

**Tools to Calculate and Evaluate Measurement Performance**

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**Objective**

- Review methods for calculation and evaluation of measurement performance
- Topics
  - common terms for data quality indicators
  - assess measurement performance within batches, between batches and for reported results
  - formulas and calculations used
  - methods for evaluating data quality indicators
- Calculate and evaluate data

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**Agenda**

- Data Quality Indicators (DQI)
  - What are DQI's
- Calculations
  - Methods of Calculation
- Evaluations
  - Methods of Evaluation
- Questions/Answers
  - Summary, Evaluation Forms

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### What are DQI's?

- Precision
- Bias
- Accuracy
- Representativeness
- Comparability
- Completeness
- Sensitivity

*Ways of monitoring and expressing measurement imperfections*

EPA QA/G-5 2002

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### Measurement Imperfections

- Random Effects (Precision)
  - Analyst
  - Environmental factors
  - Short term fluctuations
- Systematic Effects (Bias/Accuracy)
  - Calibration drifts
  - Personal bias in reading instrument
  - Uncertainty value of a reference standard
- Blunders (OOPs)
  - Quality system
    - Quality assurance
    - Quality control

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### Precision

- The measure of agreement among repeated measurements of the same property under identical, or substantially, similar conditions; calculated as either the range or as the standard deviation
- May also be expressed as a percentage of the mean of the measurements, such as relative range or relative standard deviation (coefficient of variation)

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### Precision

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- Use the same analytical instrument to make repeated analyses on the same sample. (*Instrument Duplicate*)
- Use the same method to make repeated measurements of the same sample within a single laboratory (*Lab Duplicate*) or have two or more laboratories analyze identical samples with the same method. (*Split Sample*)
- Split a sample in the field and submit both for sample handling, preservation and storage, and analytical measurements. (*Field Duplicate*)
- Collect, process, and analyze collocated samples for information on sample acquisition, handling, shipping, storage, preparation, and analytical processes and measurements. (*Collocated Sample*)

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### Bias

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- The systematic or persistent distortion of a measurement process that causes errors in one direction.
- Use reference materials for method performance by lab operations
- Use spiked matrix samples for method performance in sample

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### Accuracy

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- Measure of the overall agreement of a measurement to a known value; includes a combination of random error (precision) and systematic error (bias) components of both sampling and analytical operations.
- Analyze a reference material or reanalyze a sample to which a material of known concentration or amount of pollutant has been added.
- Usually expressed either as percent recovery or as a percent bias.

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### Representativeness

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- Qualitative term that expresses the degree to which data accurately and precisely represent a characteristic of a population, parameter variations at a sampling point, a process condition, or an environmental condition.
- Evaluate whether measurements are made and physical samples collected in such a manner that the resulting data appropriately reflect the environment or condition being measured or studied.

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### Comparability

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- Qualitative term that expresses the measure of confidence that one data set can be compared to another and can be combined for the decision(s).
- Compare sample collection and handling methods, sample preparation and analytical procedures, holding times, stability issues, and QA protocols.
- Not calculated

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### Completeness

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- Measure of the amount of valid data needed to be obtained from a measurement system.
- Compare the number of valid measurements completed (samples collected or samples analyzed) with those established by the project's quality criteria (performance/ acceptance criteria).
- Expressed as percentage.

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### Sensitivity

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- Capability of a method or instrument to discriminate between measurement responses representing different levels of the variable of interest.
- Determine the minimum concentration or attribute that can be measured by a method (**detection limit**), by an instrument (**instrument detection limit**), or by a laboratory (**quantitation limit**).
- Compare the appropriate limit to the action level established during project planning.

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### Laboratory Performance

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- Contamination Monitors
  - Blanks
- Response Monitors
  - Control Samples
  - Limit of Detection
  - Limit of Quantitation
  - Critical Value
- Other
  - Repeatability
  - Reproducibility
  - Uncertainty



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### Blanks

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- Types
  - Method
  - Reagent
  - Instrument
- Calculations
  - Depends on Technology
  - Method
  - Manufacturer's Program

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**Control Samples**

- LCS, LOD, LOQ, CV
- MS, MSD
- Surrogates
- Internal Standards
- External Standards
- Second Source
- Technology specific control samples

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**Other**

- Repeatability (Precision)
  - Same person, instrument, sample, lab, etc
  - Different person, instrument, sample, lab, etc.
- Reproducibility (Bias/Accuracy)
  - Same person, instrument, sample, lab, etc
  - Different person, instrument, sample, lab, etc.
  - Same true value - National standard (?)

