- ✓ Traceability - Measurement...  
Comparability/Transferability

## Result $\pm$ MU (expanded U ~ 95 %)



**a) Result exceeds the limit plus U (non-compliant)**

**b) Compliant**

**c,d) Result exceeds/is below the limit by less than U (requires discussion in light of any agreement with the user of the data)**

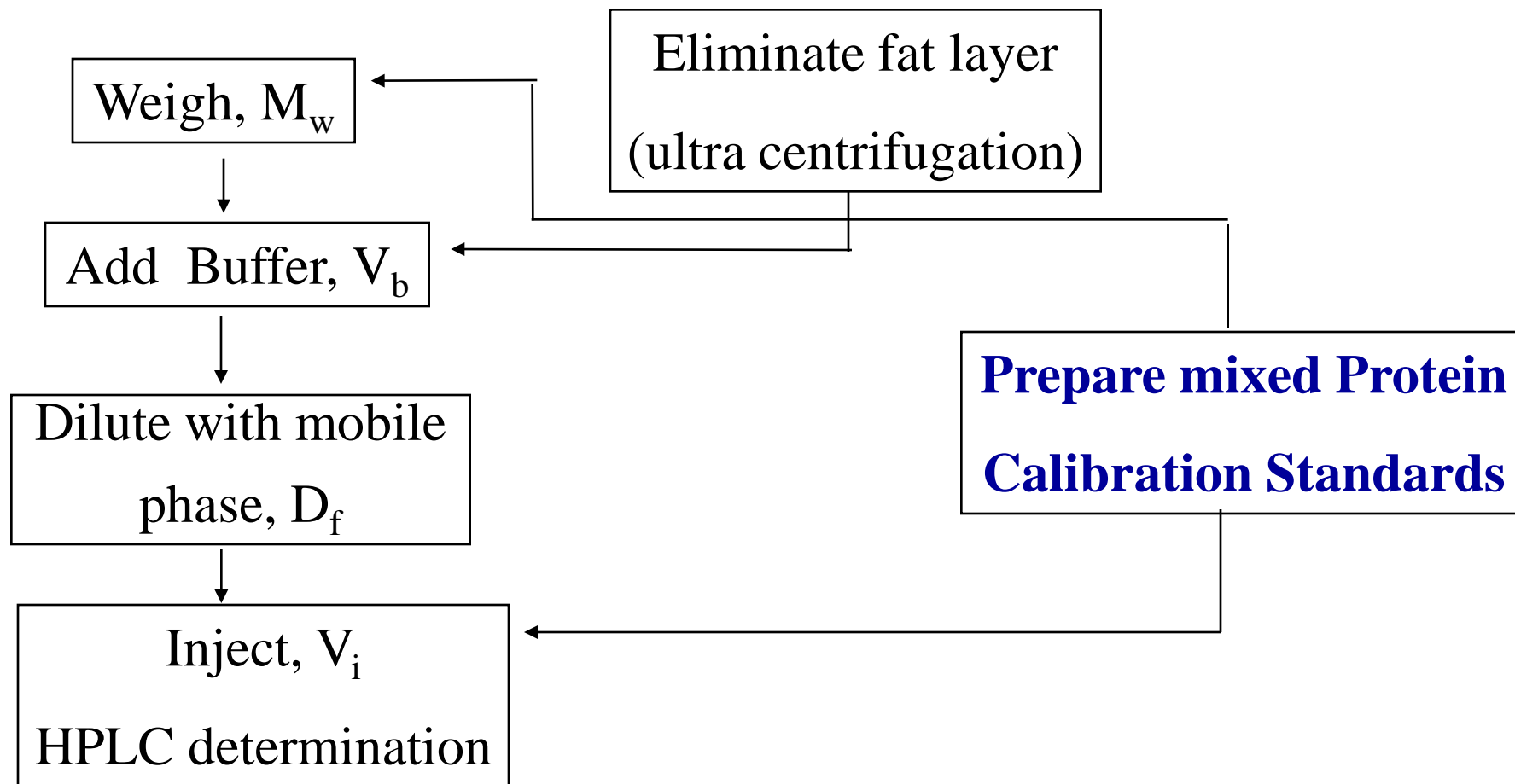
## Traceability

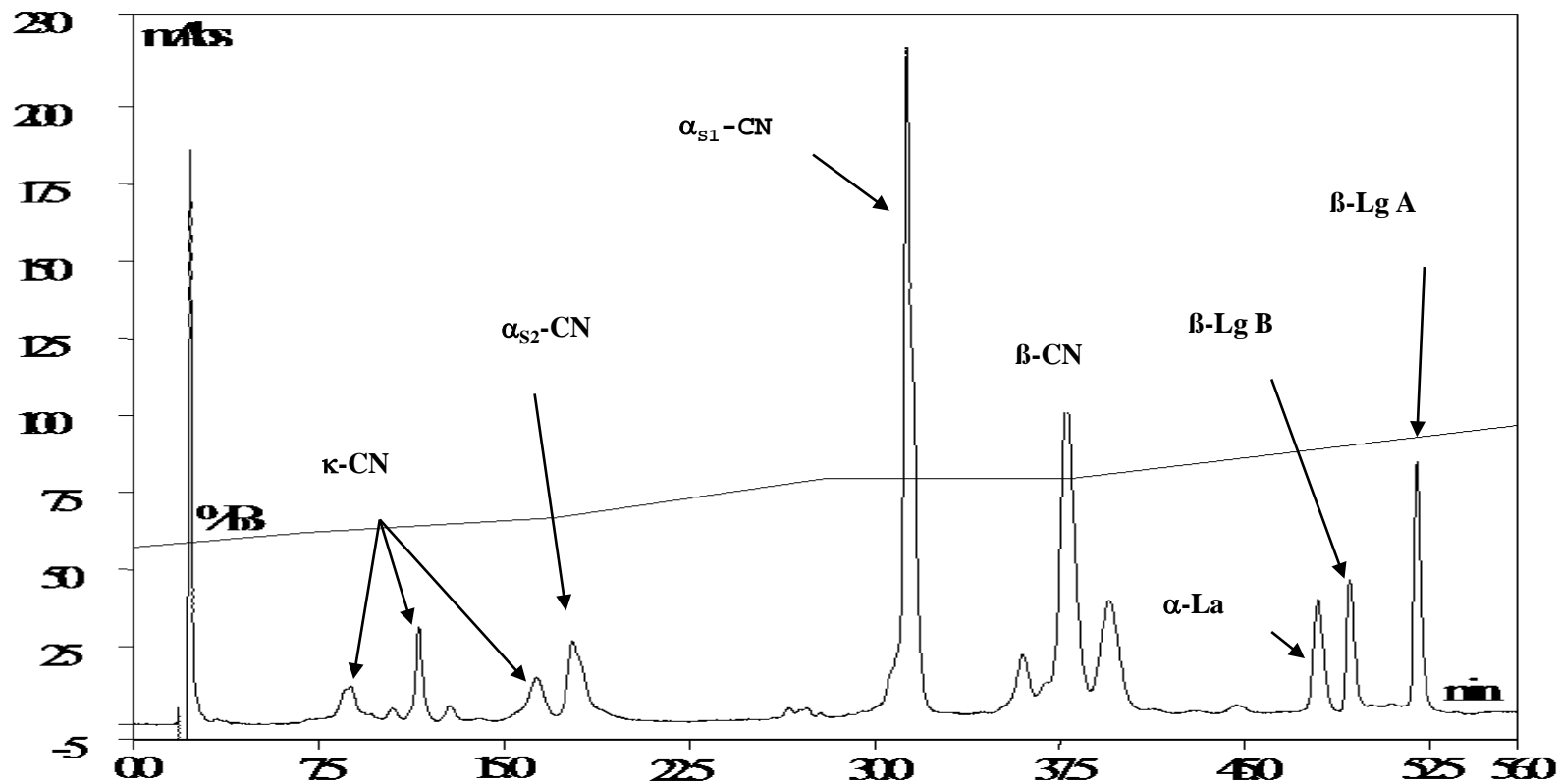
“property of a **measurement result** whereby the result can be related to a reference through a documented unbroken chain of **calibrations**, each contributing to the measurement uncertainty”

**VIM: 2008**

## Powdered Samples

## Liquid Samples





**Typical chromatographic profile for raw bovine milk**

## Protein Concentration (C)

$$C = M_0 \cdot 1000 / M_i$$

where  $M_i$  = injected mass of sample, depends on...

$$M_i = M_w V_i \cdot 1000 D_f / V_b \quad (\text{powdered milk samples})$$

$$M_i = D V_s V_i \cdot 1000 D_f / (V_b + V_s) \quad (\text{liquid milk samples})$$

Combining...

