

# Appendix A: Calculations for Data Quality Assessment (sec. 4-5)

aka

## *What Is Reality?*

- 1-pt QC check statistics
- Precision calcs
- Bias calcs



*Stats are designed to show us how far from the TRUTH we might be.*

- **Measurement Error**

- Presented as a fraction of the “truth” (e.g., 10% off)

- **Precision**

- Random error

- “wiggle” inherent in system

- Estimated by (1) repeated measurements of “known,” and/or (2) side-by-side measurements of the same thing

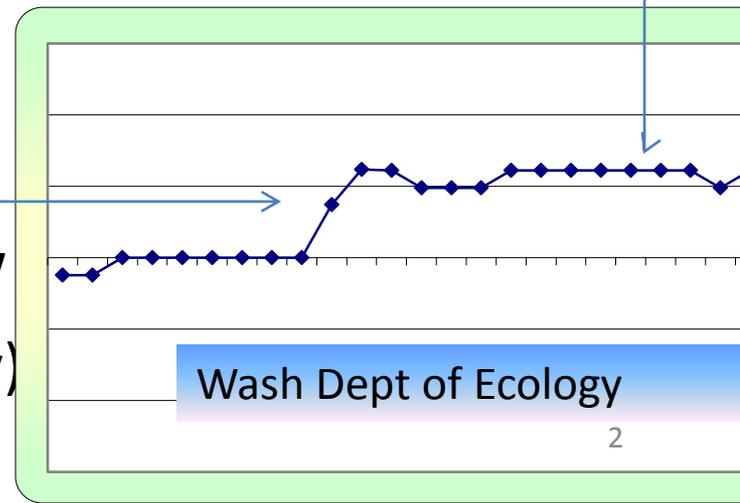
- Some imprecision is unavoidable

- **Bias**

- Systematic error

- “jump” consistently high or low

- bias can be eliminated (in theory)



# 1-pt QC O<sub>3</sub> check data, in AQS:

<u>Meas Val (Y)</u>	<u>Audit Val (X)</u>
98	90
87	90
79	90
79	90
81	90
80	90
82	90
94	90
96	90
97	90
97	90
98	90
80	90

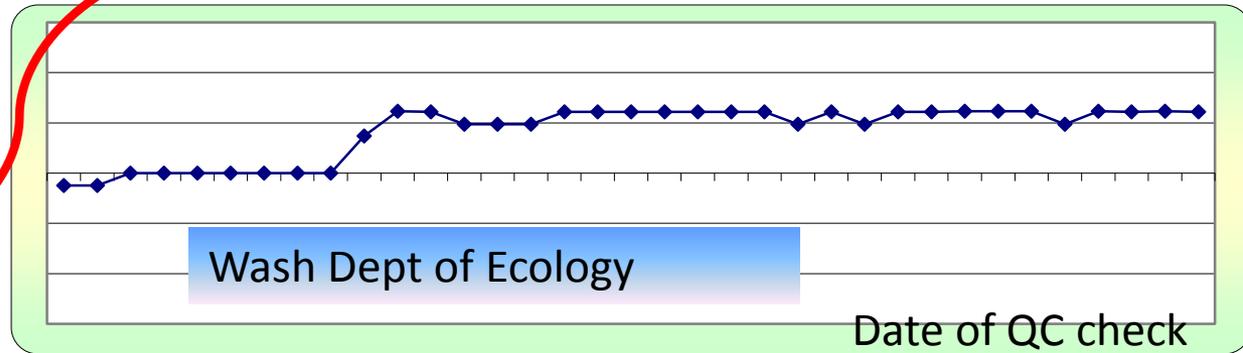


$$d\text{-sub-}i = d_i = \text{diff}/\text{known}$$

- Routine QC checks used to estimate BOTH
- Both come from **d-sub-i**

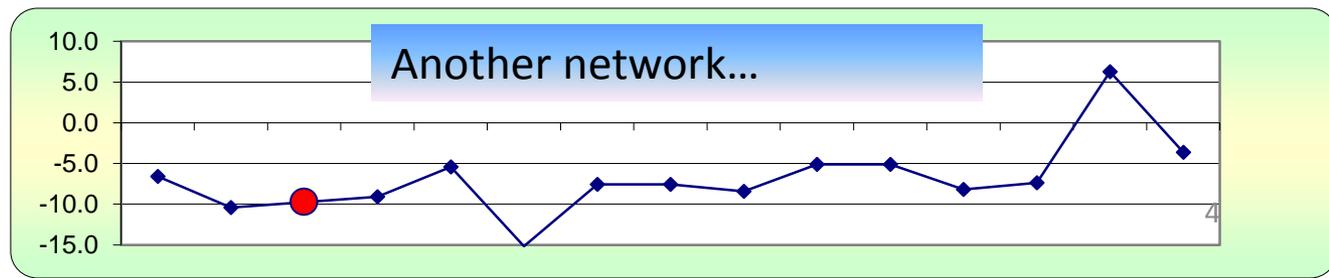
- Bias

- Precision



- sometimes it's obvious

- Sometimes it's not:



<u>Meas</u>	<u>Audit</u>	<u>d-sub-i</u>
<u>Val (Y)</u>	<u>Val (X)</u>	
98	90	9
87	90	-3
79	90	-12
79	90	-12
81	90	-10
80	90	-11
82	90	-9
94	90	4
96	90	7
97	90	8
97	90	8
98	90	9
80	90	-11
80	90	-11
84	90	-7

- **d-sub-i values represent:**

- All of the measurements' error during that day, week, month, quarter
  - The QC checks are supposed to be “randomized” so that they are a sample, or subset, of the whole universe of possible QC checks (the population), and then represent the population of QC checks you could do at any time
- As a proportion of the “truth,” so **“truth”** is always on the bottom (diff/known; so error is quantified as a fraction of the truth so we can imagine it, e.g., 10%)
- “error” = distance from truth at that moment

d (Eqn. 1)