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**Sources of Imprecision**

- Instrumental instability
- Environmental fluctuations
- Operator skill
- Reagent control
- Variability of blank, sample
- Variable contamination, losses
- Faulty technique
- Maintenance of tolerances

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### Sources of Bias

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- Calibration
- Operator bias
- Uncorrected blank
- Inefficiencies or losses
- Tolerances adjustments
- Interference resolution
- Contamination gains
- Instrumental shifts
- Matrix effects
- Theoretical

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### Random Effects

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$$s(\bar{q}) = \frac{s(q_k)}{\sqrt{n}}$$

**Standard Deviation- mean**

$$u(x_i) = s(\bar{q})$$

**Standard Uncertainty**

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### Adding Imperfections

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- Combining Standard Uncertainties
- Must be in terms of the measured quantity
  - assume linear summation
  - assume uncorrelated input quantities
  - sensitivity coefficient =  $1 = (c_i) = \frac{\partial f}{\partial x}$ 
    - (partial derivative)

$$u_i(y) = c_i u(x_i)$$


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### Combined Components

- Square root of the sum of the squares of the separate standard uncertainty components (Root sum square method)
  - Must all be in same units
  - Often done using relative standard uncertainty values
- Combined uncertainty \* coverage factor = Expanded Uncertainty
- Coverage factor = 2 for 95% confidence level

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### Combined Standard Uncertainty

$$u_c(y) = \sqrt{\sum_{i=1}^N u_i^2(y)}$$

(y) = estimate of the measurand Y, output estimate

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### Expanded Uncertainty

$$U = k u_c(y)$$

$u_c(y)$  = Combined Standard Uncertainty

$k$  = Coverage Factor

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### Estimation of Uncertainty

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$$\bar{X} \pm U \text{ 95\% confidence level, } k=2$$

Where,  
 $\bar{X}$  = the mean of  $n$  measurements  
 $U$  = the uncertainty  
 $k$  = the coverage factor for a confidence level of approximately 95%

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### Uncertainty Procedure

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- Specify the measurand
- Determine measurement conditions
- Identify Uncertainty sources
- Consolidate Uncertainty components
- Quantify Uncertainty components
- Convert components to Standard Uncertainty
- Calculate Combined Uncertainty and Expanded Uncertainty

[www.a2la.org](http://www.a2la.org)  
[www.navylabs.navy.mil](http://www.navylabs.navy.mil)

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### Methods of Calculation

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- Precision
- Bias/Accuracy
- Demonstration of Capability
- Detection Limits
- Control Limits



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### Precision

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- Range  $\bar{R} = \frac{R_1 + R_2 + \dots + R_n}{n}$
- Standard Deviation  $s = \sqrt{\frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n-1}}$ 
  - $x = \text{each value}$
  - $\bar{x} = \text{mean of values}$
  - $n = \# \text{ of values}$

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### Precision

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- Relative Standard Deviation  $RSD = 100 * \frac{\sqrt{\frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n-1}}}{\bar{x}}$  %RSD
- Coefficient of Variation  $CV = \frac{\sqrt{\frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n-1}}}{\bar{x}}$

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### Let's Practice

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? =  $\sqrt{\frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n-1}}$

? =  $\frac{|x_1 - x_2|}{\frac{(x_1 + x_2)}{2}} * 100$



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### Bias/Accuracy

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- Percent Recovery or Percent Bias

$$\%R = \frac{|x_1 - x_T|}{x_T} * 100$$

*x<sub>1</sub>* = Measured value  
*x<sub>T</sub>* = Known value

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### Demonstration of Capability

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- QC Sample Outside Source
- Four aliquots
  - concentration 1-4 times the LOQ
- Same day or over several days
- All results to be used
- Compare mean recovery and standard deviation to method or lab acceptance criteria to evaluate performance

Appendix C NELAC 2003

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### LOD

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- MDL - 40CFR 136 or Lab Defined
- Verification required if results reported to LOD
  - Initial and Annual
  - All steps of method
  - 2-3 times the reported LOD - must be measured
  - Each instrument

Appendix C NELAC 2003

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### LOQ

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- Reporting Limit or Quantitation Limit
  - Lab procedure defines how LOQ determined
  - Reporting results only to LOQ
  - Must have procedure to define relation of LOD with LOQ
  - Confirm validity (Annual if not done for LOD)
    - Spike 1-2 times claimed LOQ
    - Recovery must be within method or client or lab acceptance criteria

Appendix C NELAC 2003

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### Critical Value

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- Critical Value (Lc): the statistically estimated measured value of a substance that has less than a 1% probability of being exceeded in a method blank.
- False Negative Quality Sample (FNQS): a low level laboratory control QC sample (LCS) used to establish the recovery and reliability of a measurement near the detection limit. The concentration of the FNQS is set at 2-5 times Lc but preferably no more than 2 times the regulatory reporting limit, if one exists.

