

QbD in Analytical Method Development: The Analytical Method Lifecycle

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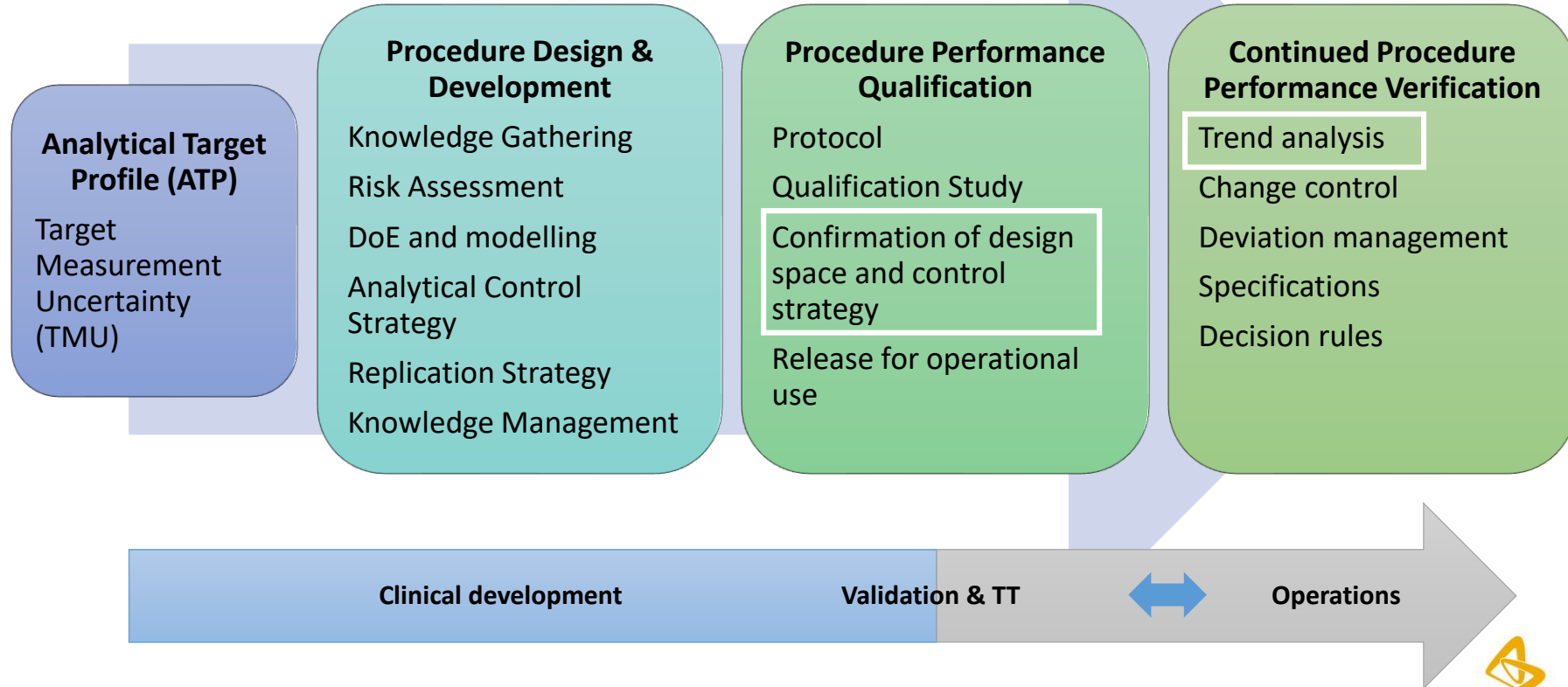
With acknowledgement to, Sophie Bailes, Claire Elliot and Aled Williams

Background

- About me:
 - Principal Scientist, Statistics, AstraZeneca
 - Worked with ICI, Zeneca, AstraZeneca for 30 years
 - Variety of delivery and leadership roles in Drug Discovery, Operations, Pharmaceutical Development
- Analytical methods in Product and Chemical Development:
 - Develop chemical routes of manufacture drug substance (active ingredient)
 - Develop formulation of drug product
 - Strive for stable, robust and reproducible products and manufacturing processes
 - *Equally applies to analytical methods*