-16

-14

-13

-12

-12

-12

-11

-11

-11

-10

-10

-9

-9

-9

-8

-7

-6

-6

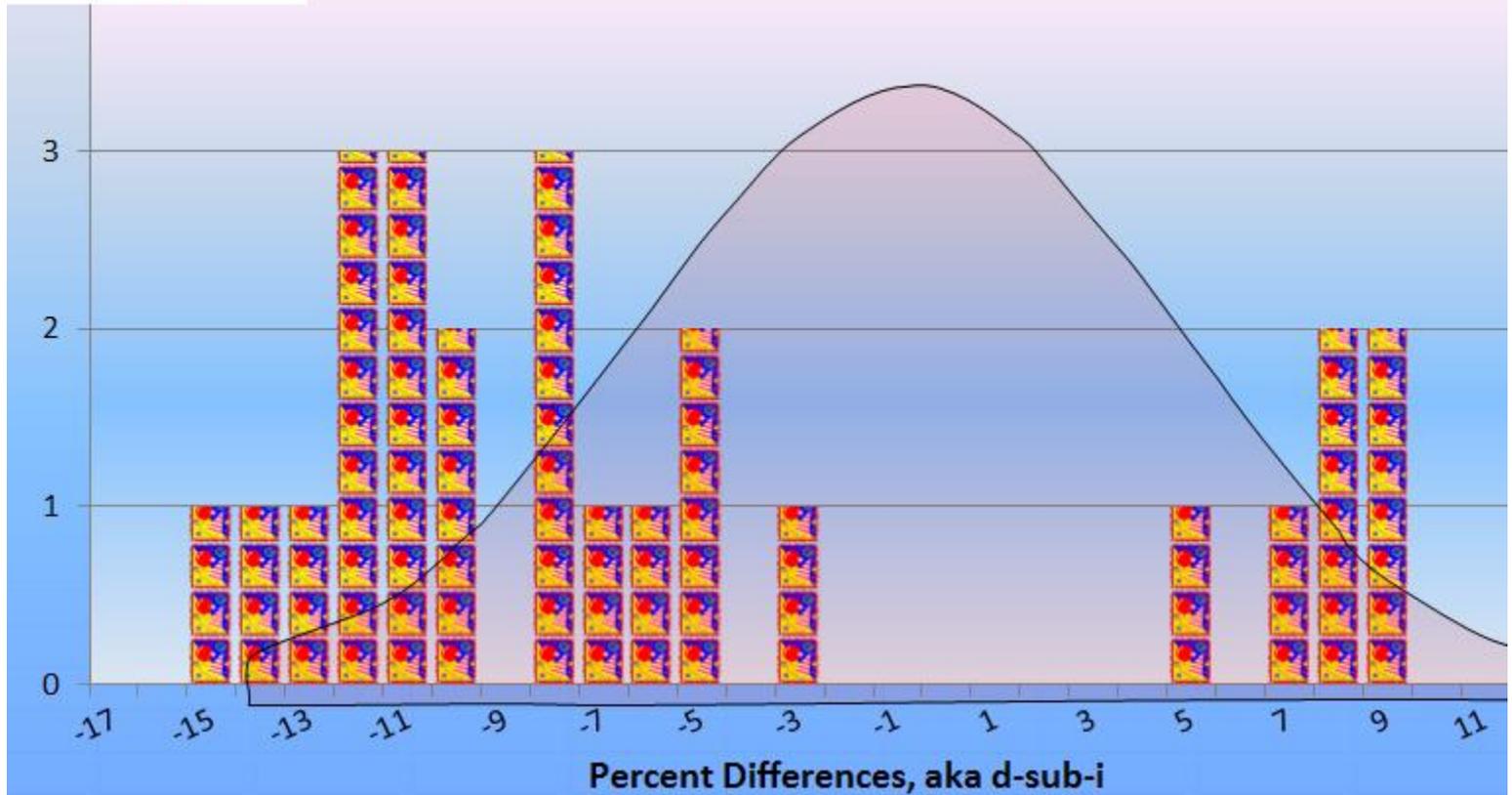
-3

4

7

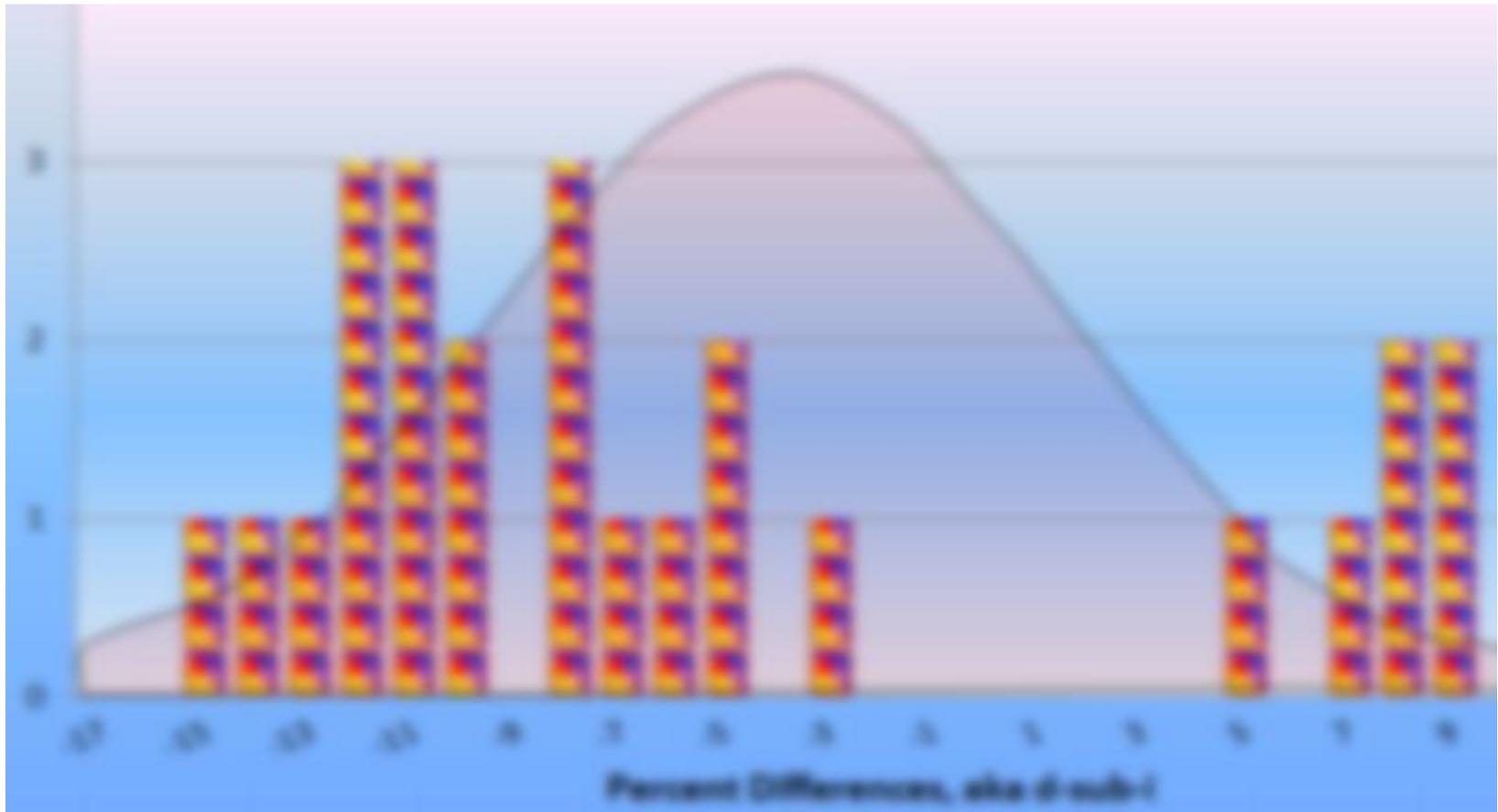
Count of the checks  
resulting with this d-  
sub-i

## Histogram



*How can we apply these results to get **bias** and **precision** for ALL our measurements of ozone with this analyzer during this time period?*

We assume that these results, and their distribution, is representative of all the QC checks we could have done:

