

# Flow Measurement Uncertainty Assessment

by

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# Overview

- Uncertainty
  - definition, standards
  - confidence interval, distribution
  - non-linearity and bias
- Combination of Uncertainties
  - “How long is a piece of string”
  - Quadrature by partial derivative and perturbation
  - (MCS) Monte Carlo Simulation
  - Pipeline Allocation example
- Applications
  - Complex fluid property methods
  - Propagation of uncertainty
- Uncertainty; a philosophical point of view

# Known's & Unknown's



1. There are known known's; there are things we know, that we know;
2. There are known unknowns; that is to say, that there are things we now know, we don't know;
3. But there are also unknown unknowns; there are things we do not know, we don't know.

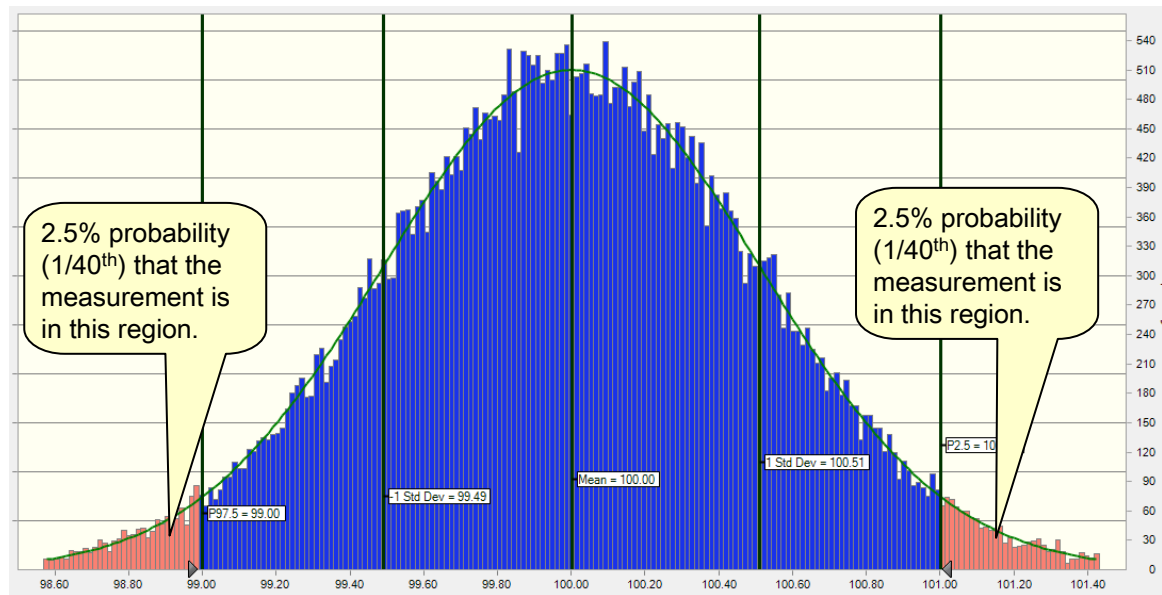
*Video: Former US Defense Secretary, Donald Rumsfeld presenting his uncertainty philosophy at a White House press briefing*

# Standards

- ISO Guide 98: 1995 “*Guide to the expression of uncertainty in measurement*”; known as the GUM, the over-arching uncertainty standard adopted by ANSI, BSI, OIML and others to which all ISO and OIML uncertainty standards must comply.
- ISO5168: 2005, “*Measurement of fluid flow – Procedures for the evaluation of uncertainties*”; specific to flow measurement, the latest update conforms to the GUM.
- API MPMS Chpt. 13.1: 1985 “*Statistical Aspects of Measuring and Sampling – Statistical Concepts and Procedures in Measurement*”, currently under review.
- ISO Guide 98/DSuppl 1.2, “*Propagations of distributions using a Monte Carlo method*”, supplement to the GUM covering the use of MCS (Monte Carlo Simulation) for uncertainty analysis.