Rev 8, March 25, 2007  
FACA website

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### Critical Value

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- FNQS Recovery: percent recovery of the FNQS result calculated as  $100 * (\text{Measured Value}) / (\text{True Value})$  and includes both random and systematic error.
- The relative standard deviation (RSD) at the FNQS should fall between the limits of 10% and 25%.
- The average FNQS Recovery when  $N > 20$  provides an estimate of measurement bias at the FNQS concentration. Individual FNQS recoveries should fall within the limits of 50%-150%.

Rev 8, March 25, 2007  
FACA website

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### Calibration Reference

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- *Preparation of Calibration Curves, A Guide to Best Practices*, September 2003  
LGC/VAM/2003/032

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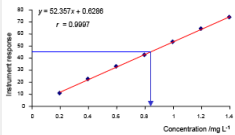
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### Pitfalls during Studies

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- Common pitfalls were identified
- Linear Systems
  - Response to concentration



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### Pitfalls

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- Concentration range is not adequate to cover the range of sample concentrations
- Calibration standards concentration are not evenly spaced across the calibration range
- Uncertainty associated with the calibration standards concentration is too large due to preparation practices or standards purity
- Wrong regression formula is applied

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**Pitfalls**

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- Calibration line is fitted through zero even though the intercept is not zero
- Instrument software is used to carry out the regression without looking at the plot of the data
- Full standard error of prediction calculation is not performed
- Performance of the instrument is not within specification

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**Avoid Problems By:**

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- Plan the calibration study
- Analyze a standard with zero analyte concentration (i.e., method blank or calibration blank)
- Use appropriate materials and apparatus for preparation of calibration standards
- Define the equipment specifications appropriate for the calibration

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**Avoid Problems By:**

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- Plot and examine calibration results and specify the acceptable residual;
- Use validated software to perform the linear regression;
- Define when to set the intercept to zero (e.g. when is the intercept and zero insignificant);
- Calculate the uncertainty for test sample concentrations from the calibration curve as one component of the estimated uncertainty.

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### Plan the Study

- Number of calibration standards
- Concentration of each standard
- Number of replicates of each measurement
- Preparation of calibration standards

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### Making Measurements

- Equipment Qualification
  - Fit for purpose
- Standards in a random order
  - Not decreasing or increasing

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### Plotting the Results

- View in a plot
- Evaluate the scatter plot
- Points of influence
  - Leverage or bias

A) Leverage due to unequal distribution of calibration levels

B) Leverage due to the presence of an outlier

C) Leverage due to the presence of an outlier

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### Regression Analysis

- $y = mx + b$ 
  - $x$  = concentration
  - $y$  = response
- Residuals
  - $y$  measured versus  $y$  calculated
  - How well the line fits the data
  - Least squares regression - minimize the sum of squared residuals
  - Normal distribution, equal weight to all points
    - Standard deviation is the same across all points

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### Analyze Residual Plots

a) Ideal - random distribution of residuals about zero    b) Standard deviation increases with concentration

c) Curved response    d) Intercept incorrectly set to zero

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### Correlation Coefficient, $r$

- Measure of correlation not linearity
- Closer to 1 the better the correlation

c) An outlier causing bias    d) An outlier causing leverage

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### Residual Standard Deviation

- Deviation of data from fitted regression line
- ANOVA table to assess regression
- Fitting line through origin

$$s(r) = \sqrt{\frac{\sum (y_i - \hat{y}_i)^2}{n - 2}}$$


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### Regression Analysis

Regression Statistics	
Multiple R	0.999955883
R Square	0.999911768
Adjusted R Square	0.999889709
Standard Error	0.005164622
Observations	6

ANOVA					
	df	SS	MS	F	Significance F
Regression	1	1.2091	1.2091	45330.79	2.93x10 <sup>-8</sup>
Residual	4	0.00010469	2.67x10 <sup>-5</sup>		
Total	5	1.2092			

	Coefficients	Standard Error	t Stat	P-value	Lower 95%	Upper 95%
Intercept	0.0021129	0.0037548	0.56270	0.60368	-0.008312	0.012538
XX Variable 1	0.10441	0.00049038	212.91	2.92x10 <sup>-8</sup>	0.10304	0.10577