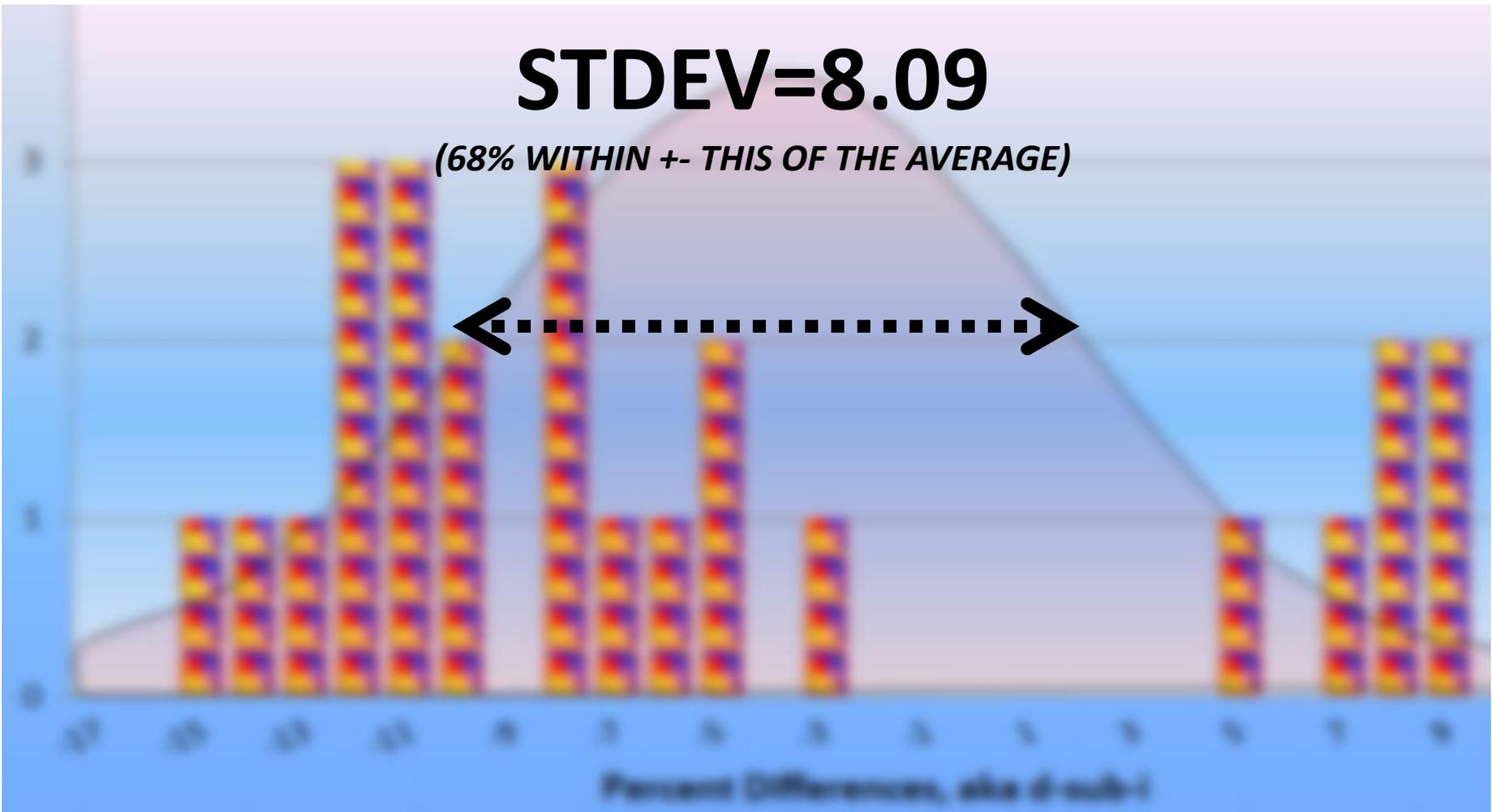


*There's a reason  
no x-axis units*

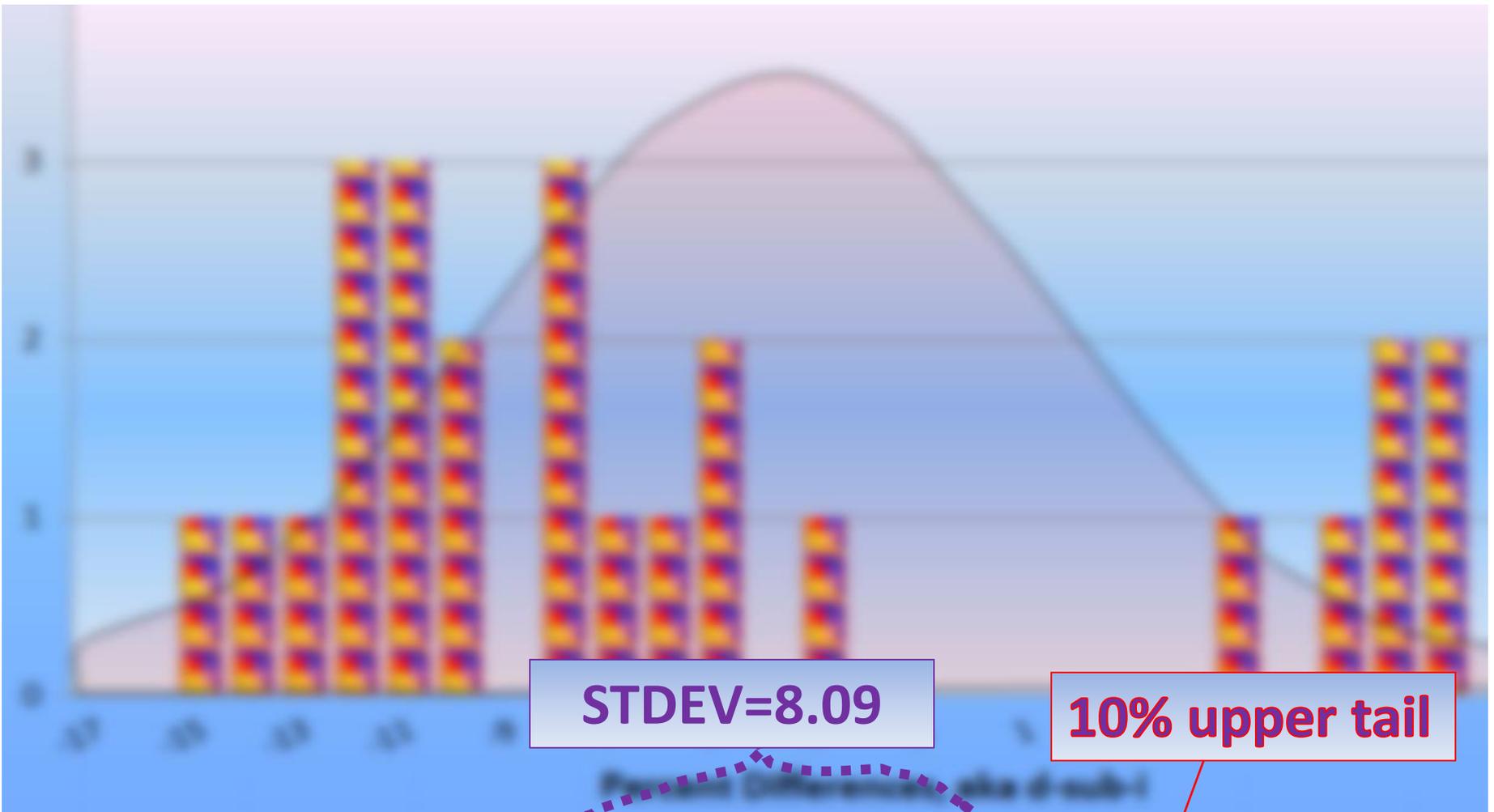
The goal for acceptable measurement uncertainty is defined for O3 precision as an upper **90 percent confidence limit for the coefficient variation (CV) of 7%**

# STDEV=8.09

(68% WITHIN +/- THIS OF THE AVERAGE)

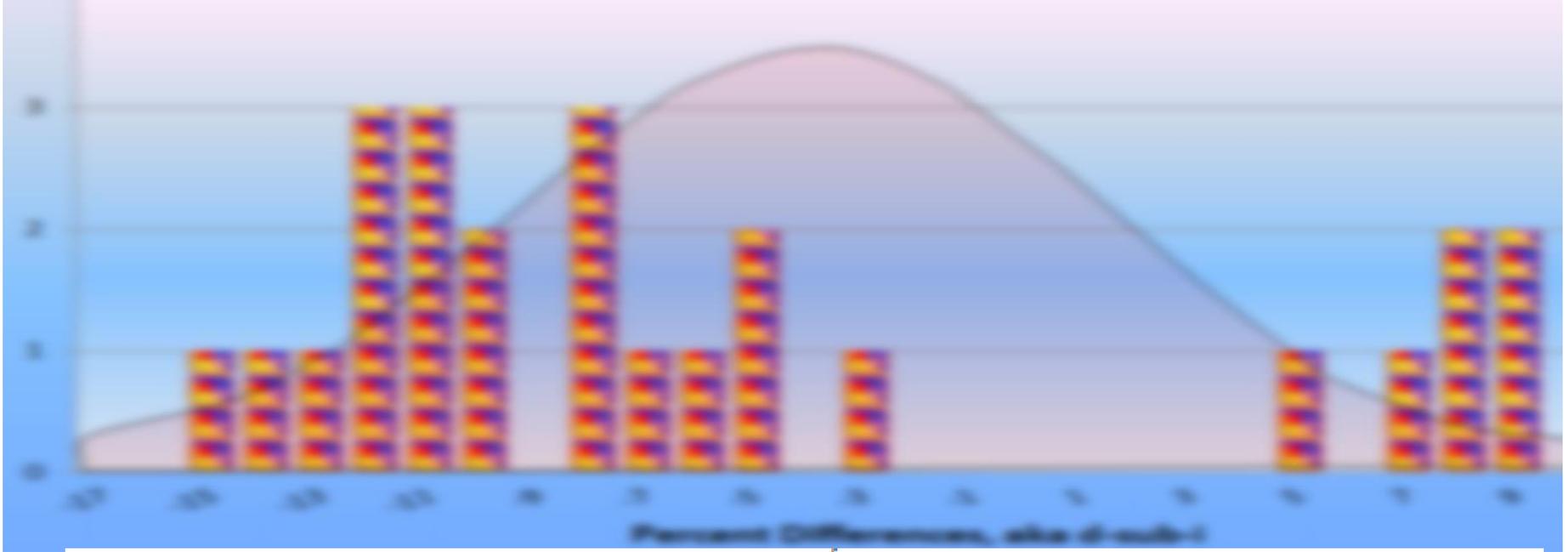


- But we do not care about the low-imprecision tail
- Only care about the extreme tail of high imprecision
- Want to be able to say “**90% confident that your precision is less than** this value”



CFR  
eq'n  
2:

$$Precision\_Estimate = \sqrt{\frac{n \cdot \sum_{i=1}^n d_i^2 - (\sum_{i=1}^n d_i)^2}{n(n-1)}} \cdot \sqrt{\frac{n-1}{\chi_{0.1, n-1}^2}}$$