Key aspects of Analytical Method Lifecycle



Agenda

Illustration of the significance of analytical variability

Robust analytical methods – timely application of Design of Experiments

- Effective DoE workflow

- Case study

Monitor method quality through lifecycle

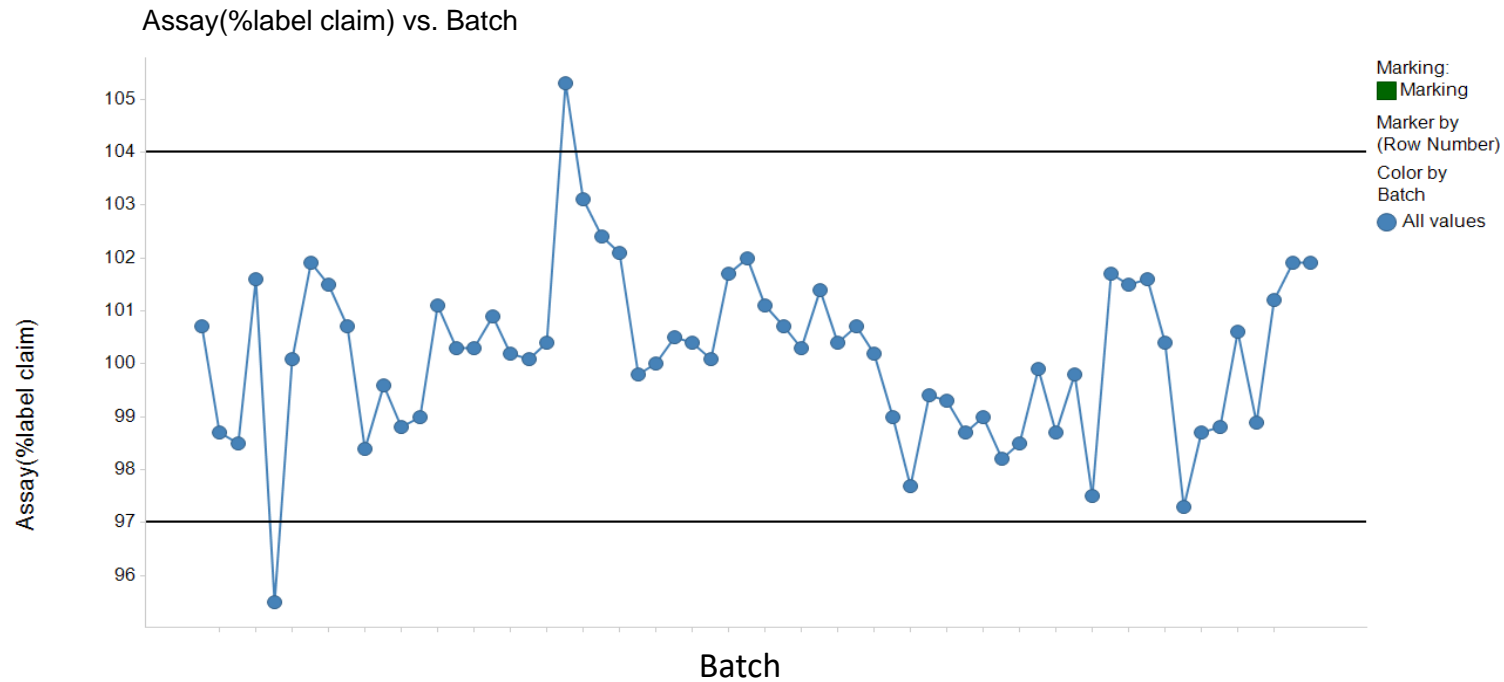
- Why continuous monitoring?

- Approaches to estimating method uncertainty

- Case study

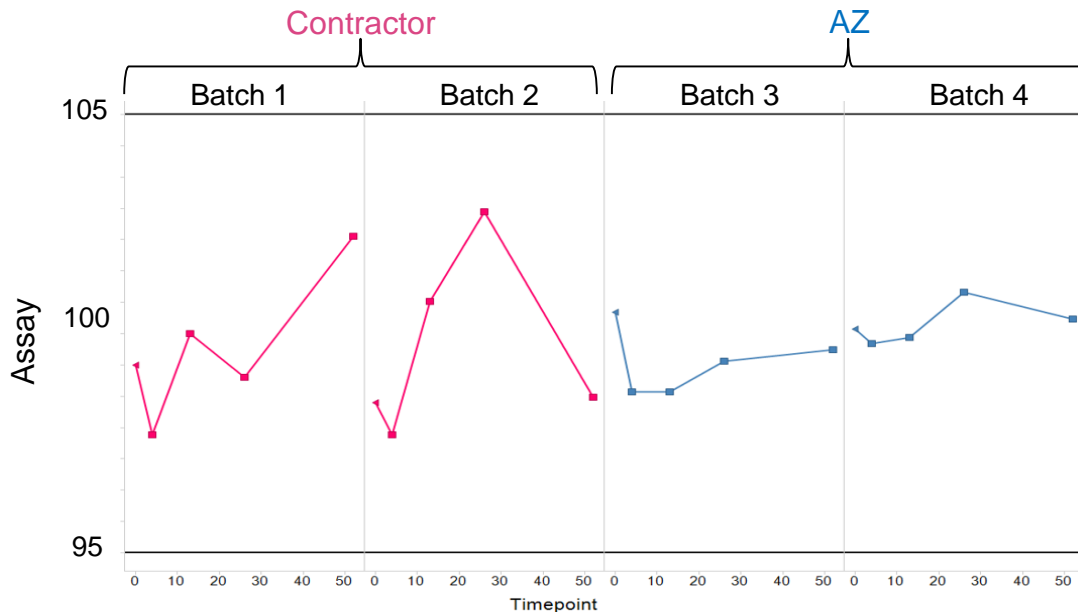


Example



Contribution of Analytical Variability

Example: Stability Data



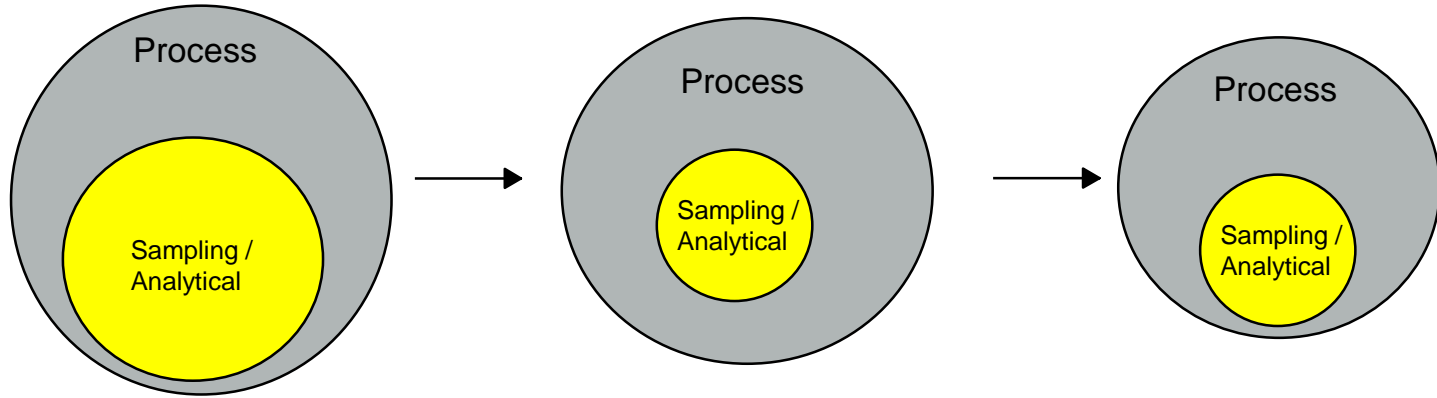
- Contractor more variable than AZ
- Analysis methodology diverged through development
 - Smaller extraction volume used at CMO resulted in poor solubilisation and dispersion.
 - Therefore incomplete extraction and more variability in results.