# Definition

- Uncertainty is defined as the interval within which 95% of the values are expected fall for a given measurement.
- Normal (Gaussian) distribution shown has a mean of 100 with an uncertainty of  $\pm 1.00\%$  OMV (Of Measured Value) with a 95% CI (Confidence Interval).
- 95% CI found from twice the Standard Uncertainty which is the standard deviation of the measurement samples for a Normal distribution.
- Type A Uncertainty            Found by statistical sampling and analysis
- Type B Uncertainty            Found by other means with an assumed probability distribution



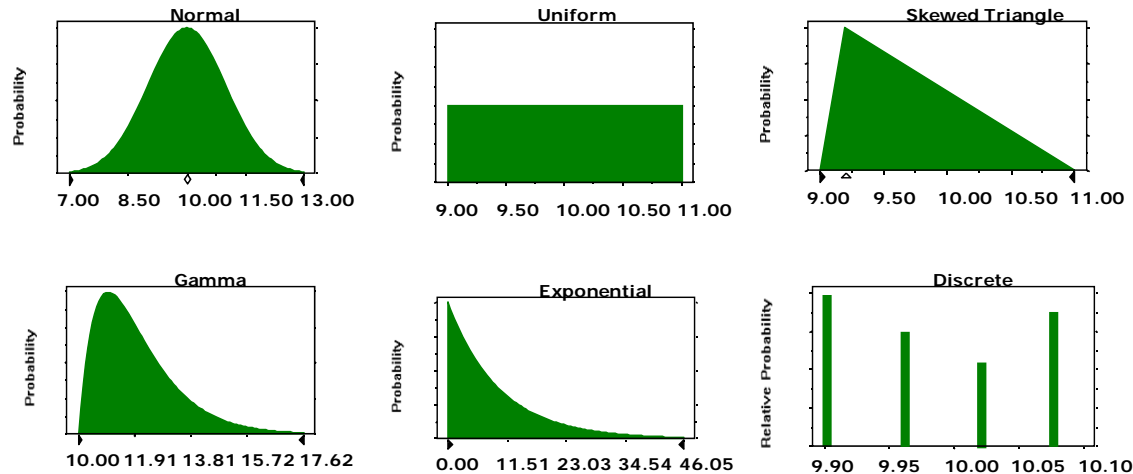
# Confidence Interval

- If CI's such as 90% or 99% are used the CI must be stated with along with the uncertainty.
- If the CI is not stated it is taken to be 95%.
- Uncertainty can be adjusted to any CI by multiplying the Standard Uncertainty (standard deviation) by the CF (Coverage Factor):

<u>CI</u>	<u>CF</u>
68%	x1.00
90%	x1.65
95%	x1.96
99%	x2.58

- These factors only apply to a large number of random samples. With a population of 5 samples the CF for a 95% CI increases to 2.57.

# Distributions



- Most measurements have a Normal distribution.
- A thermometer scale has discrete steps so the actual temperature falls between two points with an equal probability (uniform distribution).
- A Uniform distribution has a CF of  $\sqrt{3}$  (1.72) at a 95% CI.

# Central Limit Theorem



- The overall thermometer measurement uncertainty is due to several sources listed below. Each uncertainty is divided by the coverage factor to find the Standard Uncertainty:
  - $U_{sc}/\sqrt{3}$  scale spacing
  - $U_{pl}/2$  parallax reading error
  - $U_{sm}/2$  scale marking thickness
  - $U_{to}/2$  manufacturing tolerances
  - $U_{mc}/2$  meniscus on the top of the mercury column
- Overall measurement uncertainty is found by RSS (Root Sum Square) quadrature combination of uncertainties multiplied by the coverage factor of 2 for a Normal distribution provided the sensitivity for each term is unity:
$$U_t = 2 \times \sqrt{(U_{sc}^2 + U_{pl}^2 + U_{sm}^2 + U_{to}^2 + U_{mc}^2)}$$
- RSS is based on the CLT (Central Limit Theorem) whereby combinations of uncertainty distribution will tend toward a Normal distribution illustrated in the following example.