$$C = M_0 V_b / (M_w V_i D_f) \cdot EF \quad (\text{in } \mu\text{g mg}^{-1})$$

## Combined Standard Uncertainty

$$Y = a + b$$

~~$$u_c(Y) = \sqrt{u(a)^2 + u(b)^2}$$~~

$$Y = a / b$$

$$\frac{u_c(Y)}{Y} = \sqrt{\left(\frac{u(a)}{a}\right)^2 + \left(\frac{u(b)}{b}\right)^2}$$

**Uncertainty Budget / Law of Uncertainty Propagation**

## **Estimating Uncertainties of Type A:**

**Evaluation of uncertainty by statistical analysis**

## **Estimating Uncertainties of Type B:**

**Evaluation of uncertainty by other means than  
statistical analysis**

**Only type A uncertainties can be improved  
...by more measurements**

Uncertainty Component	Value	Unit	u(x)	Distribution	n	Obser.
<b>Weighing, <math>M_w</math></b>	$\approx 1.5$	mg	0.32 %	Normal	6	
<b>Volumetric measurements</b>  ( $V_s, V_b, V_t$ )	(Gravimetry)	$\mu\text{l}$	Variou s	Normal	15	Done for each dispensed volume
<b>Injection, <math>V_i</math></b>	20.0	$\mu\text{l}$	0.15 %	Triangular	-	Type B
<b>Dilution, <math>D_f</math></b>	0.333	-	0.25 %	Combining		
<b>Interpolated, <math>M_0</math></b>	-	$\mu\text{g}$			6	Regression
<b>Protein Purity</b>	1		6.5 % (of C)	Rectangular	-	
<b>Injected mass</b>  (Standards, $M_i$ )	1	$\mu\text{g}$	0.3 % (of C)	Rectangular	-	
<b>Analytical Recovery</b>  ( $R_m$ )	1.04	-	0.025	Normal	70	On MCRM

## Purified Caseins:

$\kappa$ -CN C-0406 ( > 80 % by electrophoresis )

$\alpha$ -CN C-6780 ( ~ 85 % by electrophoresis ), contains both  $\alpha_{S1}$ -and  $\alpha_{S2}$ -CN

$\beta$ -CN C-6905 ( > 90 % by PAGE )

## Purified Whey proteins:

$\alpha$ -La L-5385 ( ~ 85 % by PAGE )

$\beta$ -Lg B L-8005 ( > 90 % by PAGE )

$\beta$ -Lg A L-7880 ( > 90 % by PAGE )