**STDEV=8.09**

**10% upper tail**

Precision\_Estimate =  $\sqrt{\frac{n \cdot \sum_{i=1}^n d_i^2 - (\sum_{i=1}^n d_i)^2}{n(n-1)}} \cdot \sqrt{\frac{n-1}{\chi_{0.1, n-1}^2}}$

**chi-sqrd(90%) = CHIINV(0.9,n) = 15.65**  
 then  $8.09 \times \text{SQRT}(n-1/15.65) = \mathbf{10.01\%}$

# Use the DASC Tool to Understand Your QC Checks and Audit Results (like EPA does)

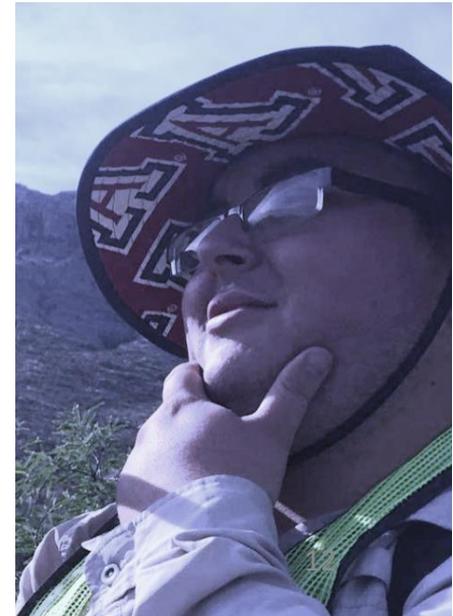
- Calculations of measurement uncertainty are carried out by EPA, *and* PQAOs should report the data for all measurement quality checks
- YOU do these calculations and charts easily, and save yourself time, money, and embarrassment



# We will review each in both the DASC tool and the AMP256 report

## First, what is the DASC tool?

- ▶ DASC tool was produced specifically for us to calculate the data assessment statistics in CFR in AMTIC Quality Indicator Assessment Reports (AMP256)
- ▶ <http://www.epa.gov/ttn/amtic/qareport.html>
- ▶ Easy way to explain and calculate data assessment statistics in CFR
- ▶ Excel spreadsheet
- ▶ Matches AMP256 (by site)
- ▶ Each equation is numbered and matches the numbers in CFR



# DASC Tool:

## O<sub>3</sub> Assessments

Site ID: {Enter Site ID}		Pollutant type: O <sub>3</sub>						CV <sub>ub</sub> (%)	Bias (%)
Meas Val (Y)	Audit Val (X)	d (Eqn. 1)	25th Percentile	d <sup>2</sup>	d	d  <sup>2</sup>			
0.098	0.09	8.889	-11.111	79.012	8.889	79.012			
0.087	0.09	-3.333	<b>75th Percentile</b>	11.111	3.333	11.111	<b>n</b>	<b>S<sub>d</sub></b>	
0.079	0.09	-12.222	-3.333	149.383	12.222	149.383	25	8.089	
0.079	0.09	-12.222		149.383	12.222	149.383	<b>n-1</b>	<b>Σd</b>	
0.081	0.09	-10.000		100.000	10.000	100.000	24	-144.444	
0.08	0.09	-11.111		123.457	11.111	123.457		<b>S<sub>d2</sub></b>	
0.082	0.09	-8.889		79.012	8.889	79.012		59.010	
0.094	0.09	4.444		19.753	4.444	19.753		<b>Σ d </b>	
0.096	0.09	6.667		44.444	6.667	44.444		233.333	
0.097	0.09	7.778		60.494	7.778	60.494		<b>"AB" (Eqn 4)</b>	
0.097	0.09	7.778		60.494	7.778	60.494		9.333	
0.098	0.09	8.889		79.012	8.889	79.012		<b>"AS" (Eqn 5)</b>	
0.08	0.09	-11.111		123.457	11.111	123.457		3.077	
0.08	0.09	-11.111		123.457	11.111	123.457			
0.084	0.09	-6.667		44.444	6.667	44.444			
0.085	0.09	-5.556		30.864	5.556	30.864			
0.085	0.09	-5.556		30.864	5.556	30.864			
0.082	0.09	-8.889		79.012	8.889	79.012			
0.082	0.09	-8.889		79.012	8.889	79.012			
0.078	0.09	-13.333		177.778	13.333	177.778			
0.081	0.09	-10.000		100.000	10.000	100.000			
0.077	0.09	-14.444		208.642	14.444	208.642			
0.083	0.09	-7.778		60.494	7.778	60.494			
0.079	0.09	-12.222		149.383	12.222	149.383			
0.076	0.09	-15.556		242.037	15.556	242.037			

<b>n</b>	<b>S<sub>d</sub></b>	<b>S<sub>d2</sub></b>	<b>Σ d </b>	<b>"AB" (Eqn 4)</b>
25	8.089	59.010	233.333	9.333
<b>n-1</b>	<b>Σd</b>	<b>Σd<sup>2</sup></b>	<b>Σ d <sup>2</sup></b>	<b>"AS" (Eqn 5)</b>
24	-144.444	2404.938	2404.938	3.077

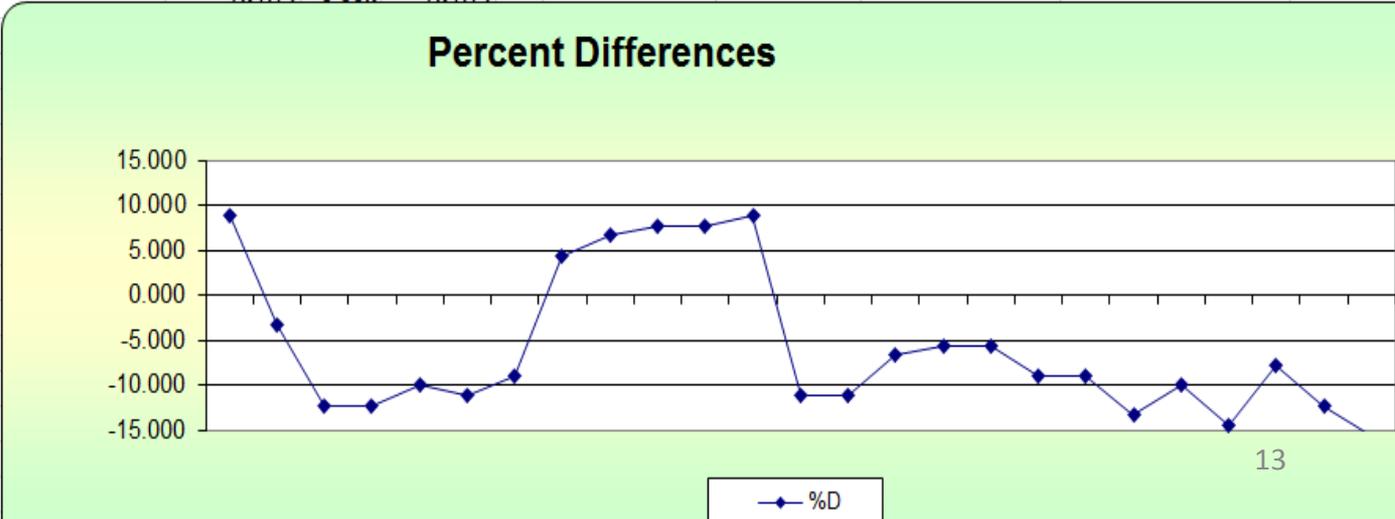
<b>Bias (%) (Eqn 3)</b>	Both Signs Positive
10.39	FALSE
<b>Signed Bias (%)</b>	Both Signs Negative
-10.39	TRUE