© Science Museum Picture Library

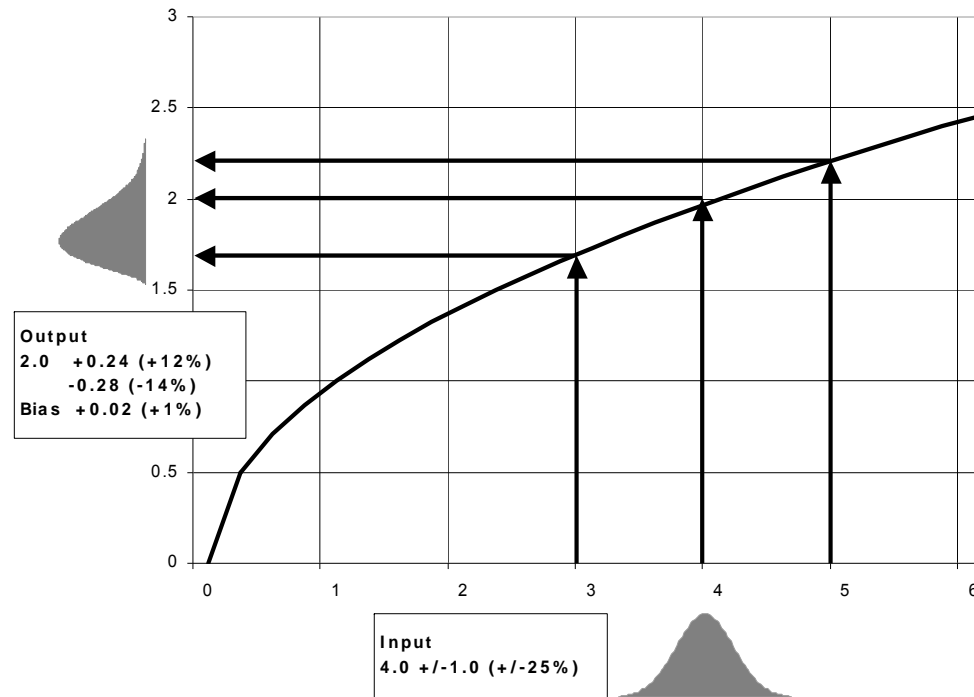
*Demo: CLT Combination of Distributions*

*The demonstration shows that when several distributions are combined the combination is a Normal distribution*

*This also shows the different distribution and the resultant distribution with standard deviation and the 95% CI*



# Skewed Distribution



- The flow rate of a Venturi or Orifice meter is proportional to the square root of the differential pressure between the Bore and Throat.
- This non-linear relationship skews the distribution leading to bias in the result which can be corrected by adjusting the mean.

*Demo: Square Root Bias; optional*

# How long is a piece of string (1)



Sources of uncertainty in measuring the length of a piece of string:

## String

- |                                 |                      |                          |
|---------------------------------|----------------------|--------------------------|
| – Straightness                  | $\pm 0.5''$          | Normal distribution      |
| – Ends (not frays)              | $2 \times \pm 0.1''$ | Normal distribution      |
| – Elasticity (stretch)          | $\pm 0.1''$          | Normal distribution      |
| – Humidity                      | $\pm 0.01''$         | Normal distribution      |
| • Ruler                         |                      |                          |
| – Calibration                   | $\pm 0.01''$         | Normal distribution      |
| – Resolution (scale)            | $\pm 0.25''$         | Rectangular distribution |
| – Temperature                   | $\pm 0.001''$        | Normal distribution      |
| • Reading                       |                      |                          |
| – Parallax error                | $\pm 0.125''$        | Rectangular distribution |
| – Operator error (not included) |                      |                          |

All uncertainty terms apply to the length of the string with a sensitivity of unity.

# How long is a piece of string (2)

$$\sqrt{\left(\frac{0.5}{2}\right)^2 + 2\left(\frac{0.1}{2}\right)^2 + \left(\frac{0.1}{2}\right)^2 + \left(\frac{0.01}{2}\right)^2 + \left(\frac{0.01}{2}\right)^2 + \left(\frac{0.25}{\sqrt{3}}\right)^2 + \left(\frac{0.001}{2}\right)^2 + \left(\frac{0.125}{\sqrt{3}}\right)^2} \cdot 2 = 0.62$$

## Quadrature RSS method

- The sources of uncertainty are combined above by the Quadrature method including division by a CF of 2 normal,  $\sqrt{3}$  for rectangular distributions to find the Standard Uncertainty.
- 10.25"  $\pm$  0.62" or  $\pm$  6.05% with 95% confidence level.
- Dominated by 0.5" string straightness.

## Monte Carlo Simulation method

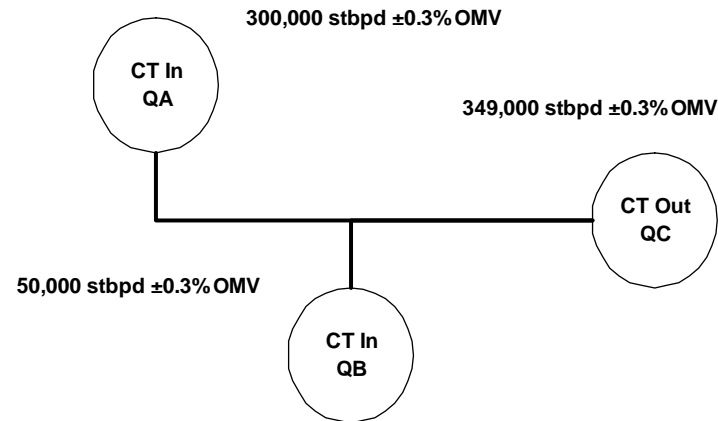
- Standard Uncertainty is found for each source of uncertainty as RSS and a distribution is generated centered on zero.
- The distributions for each source of uncertainty are added and the Standard Uncertainty found from the standard deviation of the resulting distribution and multiplied by the CF of 2 to given the overall uncertainty with CI of 95%.

