


Where are we in our discussion of error analysis?

Let's revisit:



CM3215 MichiganTech  
Fundamentals of Chemical Engineering Laboratory

Statistics Quick Start:  
Random Error and Replicates

Professor Faith Morrison  
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CM3215 MichiganTech  
Fundamentals of Chemical Engineering Laboratory

Statistics Lecture 2:  
Reading Error

Professor Faith Morrison  
Department of Chemical Engineering  
Michigan Technological University

1. Quick start – Replicate error
2. Reading Error
3. Calibration Error
4. Error Propagation

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From Lecture 1: Quick Start, Replicate Errors:

## Measurements are affected by errors

(uncertainty)

There are two general categories of errors (uncertainties) in experimental measurements:

- Systematic errors
- Random errors

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From Lecture 1: Quick Start, Replicate Errors:

## Measurements are affected by errors

### Random errors

(uncertainty)

1. Varies in sign and magnitude for identical conditions
2. May be due to the instrument or the process being measured
3. Must be understood and communicated with results

#### Sources:

Always present  
(need to minimize)

- Random process, instrument fluctuations
- Randomized systematic trends (e.g. operator identity, thermal drift)
- Rare events

#### Solutions:

Do:  
Always an option

- Replicate and average
- Improve measurement methods, practices
- Isolate from rare events

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From Lecture 1: Quick Start, Replicate Errors:

## Measurements are affected by errors (uncertainty)

We have identified three sources of standard error:

- Random errors (replicate error)
- Reading errors
- Calibration errors

Averaging replicates allows us to calculate a standard error due to **random error**

$$e_s = \frac{s}{\sqrt{n}}$$

Standard error of replicates

$$e_s = \frac{e_R}{\sqrt{3}}$$

Standard reading error

$$e_s = ?$$

Standard calibration error

For all three types of errors, we write a **variance** of the sampling distribution.

**Why?** Because we know how to combine variances (see literature):

$$\sigma_{total}^2 = \sigma_1^2 + \sigma_2^2 + \sigma_3^2 + \dots$$

**They add in quadrature.**

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From Lecture 2: Reading Error:

## Measurements are affected by errors (uncertainty)

### Systematic errors

- Has same sign and magnitude for identical conditions
- Must be checked for, identified, eliminated, randomized

**Sources:**

- Unavoidable:** Calibration of instruments
- Unavoidable:** Reading error (resolution, coarse scale)
- Mistakes (need to fix):**
  - Consistent operator error
  - Failure to produce experimentally conditions assumed in an analysis (e.g. steady state, isothermal, well mixed, pure component, etc.)

**Solutions:**

- Always an option:**
  - Recalibrate
  - Improve instrument resolution
  - Apply correction for identified error
  - Improve procedures, experimental design
  - Shift to other methods
- Do:** Take data in random order; rotate operators

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From Lecture 2: Reading Error:

## Measurements are affected by errors (uncertainty)

We have identified three sources of standard error:

- Random errors (replicate error)
- Reading errors
- Calibration errors

There are two common types of systematic error that we consider, **reading** and **calibration** error.

We obtained **reading** error in the previous lecture.

Now we discuss **calibration** error in the

$e_s = \frac{s}{\sqrt{n}}$	Standard error of <u>replicates</u>
$e_s = \frac{e_R}{\sqrt{3}}$	Standard <u>reading</u> error
$e_s = ?$	Standard <u>calibration</u> error

For all three types of errors, we write a **variance**.

Variations add in **quadrature**.

$$\sigma_{total}^2 = \sigma_1^2 + \sigma_2^2 + \sigma_3^2 + \dots$$

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CM3215 **MichiganTech**  
**Fundamentals of Chemical Engineering Laboratory**

**Statistics Lecture 3:**

**Calibration Error**

**Professor Faith Morrison**  
 Department of Chemical Engineering  
 Michigan Technological University

1. Quick start—Replicate error
2. Reading Error
3. **Calibration Error**
4. Error Propagation
5. Least Squares Curve Fitting

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**Obtaining a Good Estimate of Precision**

**What is the Standard Error of a Measurement?**

**$e_s \equiv$  Standard Error**


**★ Part 3: Calibration Errors**

**Three sources:**

- Replicate errors
- Reading errors
- ★ Calibration errors

Standard error is the standard deviation of the sampling distribution.