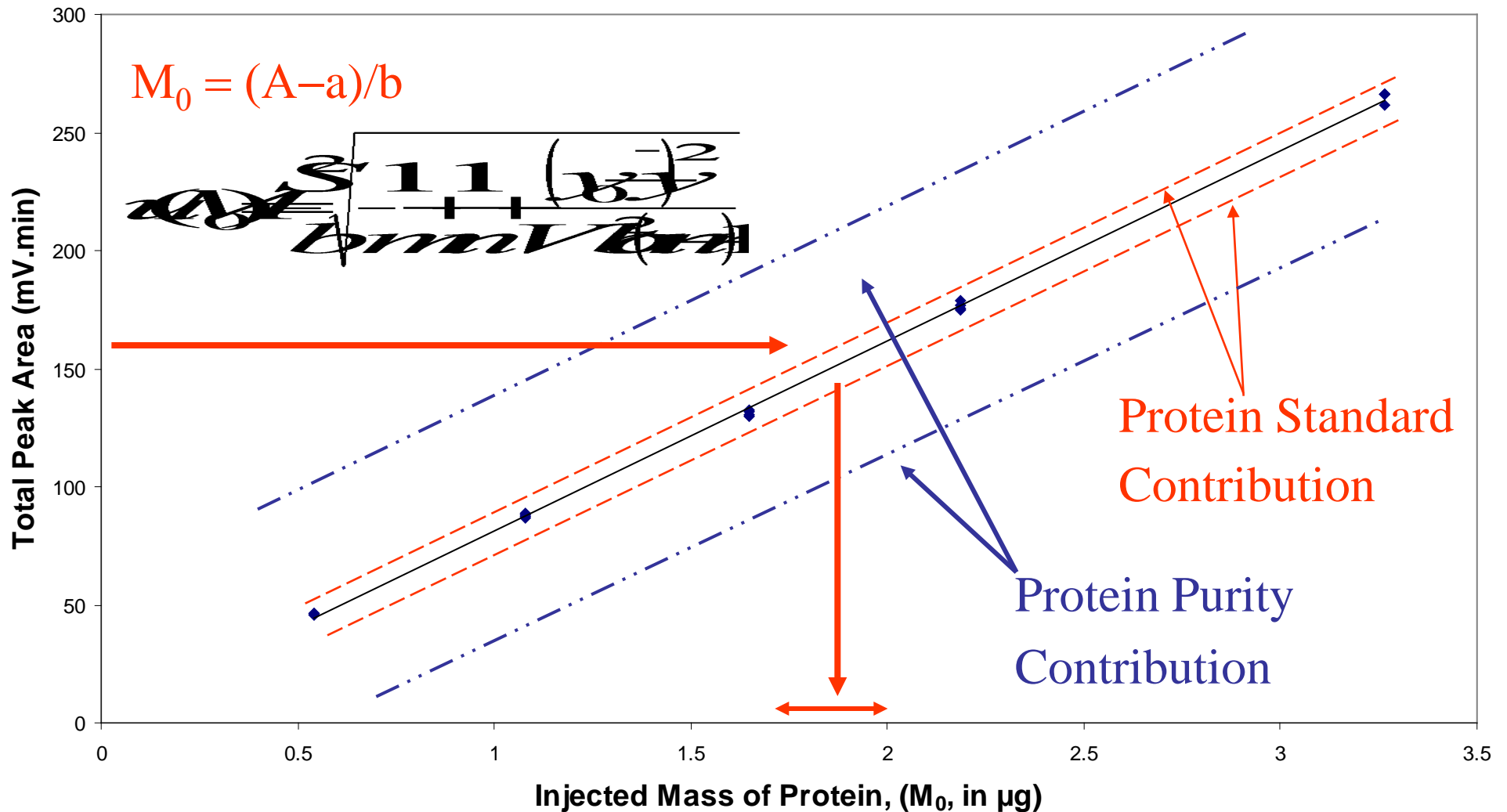
**Individual solutions are prepared and calibration curves (total peak area Vs. injected mass of protein) are established based on a mixed standard solution (mimics a real sample).**

## BCR 063R - Skimmed Milk Powder

( certified for trace elements including Total Nitrogen )

- **Matches a real milk powder**  
(analyte concentration and matrix composition)
- **Is Representative for the investigated samples**
- **Total Protein content can be estimated with stated uncertainty - (Method Validation and Assessment of MU, Uncertainty in Analytical Recovery)**

## Uncertainty Estimation on the Regression



## Uncertainty Contributions for a Single Major Protein: $\kappa$ -CN

Uncertainty Component	Interpolated Mass ( $M_0$ in $\mu\text{g}$ )		C ( $\mu\text{g mg}^{-1}$ )	Range	$u(x)$	$u(x)/x$	Obser.
		1.990	48.11		0.01	0.65 %	Nominal
Injected Mass Standard Protein	Lower limit	1.978	48.11	0.49/2	$0.25/\sqrt{3}$	0.3 %	Rectangular Distribution
	Upper limit	1.998	48.60				
Protein Purity	100 % purity	2.21	53.76	11.19/2	$5.6/\sqrt{3}$	6.5 %	Rectangular Distribution
	Lower Purity	1.75	42.57				

- Analytical Bias. 12 independent preparations of matrix CRM (BCR) (n=6, N=71): **+15.20  $\mu\text{g mg}^{-1}$**

- Mean method Analytical Recovery  **$R_m = 1.04$ ,  $S_{\text{obs}} = 0.05$**

$$u(R_m) = R_m \sqrt{\left(\frac{S_{\text{obs}}^2}{n C_{\text{obs}}^2}\right) + \left(\frac{u_{\text{CRM}}}{C_{\text{CRM}}}\right)^2} = 0.025$$

- Significant t-test is performed, if:

$$|R_m - 1| / u(R_m) > t_{\text{crit}} : R_m \text{ differs from 1}$$

$$t_{\text{crit}}(N-1, 0.05) = 1.99 > t_{\text{cal}} = 1.6 \rightarrow \text{no correction applied}$$

- Sample treatment steps **all Combined** in the above procedure.