Both approaches are demonstrated in the following example.

*Demo: How long is a piece of string by Quadrature and MCS.*

*The demonstration shows that RSS and MCS give the same result for this simple example.*

# Pipeline Allocation Uncertainty (1)



- A pipeline has two entrants with a single sales discharge all with Custody Transfer metering conforming to OIML R-117 Class 0.3A  $\pm 0.3\%$  OMV (Of Measured Value).
- The pipeline imbalance between entrants and sales is  $-0.3\%$  OMV, which is just on the measurement uncertainty limit.
- Sales are allocated in proportion to each entrants production.
- The allocation procedure will impact each entrants uncertainty exposure differently due to the different rates of production.

## Pipeline Allocation Uncertainty (2)

$$y = f(X_1, X_2, \dots, X_N) \quad (1)$$

$$U = \frac{\sqrt{(\Theta_1 \cdot U_1 \cdot X_1)^2 + (\Theta_2 \cdot U_2 \cdot X_2)^2 + \dots + (\Theta_N \cdot U_N \cdot X_N)^2}}{y} \quad (2)$$

$$U = \frac{\sqrt{\begin{aligned} & [y - f[(X_1 - U_1 \cdot X_1), X_2, \dots, X_N]]^2 \dots \\ & + [y - f[X_1, (X_2 - U_2 \cdot X_2), \dots, X_N]]^2 \dots \\ & + \dots \dots \\ & + [y - f[X_1, X_2, \dots, (X_N - U_N \cdot X_N)]]^2 \end{aligned}}}{y} \quad (3)$$

### Quadrature Uncertainty Analysis

- For a functional relationship (1)
- The relative uncertainty  $U_i$  is multiplied by the measured value to find the absolute uncertainty  $u_i$ .
- This is multiplied by the sensitivity  $\Theta_i$  found from the partial derivatives for each term in the function.
- The overall uncertainty is then found from the square root of the sum of the squares (2).
- The sensitivity can also be found from the function by perturbation of each term by the uncertainty and finding the square root sum of squares (3).

# Pipeline Allocation Uncertainty (3)

## Pipeline Measurement and Uncertainty

$Q_A := 300000$	$U_{Q_A} := 0.3\%$	Entrant A
$Q_B := 50000$	$U_{Q_B} := 0.3\%$	Entrant B
$Q_C := 349000$	$U_{Q_C} := 0.3\%$	Discharge C

### Quadrature uncertainty combination with sensitivity by partial derivative.

#### Pipeline entrant A allocation

$$AQ_A := \frac{Q_A \cdot Q_C}{Q_A + Q_B} \quad AQ_A = 299142.86$$

#### Entrant A allocation sensitivity terms found by partial differentiation

$$\begin{aligned} \Theta_{AQ_{AQA}} &:= \frac{Q_B \cdot Q_C}{(Q_A + Q_B)^2} & \Theta_{AQ_{AQA}} &= 0.14 & \frac{\partial}{\partial Q_A} \frac{Q_A \cdot Q_C}{Q_A + Q_B} &= 0.14 \\ \Theta_{AQ_{AQB}} &:= \frac{-Q_A \cdot Q_C}{(Q_A + Q_B)^2} & \Theta_{AQ_{AQB}} &= -0.85 & \frac{\partial}{\partial Q_B} \frac{Q_A \cdot Q_C}{Q_A + Q_B} &= -0.85 \\ \Theta_{AQ_{AQC}} &:= \frac{Q_A}{Q_A + Q_B} & \Theta_{AQ_{AQC}} &= 0.86 & \frac{\partial}{\partial Q_C} \frac{Q_A \cdot Q_C}{Q_A + Q_B} &= 0.86 \end{aligned}$$