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Department of Chemical Engineering

**Calibration Error Worksheet**  
CM3215 Fundamentals of Chemical Engineering Lab  
Prof. Faith Morrison

The error  $e_s$  is defined as the "best-case" standard error for a quantity as determined for a brand-new unit by a manufacturer or for a particular device by someone with authority to certify the value. For example, the technical specifications of a device may indicate that it is accurate to a value  $\pm 2e_s$ . Alternatively, a value of a constant (the viscometer constant  $\alpha$ , for example) may be provided by the manufacturer with no specific uncertainty. In this case, the rule of thumb method of "least significant digit" is acceptable for evaluating the uncertainty. Finally, a user may take steps to calibrate a meter on site; this determination of error (likely to be greater than the "best case" error) has the advantage of reflecting issues associated with the particular unit in question.

Device name:		
Measured quantity:	Symbol:	Representative value: (include units)
		Estimate of $e_s$ : (or Not Applicable)
Rigorous Method: Manufacturer maximum error allowable	$2 e_s =$	
Rule of Thumb Method: Least significant digit on provided value	Least significant digit varies by at least $\pm 1 = \pm 2e_s$	
Method 3: User calibration	$2e_s =$	
	Maximum of Methods 1 - 3	$e_s =$ $2e_s =$
		95% CI, Calibration error only: quantity $\pm 2e_s$ <span style="float: right;">(units)</span>

Handy worksheet for calibration error

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[www.chem.mtu.edu/~fmorriso/cm3215/CalibrationErrorWorksheet.pdf](http://www.chem.mtu.edu/~fmorriso/cm3215/CalibrationErrorWorksheet.pdf)

## Measurements are affected by errors

### Systematic errors

1. Has same sign and magnitude for identical conditions
2. Must be checked for, identified, eliminated, randomized

#### Sources:

- Miscalibration of instruments
- Consistent operator error (e.g. parallax)
- Failure to produce experimentally conditions assumed in an analysis (e.g. steady state, isothermal, well mixed, pure component, etc.)

#### Solutions:

- Recalibrate
- Apply correction for identified error
- Improve procedures, experimental design
- Shift to other methods
- Take data in random order; rotate operators

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## Measurements are affected by errors

### Systematic errors

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#### Sources:

- Miscalibration of instruments
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#### Solutions:

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## Calibration

### What is calibration?

**Calibration** is a step made to establish the **correctness** and **utility** of a device.

1. A standard is used (a device or material whose correctness or properties are known).
2. The unit under test and the standard are both made to make a measurement.
3. The performance of the unit under test is assigned based on the comparison to the standard – we say that the unit under test is calibrated against the standard.

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## Factory Calibration

- Many devices come to us calibrated by the manufacturers
- How do we know the accuracy of these devices?

$$T = 39.8 \pm ?$$



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## Factory Calibration

- Many devices come to us calibrated by the manufacturers
- How do we know the accuracy of these devices?

$$T = 39.8 \pm ?$$



**We check with the manufacturer.**

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## Factory Calibration

Omega HH501BJK


**(HH501BJK)**  
 Display Type: Backlit LCD  
 Number of Digits: 1999  
 Input Channel: 2  
 Temperature Range: -50 to 1370°C  
 (-58 to 1958°F)  
Resolution: 0.1°/1°  
 Display: 1  
 W/Bead Wire Type K Thermocouple: 2  
 Basic Accuracy: 0.1% +1°C

*Sensor resolution* here is what we call Sensitivity (part of reading error)—the smallest change a sensor can detect in the quantity that it is measuring (dual display, 0.1°/1°C)

### Digital Thermometers

HH500 Series

- ✓ Types J, K Thermocouples
- ✓ Provide MaxMin, Avg, Hold, Relative
- ✓ Warning Beeper with Hi/Lo Setting, Time Setting on Model HH502
- ✓ Dual Display Function
- ✓ 0.1° Resolution
- ✓ Differential Thermocouple Input
- ✓ Accuracy: Stated Accuracy at 23 ±5°C ±0.5% FS
- ✓ NEMA 4X (IP66) Dustproof
- ✓ Water/Splash Resistant



www.omega.com/Temperature/pdf/HH500.pdf


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## Factory Calibration

Omega HH501BJK

- Standard limits of error: greater of 2.2°C or 0.75%
- Special limits of error: greater of 1.1°C or 0.4%  
(Note that until  $T > 275^\circ\text{C}$ ,  $1.1^\circ\text{C} > 0.4\%$ )





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### Wire Color Codes and Limits of Error