General Comments / Learning:

- Manufacturing variability comprises different components
- High analytical variability can...
 - ...lead to misleading conclusions about product quality
 - ...mask desired improvement to processes.



Components of Variability



Variance is proportional to area of circle with radius equal to standard deviation

Total variance = analytical variation + sampling variation + process variation = $A + S + P$

If analytical variation + sampling variation is high then this will obscure any change made to the manufacturing process.



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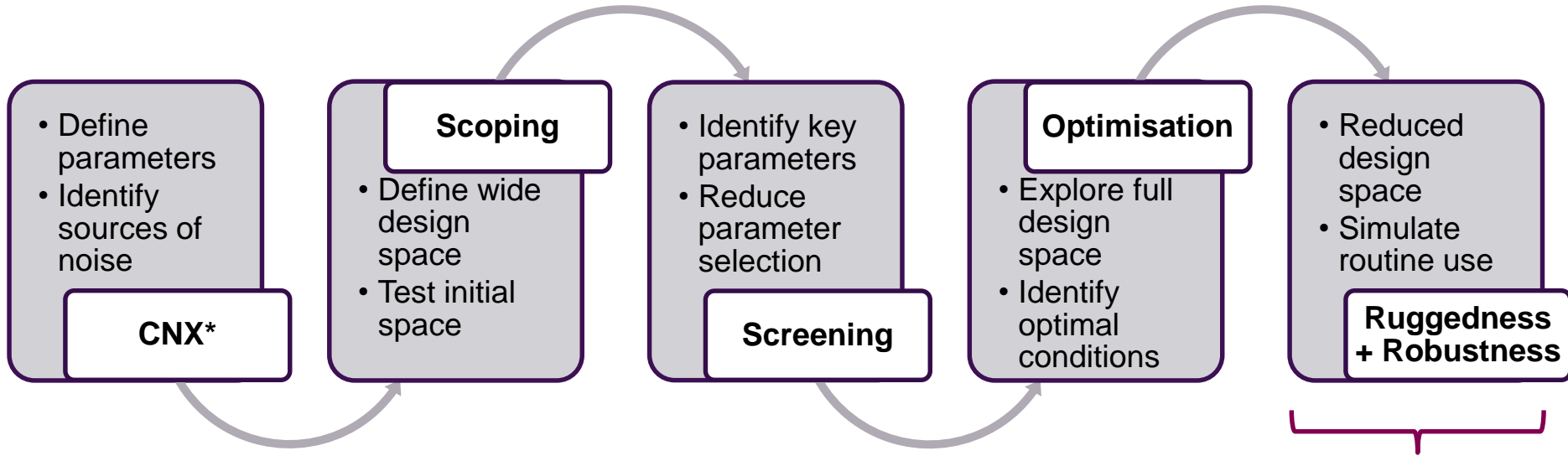
Why continuous monitoring?

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Design of Experiments (DoE) Workflow



* Parameter classification:
Control / Nuisance / eXperimental

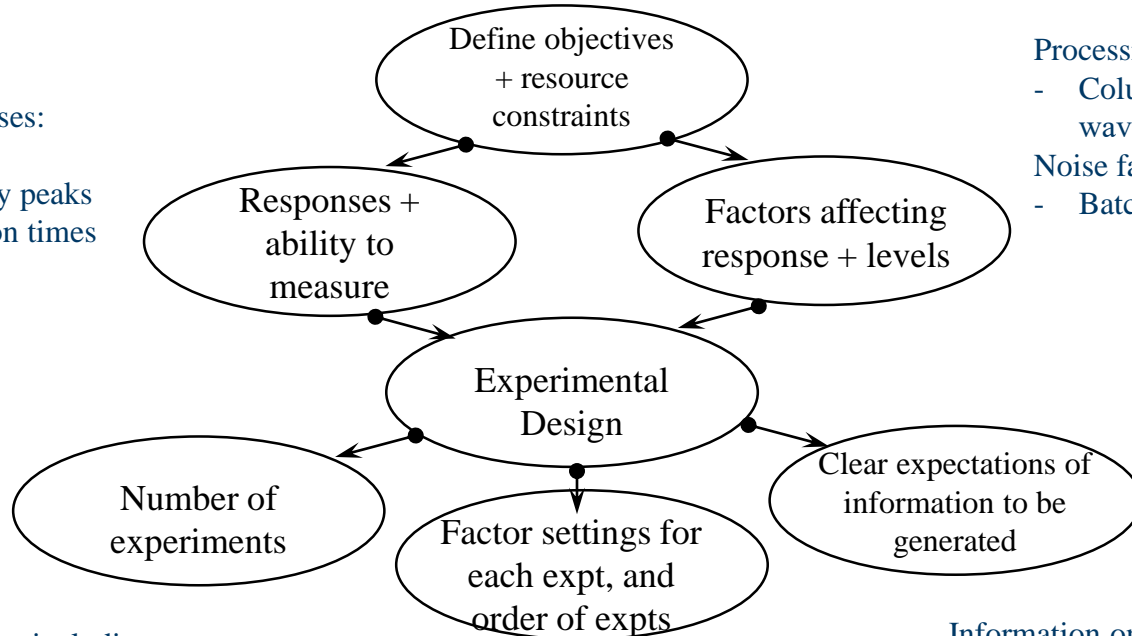
Case study
examples



Design of Experiments (DoE) Workflow

“To identify optimum conditions for an HPLC method and demonstrate robustness around these conditions.”