**Assuming no correlation between input quantities we have:**

$$u_c^2(y) = \sum \left( \frac{\partial f}{\partial x_i} \right)^2 \cdot (u(x_i))^2 \quad (\text{Eqn. 1})$$

**Where,**

$$y = f(x_1, x_2, x_3, \dots, x_i)$$

On a computer . . .

$$\frac{\delta f}{\delta x_i} = \frac{f(x_i + h) - f(x_i)}{h}$$

if now

$$h = u(x_i)$$

we get . . .

$$\frac{\delta f}{\delta x_i} = \frac{f(x_i + u(x_i)) - f(x_i)}{u(x_i)}$$

this we put into Eqn. 1

$$u_c^2(y) = \sum \left( \frac{f(x_i + u(x_i)) - f(x_i)}{u(x_i)} \right)^2 \cdot (u(x_i))^2$$

which can be simplified to:

$$u_c^2(y) = \sum (f(x_i + u(x_i)) - f(x_i))^2$$

\* J. Kragten, *Analyst*, 1994, **119**, 2161-2166

	Value	u(x)	u(x)/x	M <sub>w</sub>	Injection	Dilution	V <sub>b</sub>	M <sub>o</sub>	Purity	M <sub>i</sub>
M <sub>w</sub>	6.18	0.01978	0.32	6.19978	6.18	6.18	6.18	6.18	6.18	6.18
Injection	20	0.03	0.15	20	20.03	20	20	20	20	20
Dilution	0.33356	0.00083	0.25	0.33356	0.33356	0.33439	0.33356	0.33356	0.33356	0.33356
V <sub>b</sub>	1002.9	1.10319	0.11	1002.9	1002.9	1002.9	1004	1002.9	1002.9	1002.9
M <sub>o</sub>	1.99	0.01294	0.65	1.99	1.99	1.99	1.99	2.00294	1.99	1.99
Purity	1	0.03147	3.15	1	1	1	1	1	1.03147	1
M <sub>i</sub>	1	0.00145	0.15	1	1	1	1	1	1	1.00145
<b>C (µg mg<sup>-1</sup>)</b>	<b>48.41</b>	<b>1.6</b>	3.25	48.254	48.336	48.287	48.461	48.723	49.931	48.478
			Diff	-0.154	-0.073	-0.121	0.053	0.315	1.523	0.070
			Squares	0.024	0.005	0.015	0.003	0.099	2.320	0.005
<b>Uncertainty Contribution:</b>				<b>1.0</b>	<b>0.2</b>	<b>0.6</b>	<b>0.1</b>	<b>4.0</b>	<b>93.9</b>	<b>0.2</b>
<b>Concentration:</b>		<b>48.41 ±</b>	<b>3.1</b>	<b>µg mg<sup>-1</sup> (U, k=2)</b>						

$$C = M_0 V_b / (M_w V_i D_f)$$

Group	Protein	C	u(C)	(% P)	G (%)	U
Whey	$\alpha$ -La	8.0	0.5	2.0	8.3	0.5
	$\beta$ -LG B	8.3	0.3	2.0		
	$\beta$ -LG A	17.5	0.5	4.3		
Caseins	$\kappa$ -CN	48.4	1.6	11.8	91.7	5.4
	$\alpha_{S1}$ -CN	177.6	6.0	43.4		
	$\alpha_{S2}$ -CN	20.7	1.0	5.1		
	$\beta$ -CN	128.9	5.1	31.5		
<b>TP <math>\pm</math> U (k=2)</b>		<b>409.4 <math>\pm</math> 16.3</b>	<b><math>\mu\text{g mg}^{-1}</math></b>	<b>REU = 4%</b>		

**Total Protein : TP =  $\sum_i C_i$**

$$u_c(TP) = \sqrt{\sum_i u_c^2(C_i) + u^2(R_m)}$$

**Certified N = 62.3  $\mu\text{g mg}^{-1}$   $\longrightarrow$  TP = 397.5  $\pm$  10.2  $\mu\text{g mg}^{-1}$**

## Measurement Uncertainty demands ...

- ✓ **Clear statement for the measurand**
- ✓ **Identification and quantification of All conceivable sources of uncertainty**
- ✓ **Major uncertainty sources Should be re-evaluated**
- ✓ **The Method of Estimation May Affect Uncertainty Values**

## Measurement Uncertainty leads to ...

- ✓ **Better understanding** of the method
- ✓ **Continuous improvement** through Good Chemistry/QA
- ✓ **Higher Reliability** on the analytical results
- ✓ **Quality** (on the measurement) **is demonstrated**