#### Entrant A allocation uncertainty by Quadrature with partial derivative sensitivity terms

$$UA_{QA} := \frac{\sqrt{(U_{Q_A} \cdot Q_A \cdot \Theta_{AQ_{AQA}})^2 + (U_{Q_B} \cdot Q_B \cdot \Theta_{AQ_{AQB}})^2 + (U_{Q_C} \cdot Q_C \cdot \Theta_{AQ_{AQC}})^2}}{AQ_A}$$

$$UA_{QA} = 0.31\%$$

## Pipeline entrant B allocation

$$AQ_B := \frac{Q_B \cdot Q_C}{Q_A + Q_B} \quad AQ_B = 49857.14$$

#### Entrant A allocation sensitivity terms found by partial differentiation

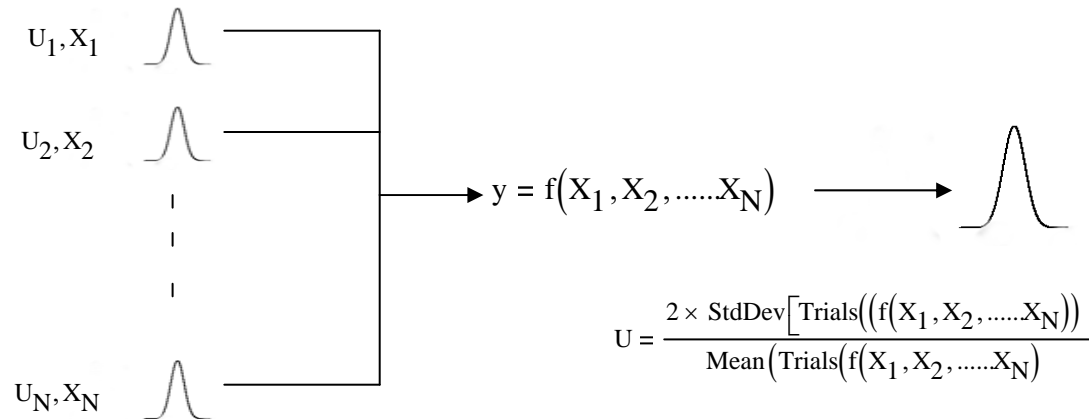
$$\begin{aligned} \Theta_{AQ_{BQA}} &:= \frac{-Q_B \cdot Q_C}{(Q_A + Q_B)^2} & \Theta_{AQ_{BQA}} &= -0.14 & \frac{\partial}{\partial Q_A} \frac{Q_B \cdot Q_C}{Q_A + Q_B} &= -0.14 \\ \Theta_{AQ_{BQB}} &:= \frac{Q_A \cdot Q_C}{(Q_A + Q_B)^2} & \Theta_{AQ_{BQB}} &= 0.85 & \frac{\partial}{\partial Q_B} \frac{Q_B \cdot Q_C}{Q_A + Q_B} &= 0.85 \\ \Theta_{AQ_{BQC}} &:= \frac{Q_B}{Q_A + Q_B} & \Theta_{AQ_{BQC}} &= 0.14 & \frac{\partial}{\partial Q_C} \frac{Q_B \cdot Q_C}{Q_A + Q_B} &= 0.14 \end{aligned}$$

#### Entrant B allocation uncertainty by Quadrature with partial derivative sensitivity terms

$$UA_{QB} := \frac{\sqrt{(U_{Q_A} \cdot Q_A \cdot \Theta_{AQ_{BQA}})^2 + (U_{Q_B} \cdot Q_B \cdot \Theta_{AQ_{BQB}})^2 + (U_{Q_C} \cdot Q_C \cdot \Theta_{AQ_{BQC}})^2}}{AQ_B}$$

$$UA_{QB} = 0.47\%$$

## Pipeline Allocation Uncertainty (4)



### Monte Carlo Simulation Uncertainty

- Distributions with a Standard Uncertainty, found from the measurement uncertainty divided by the CF, are generated and applied to the function.
- This is repeated several thousand times.
- The Standard Uncertainty is found from the standard deviation of the resultant distribution and multiplied by the CF of 2 to find the 95% CI.

RSS with partial derivative and perturbation sensitivity and MCS combined uncertainty

# Pipeline Allocation Uncertainty (5)

Measurement Quantity and Uncertainty		
Stream	Flow rate	Uncertainty
Q <sub>A</sub>	300,000	0.30%
Q <sub>B</sub>	50,000	0.30%
Q <sub>C</sub>	349,000	0.30%

Monte Carlo Simulation Uncertainty				
Allocation	Input Trial Q <sub>tmcs</sub>	Allocation Trials Aq <sub>tmcs</sub>	Allocation Mean AQ <sub>mcs</sub>	Uncertainty UAQ <sub>mcs</sub>
AQ <sub>A<sub>mcs</sub></sub>	-	#DIV/0!	299,143	0.31%
AQ <sub>B<sub>mcs</sub></sub>	-	#DIV/0!	49,857	0.47%
Q <sub>C</sub>	-			