Key responses:
Resolution
between key peaks
and retention times



Processing factors:

- Column temp, detector wavelength, buffer, ...

Noise factors:

- Batch of column, operator, day

19 experiments including
3 centre points

Experiments in blocks to
account for day-to-day
variation.

Information on individual
factor effects / interactions.



Blocking Example – Head Space GC DoE

- Generic headspace method
- 5 runs per day
- Centre point condition run on each day
- All factors balanced within each day
- Runs randomised within day
- Eliminate risk of bias between days

Day	Run	Equil Temp(deg C)	Equil Time(mins)	Loop/Valve Temp(deg C)	Transfer Line Temp(deg C)	Vial Equil Time(mins)	Injection Time(secs)	Shaking(mins)
Day 1	1	75	30	170	185	30	30	3
Day 1	2	65	33	180	175	27	33	5
Day 1	3	85	27	160	195	33	27	1
Day 1	4	85	27	160	175	33	33	5
Day 1	5	65	33	180	195	27	27	1
Day 2	6	85	33	160	195	27	33	1
Day 2	7	75	30	170	185	30	30	3
Day 2	8	65	27	180	195	33	33	1
Day 2	9	85	33	160	175	27	27	5
Day 2	10	65	27	180	175	33	27	5
Day 3	11	75	30	170	185	30	30	3
Day 3	12	85	27	180	195	27	27	5
Day 3	13	65	33	160	175	33	33	1
Day 3	14	65	33	160	195	33	27	5
Day 3	15	85	27	180	175	27	33	1
Day 4	16	85	33	180	195	33	33	5
Day 4	17	85	33	180	175	33	27	1
Day 4	18	65	27	160	175	27	27	1
Day 4	19	75	30	170	185	30	30	3
Day 4	20	65	27	160	195	27	33	5

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Parameters

Ruggedness			
iSET as 1100	Column 1	1290 (no iSET)	Column 1
	Column 2		Column 2

Robustness	Low Point	Mid Point	High Point	Adj \pm
Buffer Concentration (mM)	16	20	24	20%
Flow rate (ml/min)	0.4	0.5	0.6	0.1 mL/min
Temp ($^{\circ}$ C)	40	45	50	10%
Wavelength (nm)	277	280	283	3 nm
Gradient end time (min)	8.1	9	9.9	10%
	11.25	12.5	13.75	10%
	16.2	18	19.8	10%
	20.25	22.5	24.75	10%
% B (isocratic hold)	21.33	23.7	26.07	10%



Statistical Design Approach

- *Ruggedness* is the degree of reproducibility of results at set point conditions under typical variability of laboratories, instruments, analysts, etc, i.e. noise factors.

- *Robustness* is the capacity of the method to remain unaffected by small changes to set point conditions e.g. flow rate, column temperature, etc.


Column	Instrument	TFA content Mobile Phase (%)	Flow rate (ml/min)	Temp (°C)	Wavelength (nm)	Gradient Time (min)
1	1	M	M	M	M	M
1	2	M	M	M	M	M
2	1	M	M	M	M	M
2	2	M	M	M	M	M

Ruggedness

1	1	L	H	L	H	H
1	1	L	L	L	L	L
1	1	H	H	H	L	L
1	1	H	L	H	H	H
1	2	L	H	H	L	H
1	2	H	H	L	H	L
1	2	L	L	H	H	L
1	2	H	L	L	L	H
2	1	H	L	L	H	L
2	1	L	H	H	H	L
2	1	L	L	H	L	H
2	1	H	H	L	L	H
2	2	L	H	L	L	L
2	2	H	L	H	L	L
2	2	L	L	L	H	H
2	2	H	H	H	H	H

Robustness

1	1	M	M	M	M	M
1	2	M	M	M	M	M
2	1	M	M	M	M	M
2	2	M	M	M	M	M

Ruggedness
(repeatability / sample stability) 

Ruggedness and Robustness Process

1) Program system with 24 methods

Run Number	Column	Instrument	mMNH4	Flow rate (ml/min)	Temp (°C)	Wavelength (nm)	Gradient time (min)
1	A	Ins_1290	12	0.6	50	244	15
2	A	Ins_1100	12	0.6	50	244	15
3	B	Ins_1290	12	0.6	50	244	15
4	B	Ins_1100	12	0.6	50	244	15
5	A	Ins_1290	3.6	0.7	45	247	16.5
6	A	Ins_1290	3.6	0.5	45	241	13.5
7	A	Ins_1290	14.4	0.7	55	241	13.5
8	A	Ins_1290	14.4	0.5	55	247	16.5
9	A	Ins_1100	3.6	0.7	55	241	16.5
10	A	Ins_1100	14.4	0.7	45	247	13.5
11	A	Ins_1100	3.6	0.5	55	247	13.5
12	A	Ins_1100	14.4	0.5	45	241	16.5
13	B	Ins_1290	14.4	0.5	45	247	13.5
14	B	Ins_1290	3.6	0.7	55	247	13.5
15	B	Ins_1290	3.6	0.5	55	241	16.5
16	B	Ins_1290	14.4	0.7	45	241	16.5
17	B	Ins_1100	3.6	0.7	45	241	13.5
18	B	Ins_1100	14.4	0.5	55	241	13.5
19	B	Ins_1100	3.6	0.5	45	247	16.5
20	B	Ins_1100	14.4	0.7	55	247	16.5
21	A	Ins_1290	12	0.6	50	244	15
22	A	Ins_1100	12	0.6	50	244	15
23	B	Ins_1290	12	0.6	50	244	15
24	B	Ins_1100	12	0.6	50	244	15