**CV (%) (Eqn 2)**  
10.01

<b>Upper Probability Limit</b>	<b>Lower Probability Limit</b>
10.08	-21.63

Return to Main Menu

Print Worksheet



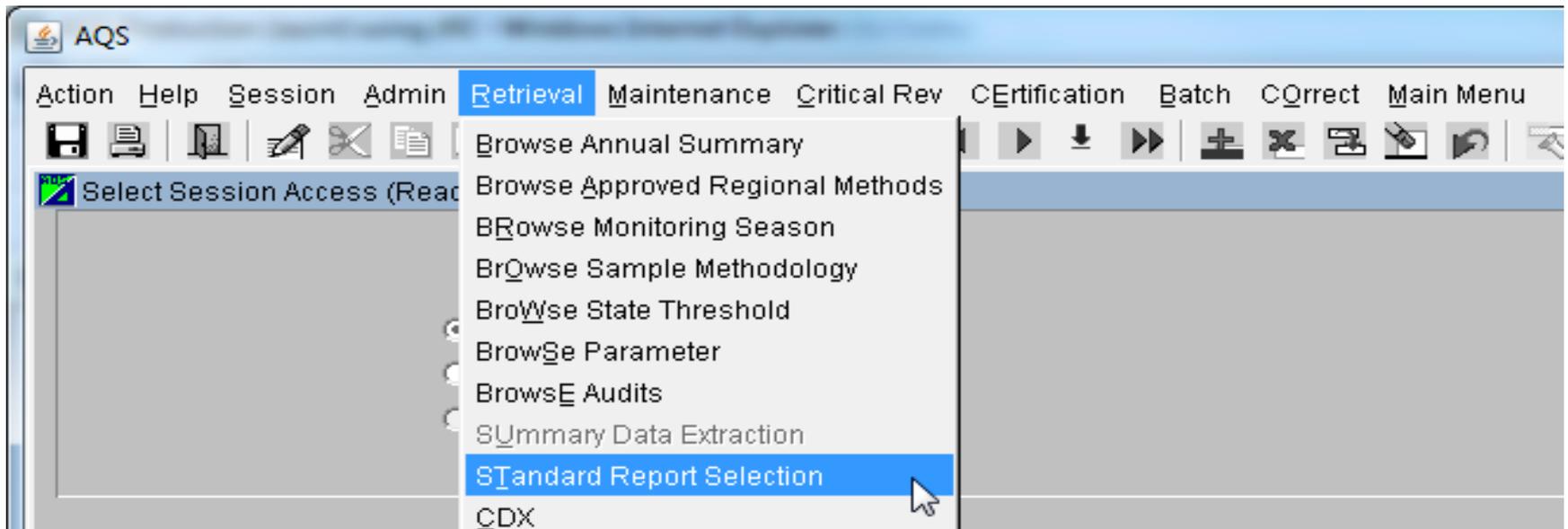
Precision in DASC = cell i13 = **10.01%**

### O<sub>3</sub> Assessments

Plant type: O <sub>3</sub>					CV <sub>ub</sub> (%)	Bias	
n. 1)	25th Percentile	d <sup>2</sup>	d	d  <sup>2</sup>			
8.889	-11.111	79.012	8.889	79.012			
3.333	<b>75th Percentile</b>	11.111	3.333	11.111	<b>n</b>	<b>S<sub>d</sub></b>	<b>S<sub>d2</sub></b>
2.222	-3.333	149.383	12.222	149.383	25	8.089	59.010
2.222		149.383	12.222	149.383	<b>n-1</b>	<b>Σd</b>	<b>Σd<sup>2</sup></b>
0.000		100.000	10.000	100.000	24	-144.444	2404.938
1.111		123.457	11.111	123.457			
8.889		79.012	8.889	79.012			<b>Bias</b>
4.444		19.753	4.444	19.753			
6.667		44.444	6.667	44.444		<b>CV (%) (Eqn 2)</b>	<b>Signe</b>
7.778		60.494	7.778	60.494		10.01	-10.3
7.778		60.494	7.778	60.494			
8.889		79.012	8.889	79.012		<b>Upper Probability Limit</b>	<b>Lower</b>
1.111		123.457	11.111	123.457		10.08	
1.111		123.457	11.111	123.457			

# AMP256-Data Quality Indicators Report

- AQS Standard Report to Compute the Statistics Outlined on 40 CFR Part 58 Appendix A
- Part of the Annual Certification Process to Verify Submission of QA and routine Data to AQS



- **CORRESPONDS** to what you can calculate in the DASC spreadsheet, as we will see.

# Does our **10.01%** match AMP256?

## DATA QUALITY INDICATOR REPORT

### One Point Quality Control

Site IDs	POC	MT	Begin Date	End Date	Intervals Required	Valued Intervals	% Complete	CV UB
	1	SP	01-JAN-14	31-DEC-14	12	9	75	10.01
	1	SP	01-JAN-14	31-DEC-14	13	10	77	10.01
SUMMARY			01-JAN-14	31-DEC-14	25	19	76	10.01
SUMMARY			01-JAN-14	31-DEC-14	25	19	76	10.01

- **90% Confidence Upper Bound of precision is 10.01%**
- “There is a 90% chance that our precision will not be greater than 10%”
- Same as YOU can calculate any time using the **DASC**

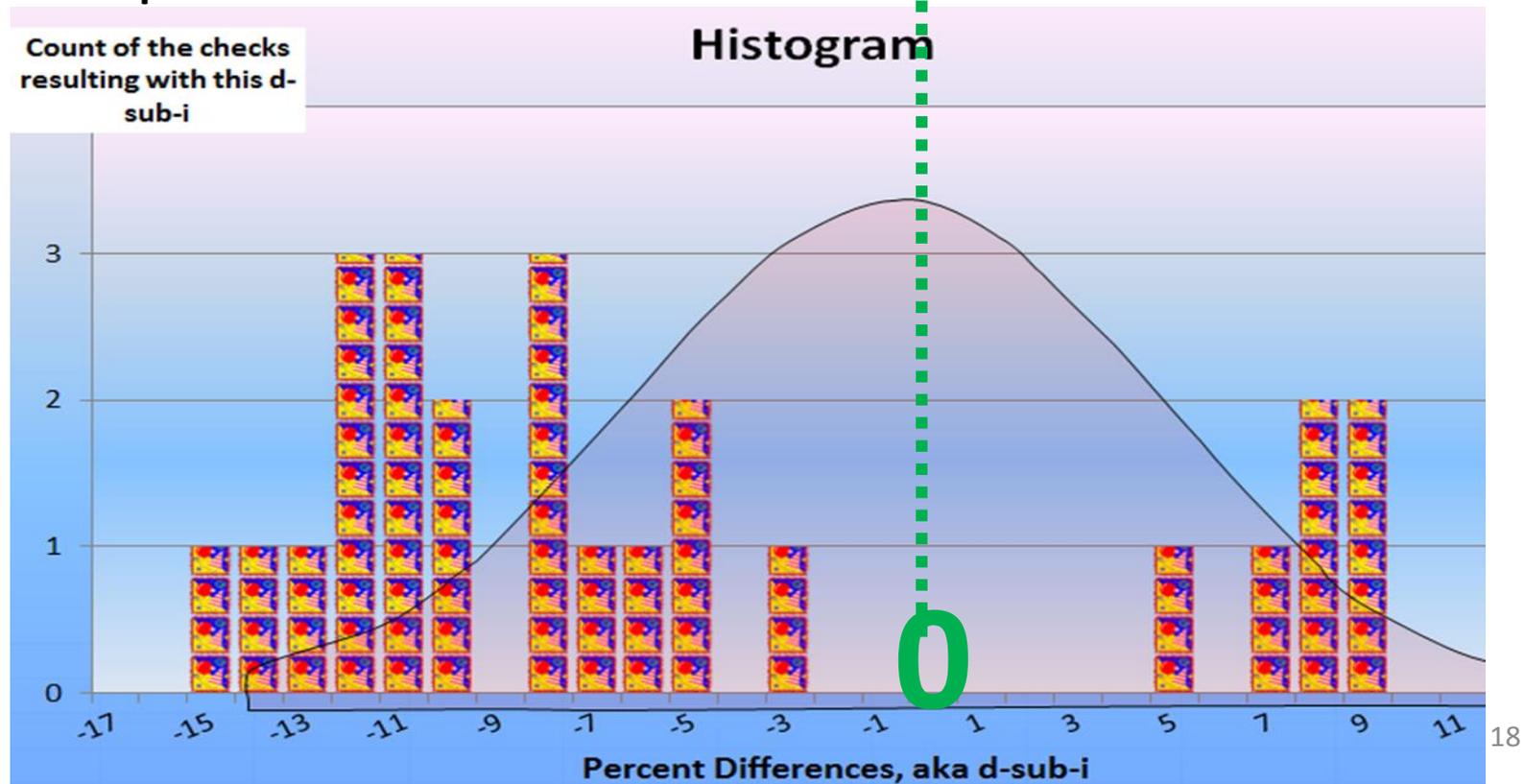
# Summary of precision:

- Calculated from routine QC checks  $d_i$
- Overall upper bound of CV calculated from  $d_i$
- you can be **90% sure that your true precision is less than** this “upper bound of the CV” (eq’n 2)