Quadarature Partial Derivative Uncertainty				
Allocation	Allocation AQ <sub>pd</sub>	Sensitivity $\Theta$ AQ <sub>A<sub>pd</sub></sub>	Sensitivity $\Theta$ AQ <sub>B<sub>pd</sub></sub>	Uncertainty UAQ <sub>pd</sub>
AQ <sub>A<sub>pd</sub></sub>	299,143	0.14	- 0.14	0.31%
AQ <sub>B<sub>pd</sub></sub>	49,857	- 0.85	0.85	0.47%
Q <sub>C</sub>		0.86	0.14	

Quadrature Perturbation Uncertainty				
Allocation	Allocation AQ <sub>pt</sub>	Deviation $\Delta$ AQ <sub>A<sub>pt</sub></sub>	Deviation $\Delta$ AQ <sub>B<sub>pt</sub></sub>	Uncertainty UAQ <sub>pt</sub>
AQ <sub>A<sub>pt</sub></sub>	299,143	128.53	- 128.53	0.31%
AQ <sub>B<sub>pt</sub></sub>	49,857	- 128.26	128.26	0.47%
Q <sub>C</sub>		897.43	149.57	

Measurement Quantity and Uncertainty		
Stream	Flow rate	Uncertainty
Q <sub>A</sub>	300,000	1.00%
Q <sub>B</sub>	50,000	1.00%
Q <sub>C</sub>	349,000	0.30%

Monte Carlo Simulation Uncertainty				
Allocation	Input Trial Q <sub>tmcs</sub>	Allocation Trials Aq <sub>tmcs</sub>	Allocation Mean AQ <sub>mcs</sub>	Uncertainty UAQ <sub>mcs</sub>
AQ <sub>A<sub>mcs</sub></sub>	-	#DIV/0!	299,138	0.36%
AQ <sub>B<sub>mcs</sub></sub>	-	#DIV/0!	49,859	1.25%

## Uncertainty Method Comparison

*Demo: MCS RSS PD & Perturbation.*

*The demonstration shows that for this simple allocation procedure the results are the same for all three methods.*

*The uncertainty analysis shows how the smaller entrants uncertainty is disproportionately larger than the larger entrant.*



# Applications: Oil Standard Volume Uncertainty

Oil Standard Volume Uncertainty						
Fluid	Quantity	Name	Unit	Value	Uncertainty	
<b>Conditions</b>	Temperature	Tmix	°F	78.00	1.00	0.00
	Pressure	Pmix	psig	250.00	10.00	0.00
<b>Oil</b>	Gravity	APloil	°API	21.00	0.40	0.00
	Vapour Pressure	Pvap	psig	10.00	2.00	0.0000
<b>Results</b>	Thermal Correction API 11.1	Ctoil	factor	0.992839	0.05%	1.017613
	Pressure correction API 11.2.1	Cploil	factor	1.001028	0.05%	1.000000
	Volume Correction Factor	VCfoil	factor	0.993860		1.017613
	Volume	Qvline	bpd	50,000	0.20%	-
	Standard Volume	Qvstd	stbpd	49,693	0.22%	-

*Demo: Oil Standard Volume Uncertainty*

*API Chpt 11.1 oil thermal correction and API Chpt 11.2.1 oil compressibility correction.*

*Uses MCS to calculate complex correction factors including the method uncertainty.*