To view the printable version, click [here](#).  
(Printable version also contains international color codes)


ANSI Code	Alloy Combination		Color Coding		Maximum Useful Temperature Range ++	Maximum Thermocouple Grade Temperature Range	EMF (mV) Over Max. Temperature Range	Standard Limits of Error** (above 0°C)	Special Limits of Error** (above 0°C)	International IEC 584-3	Comments Environment - Bare Wire	ANSI Code
	+ Lead	- Lead	Thermocouple Grade	Extension Grade								
J	IRON Fe (magnetic)	CONSTANTAN COPPER-NICKEL Cu-Ni			Thermocouple Grade: 32 to 1382°F 0 to 750°C Extension Grade: 32 to 392°F 0 to 200°C	-346 to 2193°F -210 to 1200°C	-8.095 to 69.563	greater of 2.2°C or 0.75%	greater of 1.1°C or 0.4%		Reducing, Vacuum, Inert. Limited Use in Oxidizing at High Temperatures. Not Recommended for Low Temperatures.	J
K	CHROMEL-ALUMINUM Ni-Cr	ALOMEGA® NICKEL-ALUMINUM Ni-Al (magnetic)			Thermocouple Grade: -328 to 2382°F -200 to 1250°C Extension Grade: 32 to 392°F 0 to 200°C	-454 to 2501°F -270 to 1372°C	-6.458 to 54.886	greater of 2.2°C or 0.75%	greater of 1.1°C or 0.4%		Clean Oxidizing and Inert. Limited Use in Vacuum or Reducing. Wide Temperature Range. Most Popular Calibration	K

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## Factory Calibration




- Standard limits of error: greater of  $\pm 2.2^{\circ}\text{C}$  or 0.75%
- Special limits of error: greater of  $\pm 1.1^{\circ}\text{C}$  or 0.4%

EMF (mV) Over Max Temperature Range	Standard Limits of Error** (above 0°C)	Special Limits of Error** (above 0°C)	International IEC 584-3 Color Codes
-8.095 to 69.553	greater of 2.2°C or 0.75%	greater of 1.1°C or 0.4%	
-6.458 to 54.886	greater of 2.2°C or 0.75%	greater of 1.1°C or 0.4%	

[www.omega.com/techref/colorcodes.html](http://www.omega.com/techref/colorcodes.html)

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## Factory Calibration



Omega HH501BJK


- Standard limits of error: greater of  $\pm 2.2^{\circ}\text{C}$  or 0.75%
- Special limits of error: greater of  $\pm 1.1^{\circ}\text{C}$  or 0.4%

(Note that until  $T > 275^{\circ}\text{C}$ ,  $1.1^{\circ}\text{C} > 0.4\%$ )

Which limits apply, depends on what you buy:

Ready-Made Insulated Thermocouples with Kapton®, PFA, Glass Braid Insulation and Molded Connectors

**SLRTC, and 5SRTC Series**



Click for larger image.

- Sold in Packs of 5 Economically Priced
- New Kapton® Insulation Available Now (All models)!
- J, K, E and R Calibrations Available
- Made from Special Limits of Error Wire
- 20, 24, 30 and 36 AWG Available (SRTC Series)
- 30 and 36 AWG Wires with PFA Insulation. Max. Service Temp 260°C (500°F)
- 30 AWG Wires with Glass Braid Insulation. Maximum Service Temp 480°C (900°F)
- 1 and 2 meter (36 and 72") Lengths Standard
- Convenient 5-Pack
- Molded Subminiature Connector with Integral Strain Relief/Spool
- Max Service Temp for Connector Body 220°C (425°F)
- Available from Stock in Convenient 5-Packs
- PFA, Kapton®, or Glass Braid Insulation

View related products - Temperature Sensors and Instruments

[www.omega.com/pptst/5LSC\\_5SRTC.html](http://www.omega.com/pptst/5LSC_5SRTC.html)

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## Factory Calibration

- Many devices come to us calibrated by the manufacturers
- How do we know the accuracy of these devices?

According to the manufacturer (at best):

$$T = 39.8 \pm 1.1^{\circ}C$$

$$38.7 \leq T \leq 40.9^{\circ}C$$

(note that  $T > 275^{\circ}C$  the uncertainty is even higher, 0.4%)



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## Factory Calibration

- Many devices come to us calibrated by the manufacturers
- How do we know the accuracy of these devices?