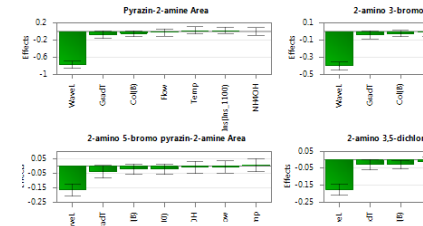
2) Run methods



3) Process results and add data into spreadsheet

Run Number	Column	Instrument	mMNH4	Flow rate (ml/min)	Temp (°C)	Wavelength (nm)	Gradient time (min)	Area1	Area2	Area3	Area4	Area5	Area6	Area7	Area8	Area9	Area10	Area11	Area12	Area13	Area14	Area15	Area16	Area17	Area18	Area19	Area20	Area21	Area22	Area23	Area24					
1	A	Ins_1290	12	0.6	50	244	15	0.017	7.92	1.20	7.13	10000.00	1.00	2.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00	1.00				
2	A	Ins_1100	12	0.6	50	244	15	0.177	7.89	1.28	0.89	7.89	10000.00	1.00	3.05	1.11	1.14	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05			
3	B	Ins_1290	12	0.6	50	244	15	0.177	7.94	1.28	0.89	7.84	10000.00	1.00	2.90	1.27	1.15	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05		
4	B	Ins_1100	12	0.6	50	244	15	0.177	7.28	1.27	0.89	7.18	10000.00	1.00	3.12	1.38	1.08	1.05	1.11	1.08	1.10	1.11	1.08	1.10	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09		
5	A	Ins_1290	3.6	0.7	45	247	16.5	0.247	8.50	1.26	1.40	7.20	10000.00	1.00	3.04	1.09	0.99	1.00	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04		
6	A	Ins_1290	3.6	0.5	45	241	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04		
7	A	Ins_1290	14.4	0.7	55	241	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04		
8	A	Ins_1290	14.4	0.5	55	247	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04		
9	A	Ins_1100	3.6	0.7	55	241	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	
10	A	Ins_1100	14.4	0.7	45	247	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	
11	A	Ins_1100	3.6	0.5	55	247	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	
12	A	Ins_1100	14.4	0.5	45	241	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	
13	B	Ins_1290	14.4	0.5	45	247	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	
14	B	Ins_1290	3.6	0.7	55	247	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
15	B	Ins_1290	3.6	0.5	55	241	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
16	B	Ins_1290	14.4	0.7	45	241	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
17	B	Ins_1100	3.6	0.7	45	241	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
18	B	Ins_1100	14.4	0.5	55	241	13.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
19	B	Ins_1100	3.6	0.5	45	247	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
20	B	Ins_1100	14.4	0.7	55	247	16.5	0.247	8.15	0.79	1.22	1.01	10000.00	1.00	2.85	1.11	1.11	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04
21	A	Ins_1290	12	0.6	50	244	15	0.177	7.89	1.28	0.89	7.89	10000.00	1.00	3.05	1.11	1.14	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	
22	A	Ins_1100	12	0.6	50	244	15	0.177	7.94	1.28	0.89	7.84	10000.00	1.00	2.90	1.27	1.15	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05	1.05
23	B	Ins_1290	12	0.6	50	244	15	0.177	7.28	1.27	0.89	7.18	10000.00	1.00	3.12	1.38	1.08	1.05	1.11	1.08	1.10	1.11	1.08	1.10	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09	1.09	
24	B	Ins_1100	12	0.6	50	244	15	0.177	7.92	1.20	0.89	7.13	10000.00	1.00	3.04	1.09	0.99	1.00	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04	1.04

4) Statistical analysis



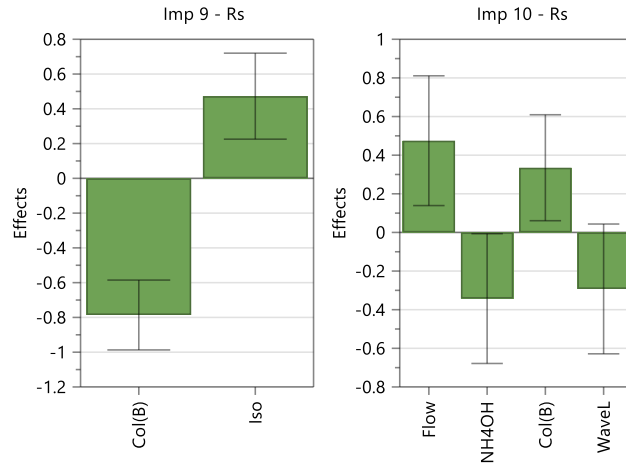
5) Interpret stats data and assess method risks. Identify suitable SST criteria.