# Applications: Gas Density Uncertainty

AGA8 Gas Density						
Line Conditions	Measurement	Uncertainty				Trial Values
Temperature deg C	25.00	0.450				0.00
Pressure bara	18.00	0.755				0.00
Gas Composition	Compostion mol%	Normalised mol%	Component Uncertainty %	Uncertainty mol%	Trials	Normalised Trials
Nitrogen mol%	0.720	0.720	1.00%	0.0072	0.0000	#DIV/0!
Carbon Dioxide mol%	1.360	1.360	1.00%	0.0136	0.0000	#DIV/0!
Methane mol%	85.330	85.330	2.00%	1.7066	0.0000	#DIV/0!
Ethane mol%	6.150	6.150	1.00%	0.0615	0.0000	#DIV/0!
Propane mol%	3.810	3.810	1.00%	0.0381	0.0000	#DIV/0!
n-Butane mol%	2.020	2.020	1.00%	0.0202	0.0000	#DIV/0!
i-Butane mol%	0.000	0.000	1.00%	0.0000	0.0000	#DIV/0!
n-Pentane mol%	0.580	0.580	1.00%	0.0058	0.0000	#DIV/0!
i-Pentane mol%	0.000	0.000	1.00%	0.0000	0.0000	#DIV/0!
n-Hexane mol%	0.030	0.030	1.00%	0.0003	0.0000	#DIV/0!
n-Heptane mol%	0.000	0.000	1.00%	0.0000	0.0000	#DIV/0!
n-Octane mol%	0.000	0.000	0.00%	0.0000	0.0000	#DIV/0!
n-Nonane mol%	0.000	0.000	0.00%	0.0000	0.0000	#DIV/0!
n-Decane mol%	0.000	0.000	0.00%	0.0000	0.0000	#DIV/0!
Total mol%	100.000	100.00			0.00	#DIV/0!
Normalised	True Result	Method Uncertainty	MCS Mean	MCS Uncertainty	Trials with Method	Trials
Line Density Kg/m <sup>3</sup> (AGA8)	14.97	0.10%	14.97	4.44%	#VALUE!	#VALUE!
Standard Density Kg/m <sup>3</sup> (AGA8)	0.8311	0.10%	0.8311	0.34%	#VALUE!	#VALUE!
Line/Standard	18.01		18.01	4.43%	#VALUE!	#VALUE!

*Demo: AGA8 Density Uncertainty*

*Uses MCS to with the AGA8 Equation of State method.*

*Automatically takes account of dependency between inputs due to gas composition normalisation and within AGA8.*