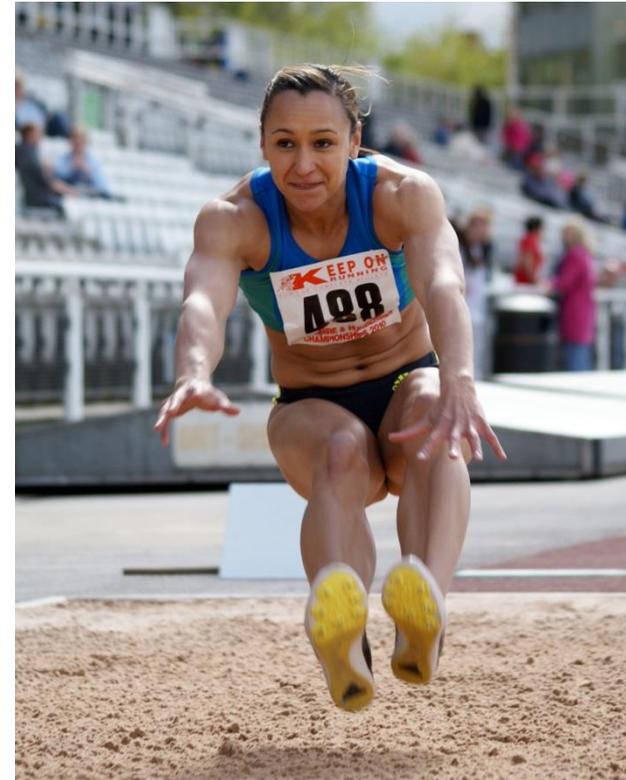
# Bias:

- FINALLY look at **where** we are on the x-axis
- (Remember precision only cares about width)
- The goal for acceptable measurement uncertainty for **bias** is an upper 95 percent confidence limit for the absolute bias of 7 percent.



# Bias statistics (CFR App A, 4.1.3):

- Remember that bias as well as precision starts from the difference between your instrument's indicated value and the known (audit) value, as
- $(\text{meas} - \text{known}) / \text{known} = d_i$
- bias (jump) is calculated from  $d_i$
- Bias just *based on* the *AVERAGE* of the  $d_i$  with the sign taken into account (if your analyzer is always higher than the known, you have a high ( + ) bias)



## Bias in CFR eq'n 3:

$$|bias| = AB + t_{0.95, n-1} \cdot \frac{AS}{\sqrt{n}}$$

**AB** is the mean of the absolute values of the  $d_i$ 's = **9.3**

$t_{0.95, n-1}$  is the 95th quantile of a  $t$ -distribution  
= **TINV(2\*0.05, n-1) = 1.71**

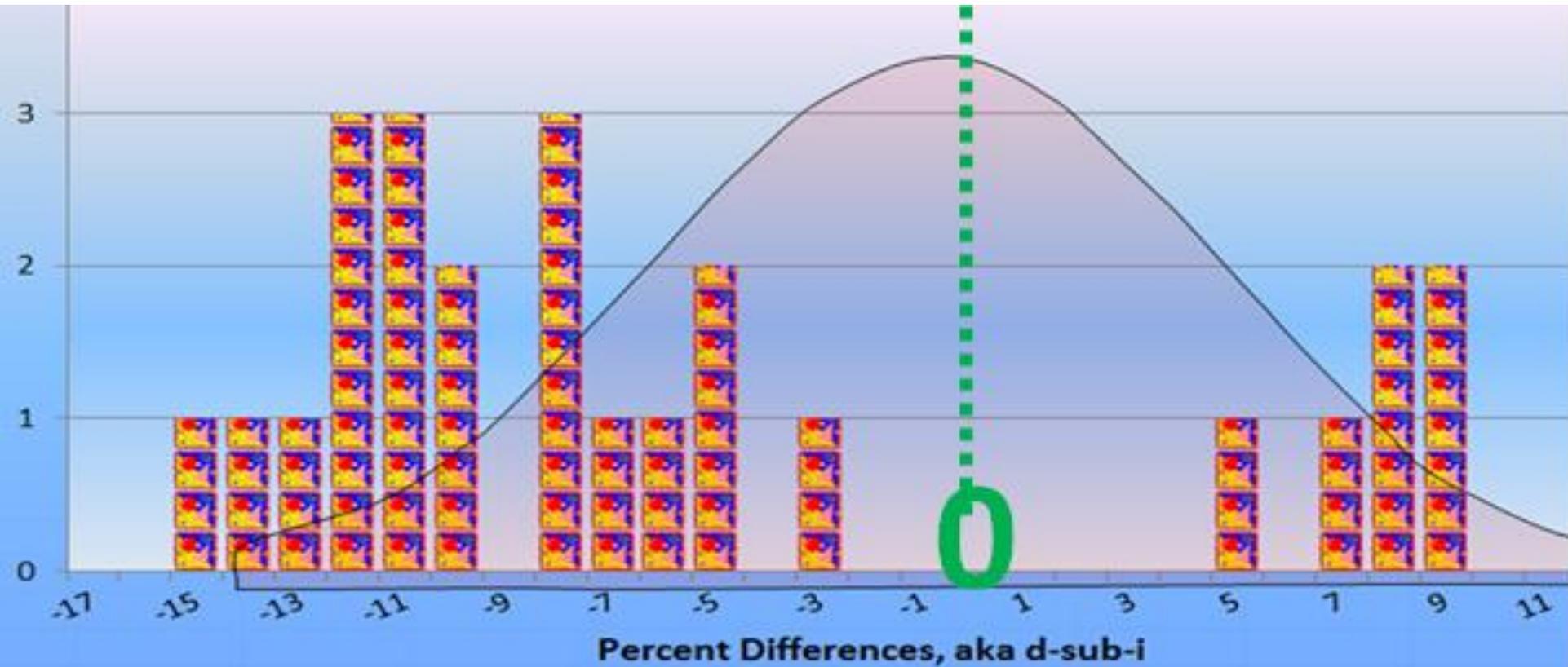
**AS** is the STDEV of the abs value of these  $d_i$ 's = **3.08**

So

Abs value of bias = **9.3 + 1.71 \* (3.08/sqrt of n)**  
= **10.39 (!)**

Thanks Shelly  
Eberly!

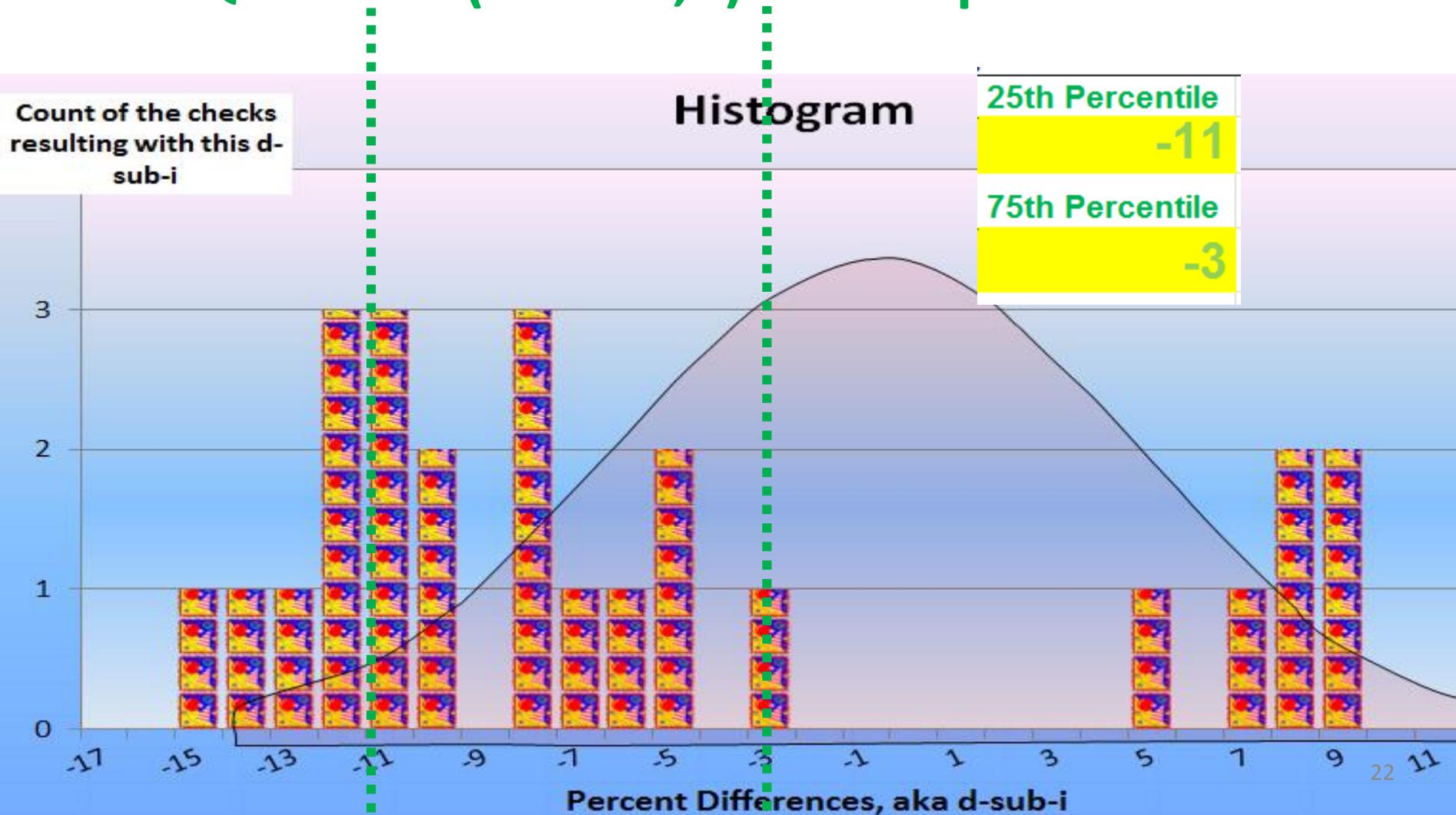
That 10.39 is the abs value of bias, now what's its sign?