		Impact		
		Low	Medium	High
Probability	High	low	medium	high
	Medium	low	medium	medium
	Low	low	low	low

6) Update method if necessary and repeat using updated conditions

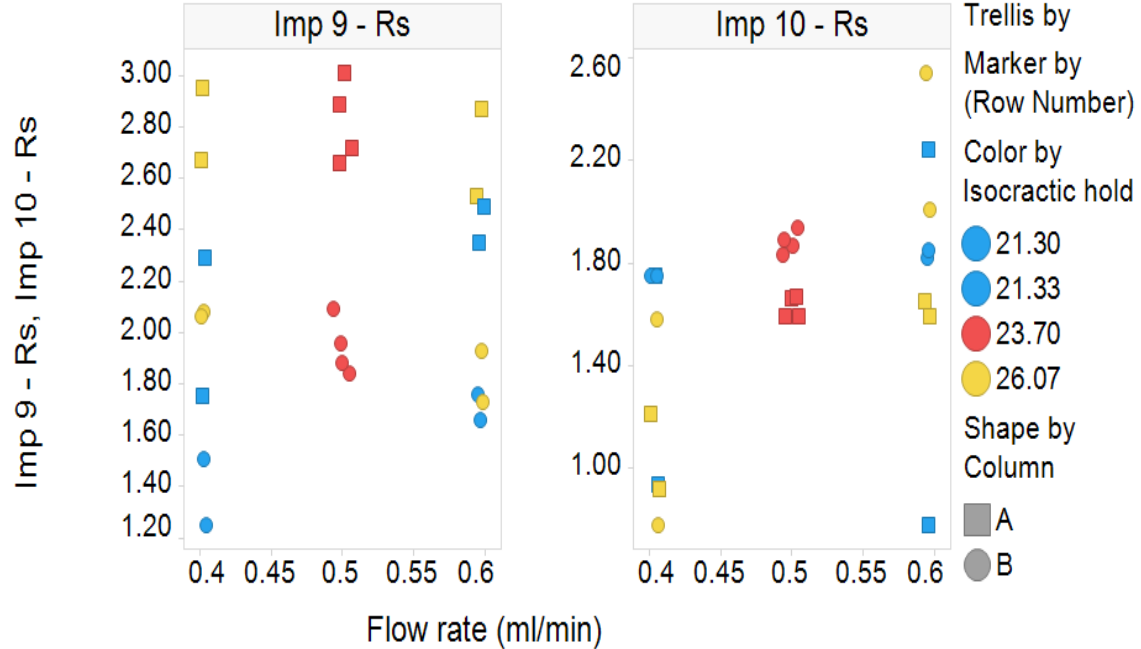
Case Study 1

Important factors identified affecting resolution:



Raw data plot:

Imp 9 - Rs, Imp 10 - Rs vs. Flow rate (ml/min)



Case Study 1 - Risk assessment

Improved understanding of parameters affecting assay and organic impurities method has led to appropriate SST controls and confidence in the method to safely transfer to new site.

Results & Impact

% Areas – Wavelength has the biggest effect on % area, however practically the difference observed is minimal.

Resolution – Three variables (flow, %B at isocratic hold and column) were found to impact the resolution of impurities 8, 9 and 10. Therefore resolution criteria have been included for these impurities in the method SST to mitigate the risk of impurity co-elution.

Relative Retention Time - Flow was found to impact the RRT of both the impurities and main component. To ensure that components are correctly identified by RRT during routine analysis the SST should incorporate those impurities affected.

Variable	%Area	Resolution	RRT
Wavelength (+/- 3nm)	Green	Green	Green
Column	Green	Orange	Green
Flow (+/-0.1mL/min)	Green	Orange	Orange
ISet (1100 or 1200)	Green	Green	Green
%B at isocratic (+/- 10%)	Green	Orange	Orange
Ammonium hydroxide (+/- 2mM)	Green	Green	Green
Temperature (+/-5C)	Green	Green	Green

Green	Low risk
Orange	Requires SST control



Design of Experiments – Key Points

- Apply structured approach to experimental planning
 - Best practice workflow
 - Able to meet specific objectives
 - Good use of randomisation and blocking
 - Overall approach a) leads to high quality data and decisions, b) is efficient
- Timely application of DoE – commercial late-stage vs application much earlier
- Important collaboration between the statistics group, separation science group and the project team
- Workshops given to scientists



Agenda

Illustration of the significance of analytical variability

Robust analytical methods – timely application of Design of Experiments

- Effective DoE workflow

- Case study

Monitor method quality through lifecycle

- Why continuous monitoring?

- Approaches to estimating method uncertainty

- Case study



Why do we need continued verification?

The goal:

- Ruggedness and Robustness (through DoE) helps us understand how our method performs initially,
- Now we must ensure (**verify**) that it continues to perform.

How?

- Collect **relevant data** indicating performance during routine use.
- **Trend** and compare to validation criteria and Analytical Target Profile (ATP).
- Act on signals – identify **unusual behaviour** to drive improvement before Out-of-Specification or poor performance.
- Continuously **improve**. Use results to set future ATP and validation criteria.