According to the manufacturer (at best):

$$T = 39.8 \pm 1.1^{\circ}C$$

$$38.7 \leq T \leq 40.9^{\circ}C$$

**Let's check.**



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**EXAMPLE 3:** For the temperature indicators in the lab, what is the standard error and 95% confidence interval for the measurement? Consider replicate error, reading error, and calibration error.



Let's try.

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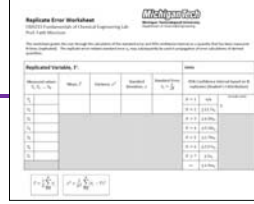
## Replicate Error

- Test 11 meters
- Calculate standard error  $e_s = \frac{s}{\sqrt{n}}$



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## Replicate Error



- 11 thermocouples, 11 temperature indicators
- Indicators in service for various amounts of time
- Factory calibrated
- All measuring the temperature of a bath thermostated to 40.0°C
- Record temperatures

Y=			mean	variance	std dev	std error		95% CI	
	T	N		s <sup>2</sup>	s	e <sub>s</sub>	2e <sub>s</sub>	lower	upper
	°C	11	39.2	1.1	1.1	0.3	0.6	38.6	39.9
Y <sub>1</sub>	39.3		°C	°C	°C	°C	°C	°C	°C
Y <sub>2</sub>	40.0								
Y <sub>3</sub>	36.7								
Y <sub>4</sub>	39.9								
Y <sub>5</sub>	39.8								
Y <sub>6</sub>	39								
Y <sub>7</sub>	38								
Y <sub>8</sub>	39.9								
Y <sub>9</sub>	39								
Y <sub>10</sub>	40.1								
Y <sub>11</sub>	40.0								

$$e_s = \frac{s}{\sqrt{n}} = \frac{1.1}{\sqrt{11}} = 0.3^\circ C$$

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## Reading Error

Issues:

- Sensitivity
- Resolution
- Fluctuations



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## Reading Error

**Issues:**

- Sensitivity
- Resolution
- Fluctuations



You try.



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**Reading Error Worksheet**  
CM3215 Fundamentals of Chemical Engineering Lab  
Prof. Faith Morrison


This worksheet guides the user through the calculation of the standard error and 95% confidence scale or off a digital readout (yielding value  $x$  and subject to reading error). The reading-error-related standard error  $e_r$  may subsequently be used in propagation of error calculations of derived quantities.

Device name:		
Measured Quantity: (give symbol)		
Representative value:	(include units)	Quantity or Not Applicable
<b>issue</b>	<b>contribution to error</b>	
Sensitivity (manufac. or estimated)	How much signal does it take to cause the reading to change?	1
Resolution: limitation on marked scale or digital readout	Half smallest division or decimal place	2
Fluctuations with time of observation	(max-min)/2	3
	Maximum of 1, 2, & 3:	$e_R =$
Standard error based on reading error:	$e_s = e_R/\sqrt{3}$	$e_s =$ (units)
	95% Confidence Interval on the reading: $\pm 2e_s$	

Note: If a value is supplied by, for example, a manufacturer, with no indication of the uncertainty, we do not use this worksheet. Instead, see the Calibration Error worksheet.

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Device name: <b>Omega Temp indicator with thermocouple</b>		
Measured Quantity: (give symbol)	<b>Temperature, <math>T</math></b>	
Representative value:	(include units) <b>39.8°C</b>	Quantity or Not Applicable
<b>issue</b>	<b>contribution to error</b>	
Sensitivity (manufac. or estimated)	How much signal does it take to cause the reading to change?	1
Resolution: limitation on marked scale or digital readout	Half smallest division or decimal place	2
Fluctuations with time of observation	(max-min)/2	3
	Maximum of 1, 2, & 3:	$e_R =$
Standard error based on reading error:	$e_s = e_R/\sqrt{3}$	$e_s =$
	95% Confidence Interval on the reading: $\pm 2e_s$	

Note: If a value is supplied by, for example, a manufacturer, with no indication of the uncertainty, we do not use this worksheet. Instead, see the Calibration Error worksheet.

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**Reading Error Worksheet**  
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 Department of Chemical Engineering

This worksheet guides the user through the calculation of the standard error and 95% confidence scale or of a digital readout (yielding value  $x$  and subject to reading error). The reading-error-related standard error  $e_x$  may subsequently be used in propagation of error calculations of derived quantities.