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### Estimate Sample Values

- Satisfactory regression analysis
- m and y used to calculate test sample results
- Samples analyzed multiple times
- Same conditions as standards

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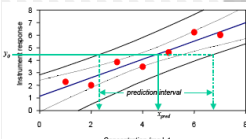
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### Estimate Uncertainty

- Confidence interval for regression line
- Less certain near extremes
- Prediction interval calculation provides estimate of uncertainty associated with predicted values of x



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### Calibration Today

- Robust statistical techniques not always used in the method validation when test developed
- Laboratory method validation data does not present study of calibration process to support laboratory method

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### Method Validation

- Reference test methods must define
  - specific conditions of test or define acceptable statistical parameters of performance
  - selection of number of data points
  - calibration range
  - origin
  - uncertainty
  - number of standard and sample runs to reduce standard error of prediction

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### Methods of Evaluation

- Sampling QC
  - Equipment Blanks
  - Field Blanks
  - Trip Blanks
  - Cooler Temperature
  - Field Duplicate Pairs
  - Collocated Samples
  - Field Splits



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### Methods of Evaluation

- Analytical QC
  - Method Blank (MB)
  - Laboratory Control Sample (LCS)
  - Reagent Blank
  - Storage Blank
  - Internal Standards
  - Second Source Standard
  - Proficiency Testing (PT)
  - Surrogates
  - Lab Duplicate
  - Lab Matrix Spike
  - Matrix Spike Duplicate



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### Control Charts

- Mean Chart
  - Standard Deviation, Average
  - Warning Limits ( $\pm 2s$ ), Control Limits ( $\pm 3s$ )
  - Number of points for calculating  $s$ 
    - depends on use
- Range Chart
  - Standard Deviation, Average
  - Upper WL and CL only
  - Baseline = zero
  - Factor used for duplicates =
    - 1.128 mean
    - 3.267 control limit

*SM 20th edition*

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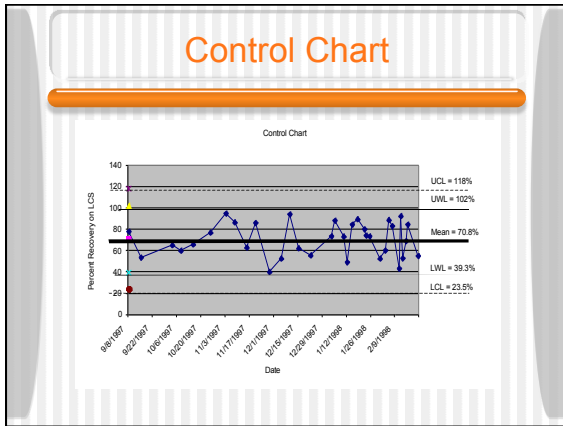
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- ### Control Charts
- Evaluation *SM 20th edition*
    - 1 measurement > CL
      - Analyze another
      - Stop test if > CL
    - 2 of 3 successive point > WL
      - Analyze another
      - Stop test if > WL, evaluate bias and correct
    - 4 out of 5 points exceeds 1s or decreasing or increasing order on same side of the central line
      - Analyze another
      - Stop test if exceeds 1s or same pattern and correct
    - 7 successive points on same side of central line
      - Stop test and correct

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- ### Significant Figures
- Digits known definitively, except for last digit. - last digit is in doubt
  - Do not carry more than one doubtful digit in the final result
  - Use standard deviation (or uncertainty) as guide for number of significant figures.
  - Round only at the end of all operations
  - How do you deal with zero?
- SM 20th edition*

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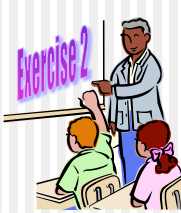
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### Let's Practice

<b>0.0007</b>
<b>12.065</b>
<b>4.078</b>
<b>25.9</b>
<b>4885</b>
<b>4927.0437</b>



*Exercise 2*

$35.9802824 = (56 * 0.025235 * 58.56 / 2.3)$

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### Rules for Rounding

- Drop off digits that are not significant
  - If digit > 5 increase preceding digit
  - If digit < 5 do not alter preceding digit
  - If digit = 5, round preceding digit to even number
- Practice: *(Round to two sig figs)*

2.77 = ?	2.30 = ?	2.25 = ?
2.73 = ?	2.35 = ?	2.89 = ?

*SM 20th edition*

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### Any Questions?



*How do I verify spreadsheets?*

**Question !**

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**Summary**

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- **Place Information in your Quality Manual**
  - **Definition of Terms**
  - **Formulas**
  - **Procedures for Data Evaluation**

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**Thank you**

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