Trending analytical performance

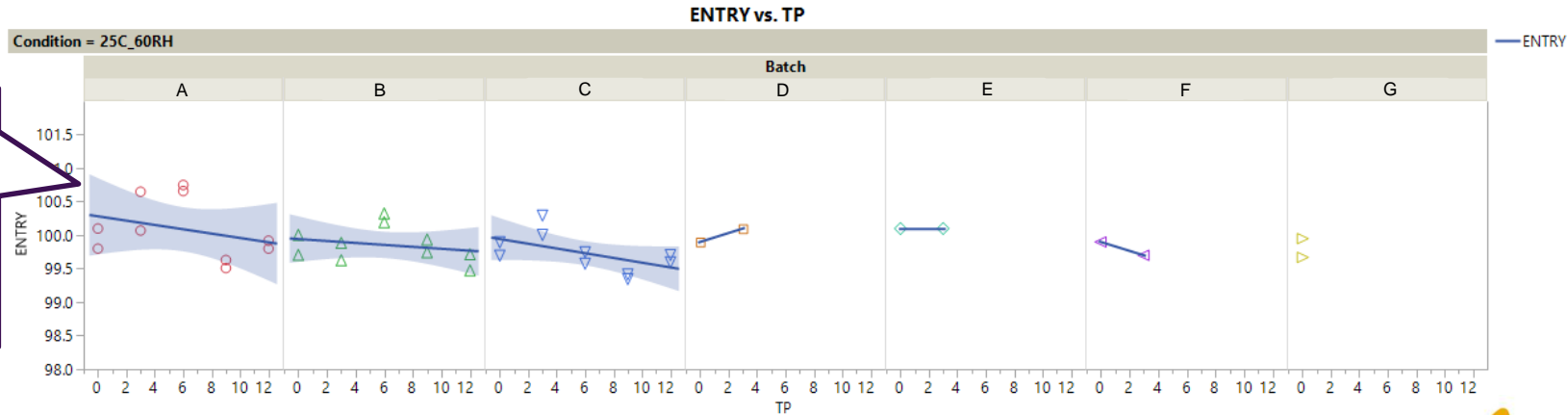
Where can we find estimates of our method performance during routine use?

- Intermediate precision
 - From validation, and gives us our first datapoint.
- Analytical Tech Transfers
 - Next data point when transferred to operations
- Duplicate/replicate testing
 - For many tests, at least 2 samples are analysed. Often more. The standard deviation of these can indicate variability.
- Stability Testing
 - Same batch analysed over many timepoints, often in duplicate.
 - More on next slide...
- Any further studies/transfers, partial revalidation, precision studies, etc.



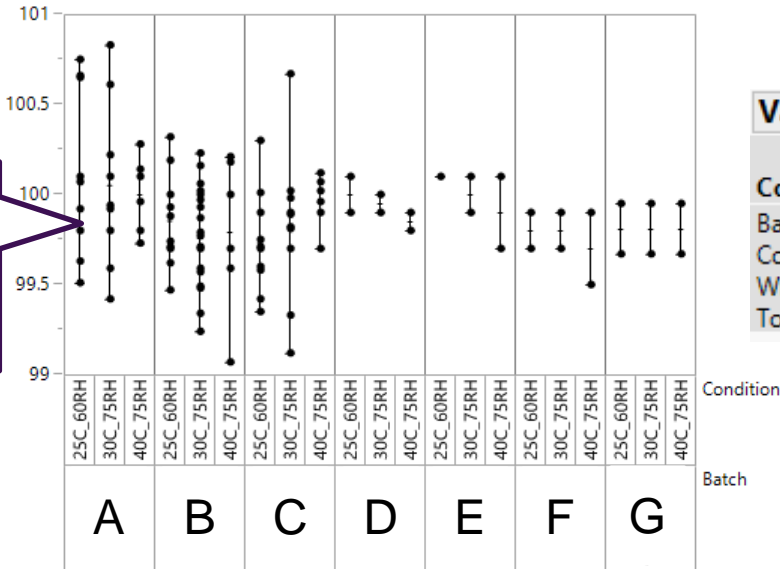
Estimating uncertainty from stability data

- What if we don't do replicate preparations? How do we estimate the error in our single measurement?
- Stability data can be pooled to look at method variability:
 - Fit a trend (if more than 3 time points and a significant one exists)
 - Residuals about that line can indicate method error



Estimating uncertainty from stability data

- Using either residuals from fitted line, or raw data, can pool data to decouple batch-to-batch variation



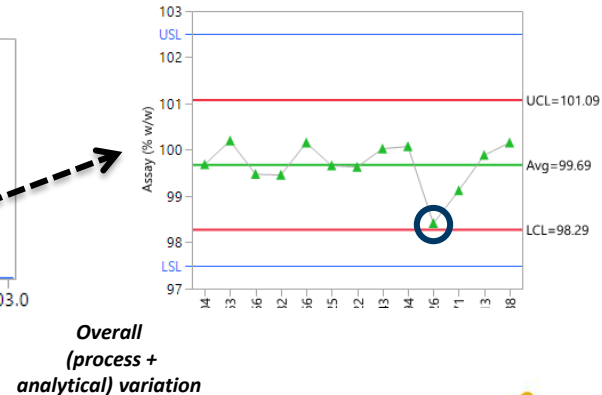
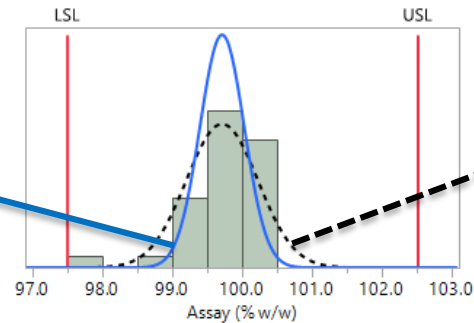
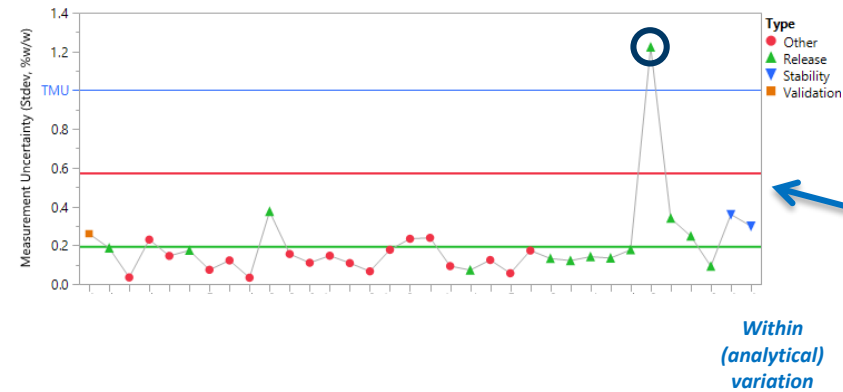
Variance Components				
Component	Var	% of Total	20 40 60 80	Sqrt(Var Comp)
Batch	0.00576522	5.9		0.07593
Condition[Batch]	0.00281193	2.9		0.05303
Within	0.08960931	91.3		0.29935
Total	0.09818646	100.0		0.31335