<b>Device name:</b> Omega Temp indicator with thermocouple			
Measured Quantity: (give symbol)	Temperature, $T$		
Representative value:	(include units) 39.8°C	Quantity or Not Applicable	
<b>issue</b>	<b>contribution to error</b>		
Sensitivity (manufac. or estimated)	How much signal does it take to cause the reading to change?	1	0.1°C
Resolution: limitation on marked scale or digital readout	Half smallest division or decimal place	2	0.05°C
Fluctuations with time of observation	(max-min)/2	3	0.05°C
	Maximum of 1, 2, & 3:	$e_R = 0.1^\circ C$	
Standard error based on reading error:	$e_s = e_R/\sqrt{3}$	$e_s = 0.06$	(units) °C
	95% Confidence Interval on the reading: $\pm 2e_x$	$\pm 0.11^\circ C$	

Note: If a value is supplied by, for example, a manufacturer, with no indication of the uncertainty, we do not use this worksheet. Instead, see the Calibration Error worksheet.

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(guess)

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## Summary of Errors

Standard Errors,  $e_x$ :

- Replicate standard error is  $\frac{s}{\sqrt{n}} = 0.3^\circ C$
- Reading standard error is  $\frac{e_R}{\sqrt{3}} = 0.06^\circ C$
- Calibration error?

## Calibration Error

**Issues:**

- Manufacturer maximum error allowable
- Least significant digit on provided value
- User calibration



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## Calibration Error

**Issues:**

- Manufacturer maximum error allowable
- Least significant digit on provided value
- User calibration



You try.

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Department of Chemical Engineering

**Calibration Error Worksheet**  
CM3215 Fundamentals of Chemical Engineering Lab  
Prof. Faith Morrison

The error  $e_s$  is defined as the "best-case" standard error for a quantity as determined for a brand-new unit by a manufacturer or for a particular device by someone with authority to certify the value. For example, the technical specifications of a device may indicate that it is accurate to a value  $\pm 2e_s$ . Alternatively, a value of a constant (the viscometer constant  $\alpha$ , for example) may be provided by the manufacturer with no specific uncertainty. In this case, the rule of thumb method of "least significant digit" is acceptable for evaluating the uncertainty. Finally, a user may take steps to calibrate a meter on site; this determination of error (likely to be greater than the "best case" error) has the advantage of reflecting issues associated with the particular unit in question.

Device name:		
Measured quantity:	Symbol:	Representative value: (include units)
		Estimate of $e_s$ : (or Not Applicable)
Rigorous Method: Manufacturer maximum error allowable	$2 e_s \approx$	
Rule of Thumb Method: Least significant digit on provided value	Least significant digit varies by at least $\pm 1 = \pm 2e_s$	
Method 3: User calibration	$2e_s \approx$	
	Maximum of Methods 1 - 3	$e_s =$ $2e_s =$
		<b>95% CI Calibration error only: quantity <math>\pm 2e_s</math></b> <small>(units)</small>

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## Calibration Error

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**Calibration Error Worksheet**  
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Device name:	Omega Temp indicator w/ t-couple	
Measured quantity:	Symbol:	Representative value: (include units)
temperature	$T$	$39.8^\circ\text{C}$
		Estimate of $e_s$ : (or Not Applicable)
Rigorous Method: Manufacturer maximum error allowable		
Rule of Thumb Method: Least significant digit on provided value		
Method 3: User calibration		



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## Calibration Error

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**Calibration Error Worksheet**  
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Device name:	Omega Temp indicator w/ t-couple	
Measured quantity:	Symbol:	Representative value: (include units)
temperature	$T$	$39.8^\circ\text{C}$
		Estimate of $e_s$ : (or Not Applicable)
Rigorous Method: Manufacturer maximum error allowable	$2 e_s \approx 1.1^\circ\text{C}$	$0.55^\circ\text{C}$
Rule of Thumb Method: Least significant digit on provided value	Least significant digit varies by at least $\pm 1 = \pm 2e_s$	$0.1^\circ\text{C}$
Method 3: User calibration	$2e_s \approx$	$n/a$
	Maximum of Methods 1 - 3	$e_s = 0.55^\circ\text{C}$ $2e_s = 1.1^\circ\text{C}$
		<b>95% CI, Calibration error only: quantity <math>\pm 2e_s</math></b> $39.2 \pm 1.1^\circ\text{C}$



(User calibration: Can also be a place where you add in extra error due to knowing, for example, that the instrument has not been well cared for or the user is not an expert)

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## Summary of Errors of Temperature Indicator

Standard Errors,  $e_x$ :

- Replicate standard error is  $\frac{s}{\sqrt{n}} = 0.3^\circ C$
- Reading standard error is  $\frac{e_R}{\sqrt{3}} = 0.06^\circ C$
- Calibration error is  $e_s = 0.55^\circ C$

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## Summary of Errors of Temperature Indicator

Standard Errors,  $e_x$ :

- Replicate standard error is  $\frac{s}{\sqrt{n}} = 0.3^\circ C$
- Reading standard error is  $\frac{e_R}{\sqrt{3}} = 0.06^\circ C$
- Calibration error is  $e_s = 0.55^\circ C$

**Calibration error is the largest, followed by replicate error**

How do we combine?