# Generic Uncertainty Model Simulation (GUMS)

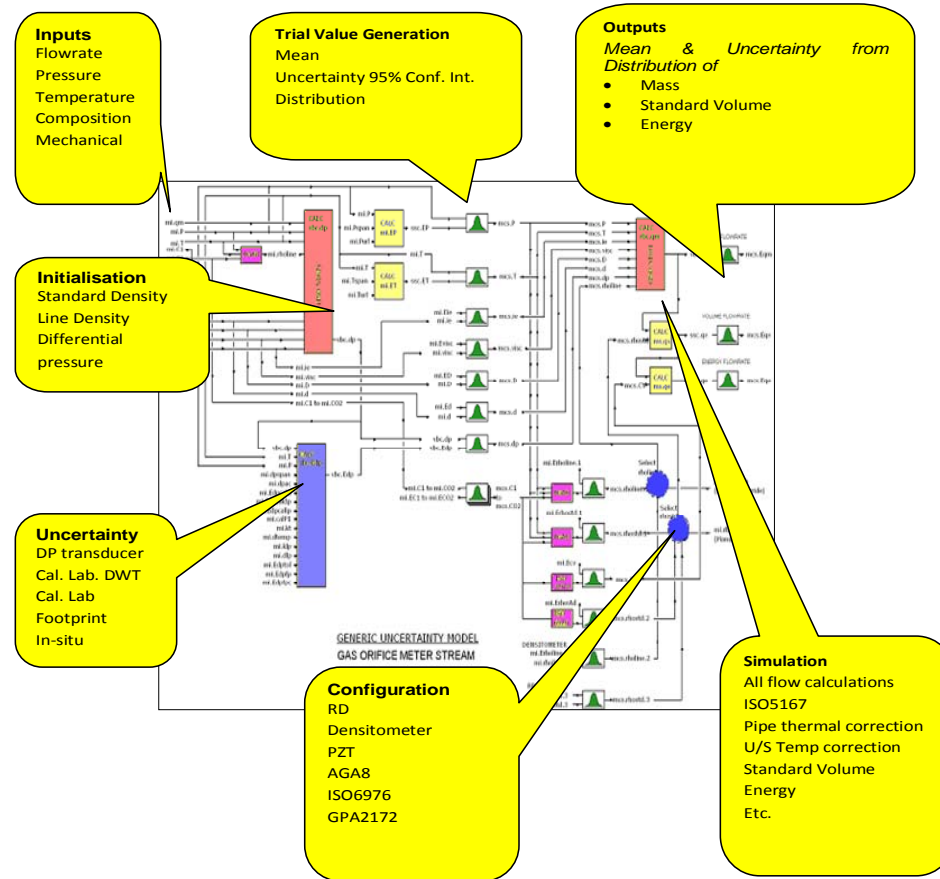
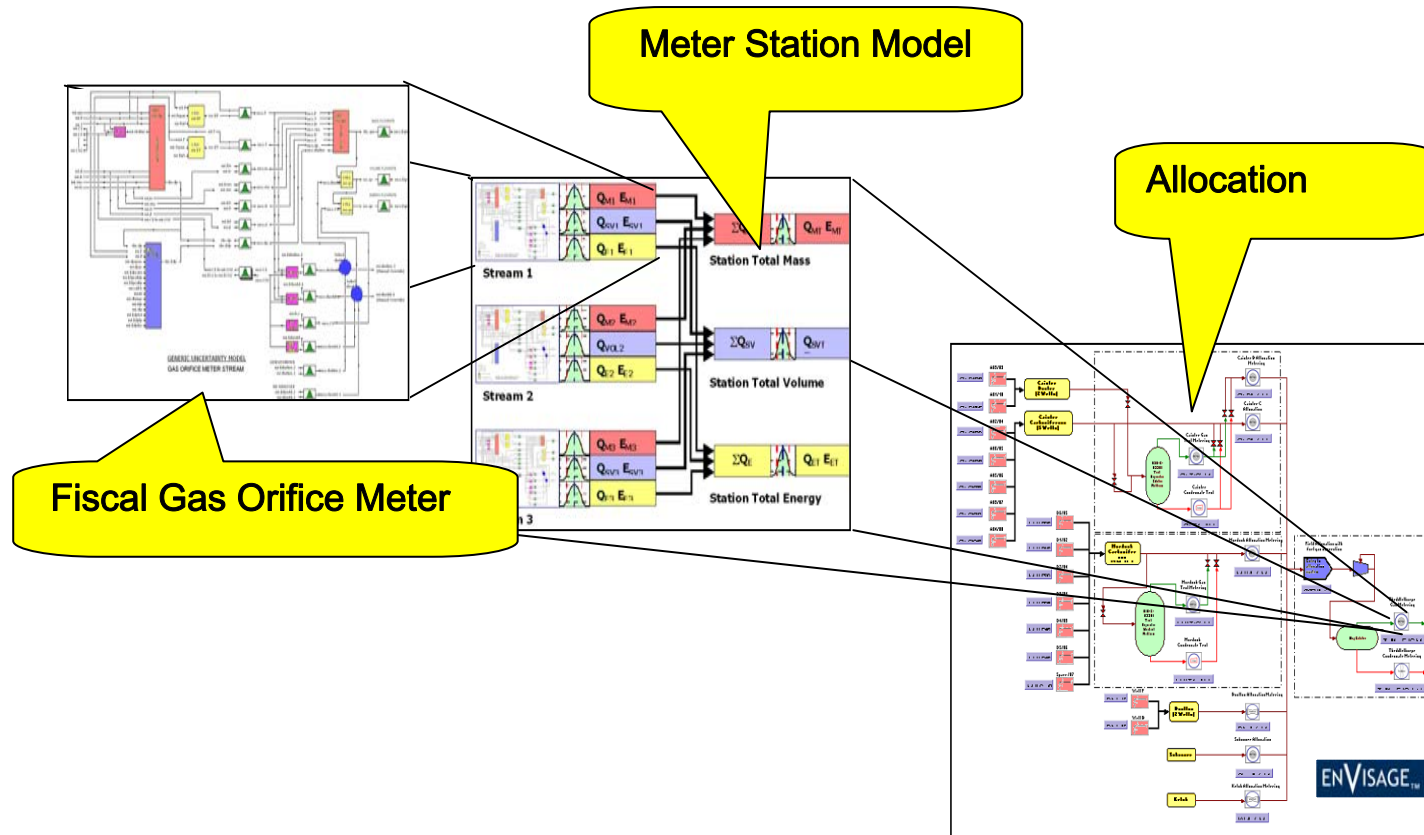


Figure Gas Custody Transfer Meter

# Propagation of Uncertainty with MCS



# Conclusions

- Uncertainty
  - Validated the Central Limit Theorem with MCS.
  - Showed that non-linearity of a function can lead to bias.
- Combination of Uncertainties
  - Compared RSS and MCS in “How long is a piece of string” and got the same results which also confirmed the validity of the  $\sqrt{3}$  CF for uniform distributions.
  - Demonstrated with the “Pipeline Allocation Uncertainty” that both RSS and the MCS methods all give the same result.
  - Showed how the Custody Transfer meter uncertainty is not a good indication of the final allocation uncertainty such that every case must be looked at in case there is excessive uncertainty exposure due to allocation.
- Applications
  - Demonstrated how complex methods can be correctly dealt with by MCS and that dependency between inputs within the method is correctly handled.
  - Showed how uncertainty distributions can be propagated indefinitely through all stages of allocation and data processing.

Thank you for listening

Questions?