“Within” variance is what’s left after taking out condition and batch = analytical error



Trending

- So we have some estimates of uncertainty from stability and duplication... what now?
 - Trend against “Target Measurement Uncertainty” (e.g. set as per Analytical Target Profile, or a validation criteria of <1% Relative Standard Deviation)
 - Compare to trend of overall process (e.g. Assay)
 - Decouple analytical and process variance



EXAMPLE

Drug Substance (Assay – Water Free Basis)

97.5 to 102.5% w/w

API @ SiteName

Total capability stats

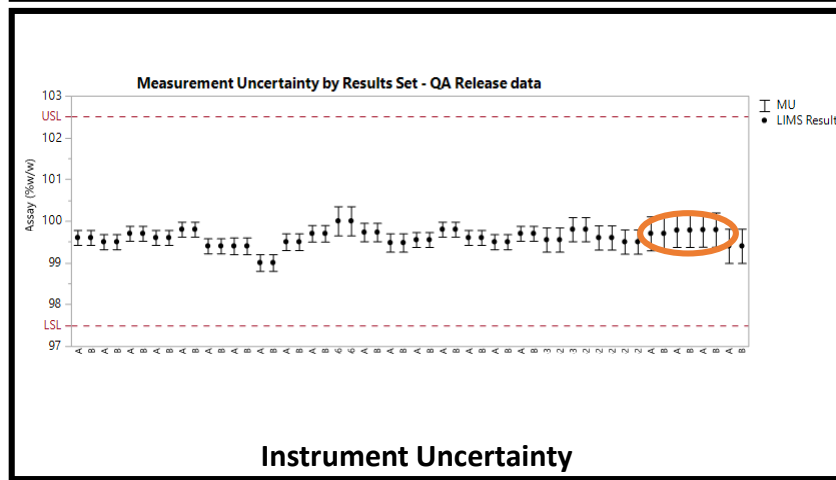
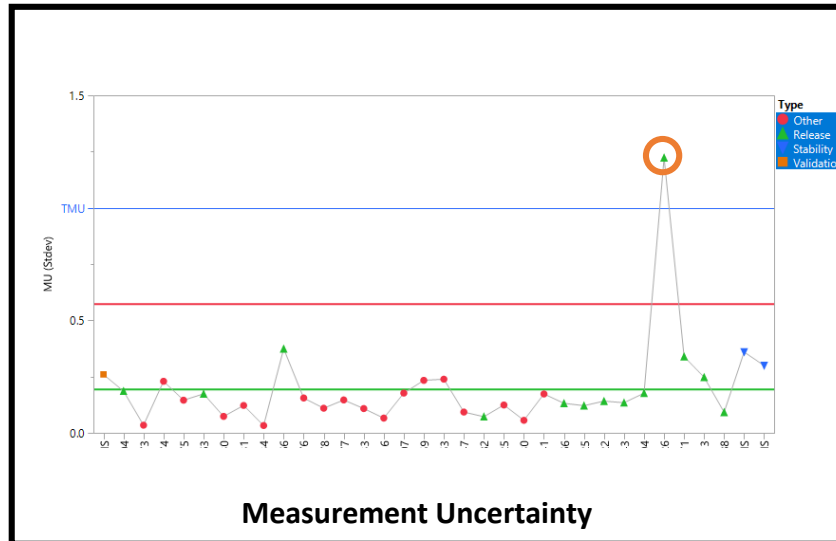
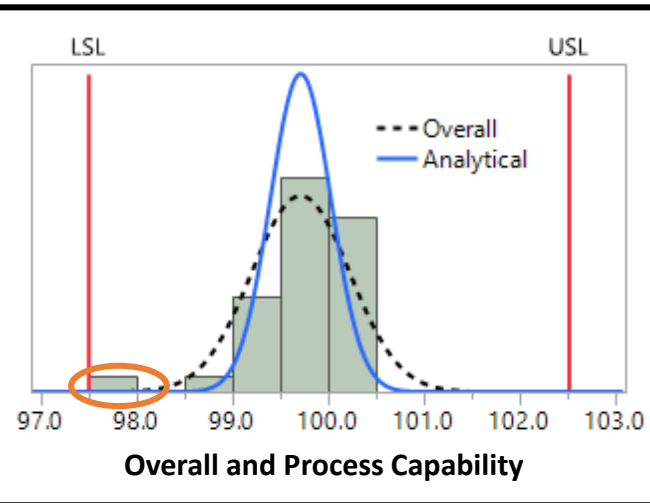
E.g.

Ppk	Predicted OOS	Actual OOS
1.4	0%	0%

Analytical stats

E.g.


Cpk	Average MU	Number of MU>TMU	Analytical Deviations
2.3	0.196	1	0



Instrument Uncertainty

Conclusions

- Starting with method definition – Analytical Target Profile
- Develop method
- Demonstrate robustness and ruggedness
- Continual verification of method performance



Use statistical tools, e.g.
Design of Experiments,
variability analysis,
control charts