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## Summary of Errors of Temperature Indicator

Standard Errors for temperature indicator,  $e_s$ :

- Replicate standard error is  $\frac{s}{\sqrt{n}} = 0.3^\circ C$
- Reading standard error is  $\frac{e_R}{\sqrt{3}} = 0.06^\circ C$
- Calibration error is  $e_s = 0.55^\circ C$

For all three types of errors, we write a **variance** of the sampling distribution.

$$e_{s,total}^2 = (0.3)^2 + (0.06)^2 + (0.55)^2$$

$$e_{s,total} = 0.63^\circ C$$

**Why?** Because we know how to combine variances (see literature):

$$\sigma_{total}^2 = \sigma_1^2 + \sigma_2^2 + \sigma_3^2 + \dots$$

**They add in quadrature.**

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## Factory Calibration

- Many devices come to us calibrated by the manufacturers
- How do we know the accuracy of these devices?



According to the manufacturer:

$$T = 39.2 \pm 1.1^\circ C$$

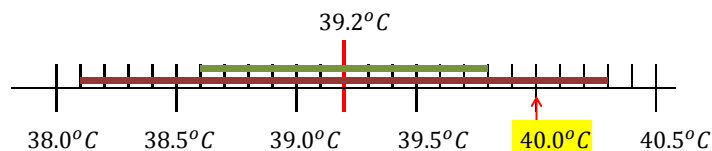
$$38.1 \leq T \leq 40.3^\circ C$$

Performance in our laboratory:

(ignoring calibration error)

$$T = 39.2 \pm 0.6^\circ C$$

$$38.6 \leq T \leq 39.8^\circ C$$



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### Factory Calibration

-From replicates  
-Manufacturer limits

39.2°C

true value

↓

38.0°C   38.5°C   39.0°C   39.5°C   40.0°C   40.5°C

**Observations:**

- The narrow spread of the replicates testifies to the **precision** of the measurement
- The fact that the true value of  $T$  is not included in the spread of the replicates, speaks poorly of the **accuracy** of the measurement
- The **error limits supplied by the manufacturer** do encompass the true value, however
- **Replicates can only tell us about precision, not accuracy.**

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true value

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**If a *single* temperature indicator were used over and over, the spread of the replicates would be even more narrow.**

**Always consider the manufacturer's error limits along with replicates to estimate a sensor's accuracy.**

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## Obtaining a Good Estimate of a Quantity

### Summary:

#### Replicate error:

- Measure the quantity several times – replicates
- The average value is a good estimate of the quantity we are measuring if only random errors are present
- The 95% confidence interval comes from  $\pm(**)e_s$
- $(**) = 2$  if the number of replicates is 7 or higher
- $(**)$  comes from the Student's t distribution if  $N < 7$
- Report one sig fig on error (unless that digit is 1 or 2)

#### Reading error:

- Determine signal needed to change reading
- Determine half smallest division or decimal place
- Determine average of fluctuations
- Max of those  $/\sqrt{3}$  = reading error
- use  $\pm 2e_s$  for 95% confidence interval

#### Calibration error:

- Determine manufacturer maximum error allowable
- Assume least significant digit varies by  $\pm 1$
- Calibrate in-house
- Use largest uncertainty as determined above
- Replication cannot reduce calibration error

#### Combining Errors:

$$e_{s,combined}^2 = e_{s,replicate}^2 + e_{s,reading}^2 + e_{s,calibration}^2$$

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# Next: Error Propagation

**CMS215** *MichiganTech*  
Fundamentals of Chemical Engineering Laboratory

**Statistics Lecture 4:  
Error Propagation**

**Professor Faith Morrison**  
Department of Chemical Engineering  
Michigan Technological University

1. Quick start—Replicate error
2. Reading Error
3. Calibration Error
4. **Error Propagation**