## **Technical requirements towards;**

- **Personnel (competence, training, responsibilities, etc)**
- **Accommodation**
- **Test, Calibration and Method Validation**
  - ✓ **Using CRM/RMs for instrument, method calibration and IQC**
  - ✓ **Participation in ILCs**
  - ✓ **Systematic assessment of all influencing factors**
  - ✓ **Measurement uncertainty**
- **Equipment (calibration, acceptance limits)**
- **Quality control (acceptance limits)**
- **Traceability**

**5.4.6 ...Shall apply a procedure for MU...shall at least attempt to identify all the components of uncertainty and make a reasonable estimation**

- **ISO-GUM (bottom-up approach)**
- **From Validation (top-down approach)**

**Consider as much as possible all conceivable uncertainty sources!**

## Using collaborative method validation studies:

- Precision (as  $S_R$  at different concentration levels)
- Estimation of laboratory bias and method trueness (CRMs)
- Estimate the effect of any additional factors  
(Assessment of the MU based on scientific understanding of the theoretical principles of the method)

**Use A Well Balanced Experimental Design!**

**Design your experiments trying to mimic real routine conditions... Use different...**

**1 - Operators,**

**2 - Time,**

**3 - Instruments, (identical) chromatographic columns,**

**4 - Standard (stock) solutions, response curves**

**Use RM/CRM which matches routine materials**

**Apply analysis of variance (ANOVA)**

**Statistical grounds for your  $S_R$  estimation!**

**(ISO 21748:2004)  $S_R \sim$  MU (collaborative study)**

13 independent sample preparations. Effect of time, stock solutions, response curves, detector response, etc.

$M_i$	Total Protein Concentration, (in $\mu\text{g mg}^{-1}$ )						$TP_{\text{obs}}$	$u_c(TP_{\text{obs}})$
41.11	379.23	377.04	372.90	372.17	375.33	374.85	376.09	11.91
45.77	445.93	427.14	407.69	437.40	421.46	428.01	427.89	12.91
45.90	385.84	387.58	398.04	393.03	390.20	390.41	390.64	11.34
41.97	375.98	419.82	415.30	408.86	375.03	397.90	399.06	12.16
42.04	410.80	410.80	393.20	416.98	386.77	392.01	402.00	12.31
47.56	403.07	408.12	417.79	411.06	416.95	430.19	414.42	15.32
38.51	380.68	380.16	378.86	377.82	380.94	386.39	380.90	11.39
43.10	378.89	379.58	383.29	386.08	379.12	383.29	381.39	11.37
42.51	394.97	398.73	397.55	394.50	392.14	390.03	394.54	10.71
39.45	378.96	393.41	393.92	397.21	397.97		392.44	11.68
44.70	385.68	414.99	402.68	400.00	401.57	391.95	399.77	11.93
37.45	441.12	438.72	456.07	454.74	440.32	443.79	445.66	12.78
43.17	365.53	369.47	369.47	375.03	379.66	379.43	373.40	10.10
Total N = 77							<b>398.32</b>	<b>12.00</b>

Expanded uncertainty for total protein content  $\sim 24 \mu\text{g mg}^{-1}$  ( $k = 2$ )

Protein	$S_r$ (a)	$r$ (a)	$S_{Be}^2$	$S_I$ (a)	$R_w$ (a)	$n$	$u_c(x)$
$\kappa$ -CN	1.1	3.1	2.3	1.9	5.2	6	1.6
$\alpha_{S2}$ -CN	2.0	5.5	26.4	5.5	15.3	6	1.1
$\alpha_{S1}$ -CN	2.9	8.1	32.4	6.4	17.7	6	10.2
$\beta$ -CN	4.4	12.1	217.3	15.4	42.6	6	5.3
$\alpha$ -La	0.9	2.4	0.3	1.0	2.9	6	1.2
$\beta$ -Lg B	0.8	2.2	2.0	1.6	4.5	6	2.0
$\beta$ -Lg A	1.5	4.2	10.4	3.6	9.8	6	1.4
TP <sub>obs</sub>	9.3	25.6	423.9	22.6	62.6	6	12.0
Group Protein (%)	0.4	1.2	0.6	0.9	2.4	6	11.6 <sup>b)</sup> 2.7 <sup>c)</sup>

$\kappa$ -CN ( $u_c$ ) = 1.6  $\mu\text{g mg}^{-1}$  (bottom-up).  $S_I \sim \text{MU} = 1.9 \mu\text{g mg}^{-1}$

Using Horwitz values  $\sigma_H = 0.02 c^{0.8495} = 1.5 \mu\text{g mg}^{-1} (48.4 \cdot 10^{-3})$