- Look at 25% quartile and 75% quartile
- If they straddle zero, bias is unsigned
- If they're both negative, bias is negative
- If they're both positive, bias is positive

# Quartiles?

- =QUARTILE(d-sub-i,1) = 25% quartile = -11
- =QUARTILE(d-sub-i,3) = 75% quartile = -3



# DASC bias in cell k13:

- Both quartiles are negative
- Bias is negative 10.4 = **-10.4**
- Agrees with DASC:

Pollutant type: O <sub>3</sub>					CV <sub>ub</sub> (%)	Bias (%)			
d (Eqn. 1)	25th Percentile	d <sup>2</sup>	d	d  <sup>2</sup>					
9	-11.111	79.012	8.889	79.012					
-3	75th Percentile	11.111	3.333	11.111	n	S <sub>d</sub>	S <sub>d2</sub>	Σ d	"AB" (Eqn 4)
-12	-3.333	149.383	12.222	149.383	25	8.089	59.010	233.333	9.333
-12		149.383	12.222	149.383	n-1	Σd	Σd <sup>2</sup>	Σ d  <sup>2</sup>	"AS" (Eqn 5)
-10		100.000	10.000	100.000	24	-144.444	2404.938	2404.938	3.077
-11		123.457	11.111	123.457					
-9		79.012	8.889	79.012				Bias (%) (Eqn 3)	Both Signs Positive
4		19.753	4.444	19.753				10.39	FALSE
7		44.444	6.667	44.444	CV (%) (Eqn 2)			Signed Bias (%)	Both Signs Negative
8		60.494	7.778	60.494	10.01			<b>-10.39</b>	TRUE <sup>23</sup>

# Does this match AQS standard report AMP256 ?:

## DATA QUALITY INDICATOR REPORT

### One Point Quality Control

Aug. 2, 2016

App A? Y

POC	MT	Begin Date	End Date	Intervals Required	Valued Intervals	% Complete	CV UB	Bias UB
1	SP	01-JAN-14	31-DEC-14	12	9	75	10.01	- 10.39
1	SP	01-JAN-14	31-DEC-14	13	10	77	10.01	- 10.39
		01-JAN-14	31-DEC-14	25	19	76	10.01	- 10.39
		01-JAN-14	31-DEC-14	25	19	76	10.01	- 10.39

Bias UB (*upper bound of bias*) = **-10.39**

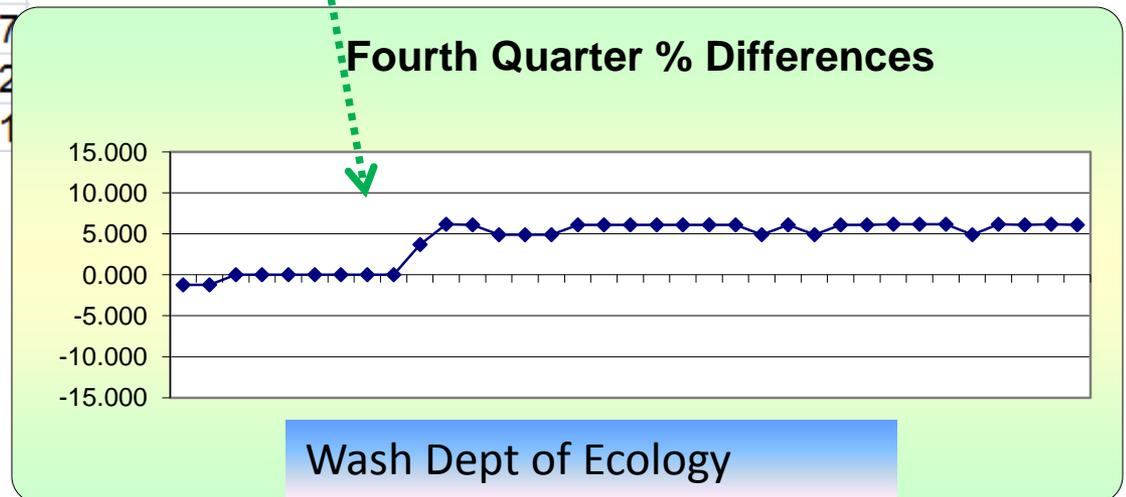
(*goal is upper 95 percent confidence limit for the absolute bias of 7 percent*)



Both bias and precision are in the same sheet (O3 P&B) in the DASC and use the same input:

Meas Val (Y)	Audit Val (X)	$d_i$ (Eqn. 1)
0.08	0.081	-1.2
0.08	0.081	-1.2
0.081	0.081	0.0
0.081	0.081	0.0
0.081	0.081	0.0
0.081	0.081	0.0
0.081	0.081	0.0
0.081	0.081	0.0
0.081	0.081	0.0
0.081	0.081	0.0
0.084	0.081	3.7
0.086	0.081	6.2
0.087	0.082	6.1

**YOU can calculate Bias over any time period using DASC**



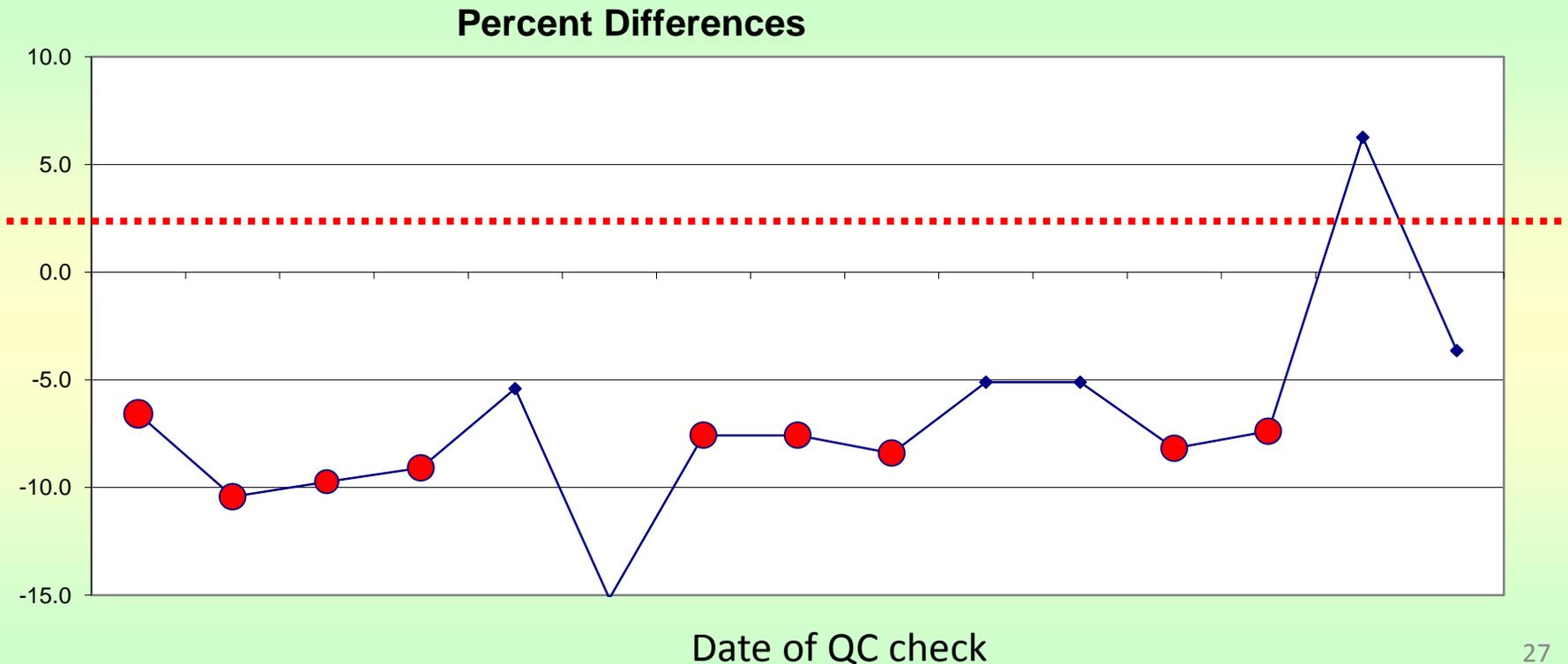
# Summary of gas **bias**:

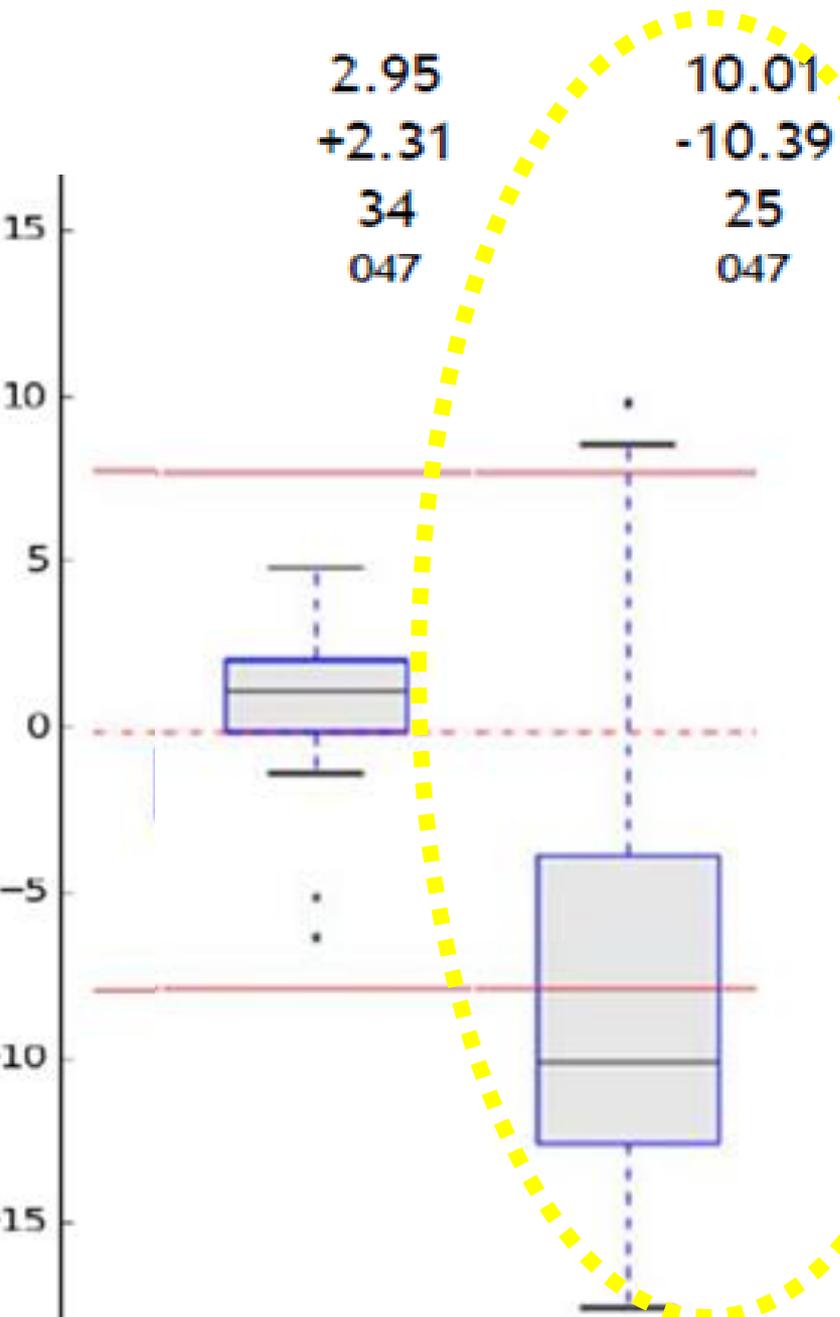
- Calculated from routine QC checks  **$d_i$**
- Overall upper limit of **bias** calculated from  **$d_i$**
- Then look at the sign (and the chart) for whether your analyzer is biased high (+) or low (-)
- We are 95% confident that our 03 bias is less extreme than **-10%**



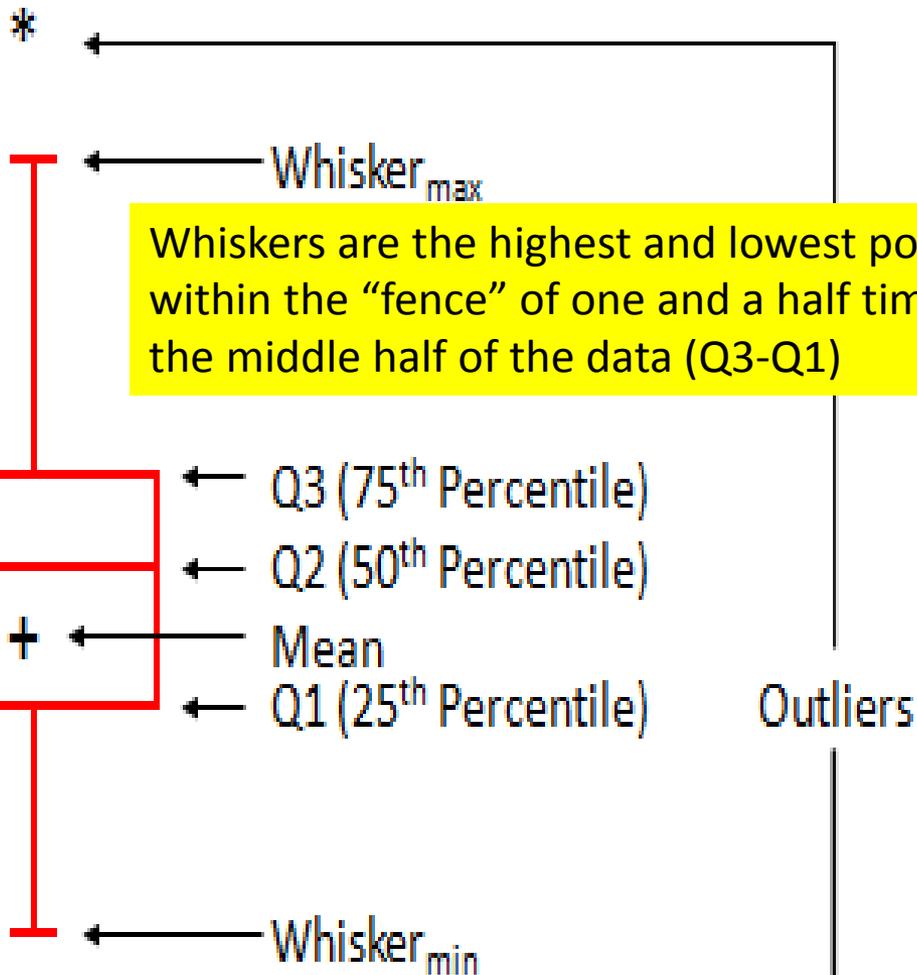
# Do I invalidate pollutant data based on d-sub-i?

- Validation tables in QA Handbook:
  - Critical Measurement Quality Objective O3=7%
  - See problems ahead of time by identifying trends in a control chart:





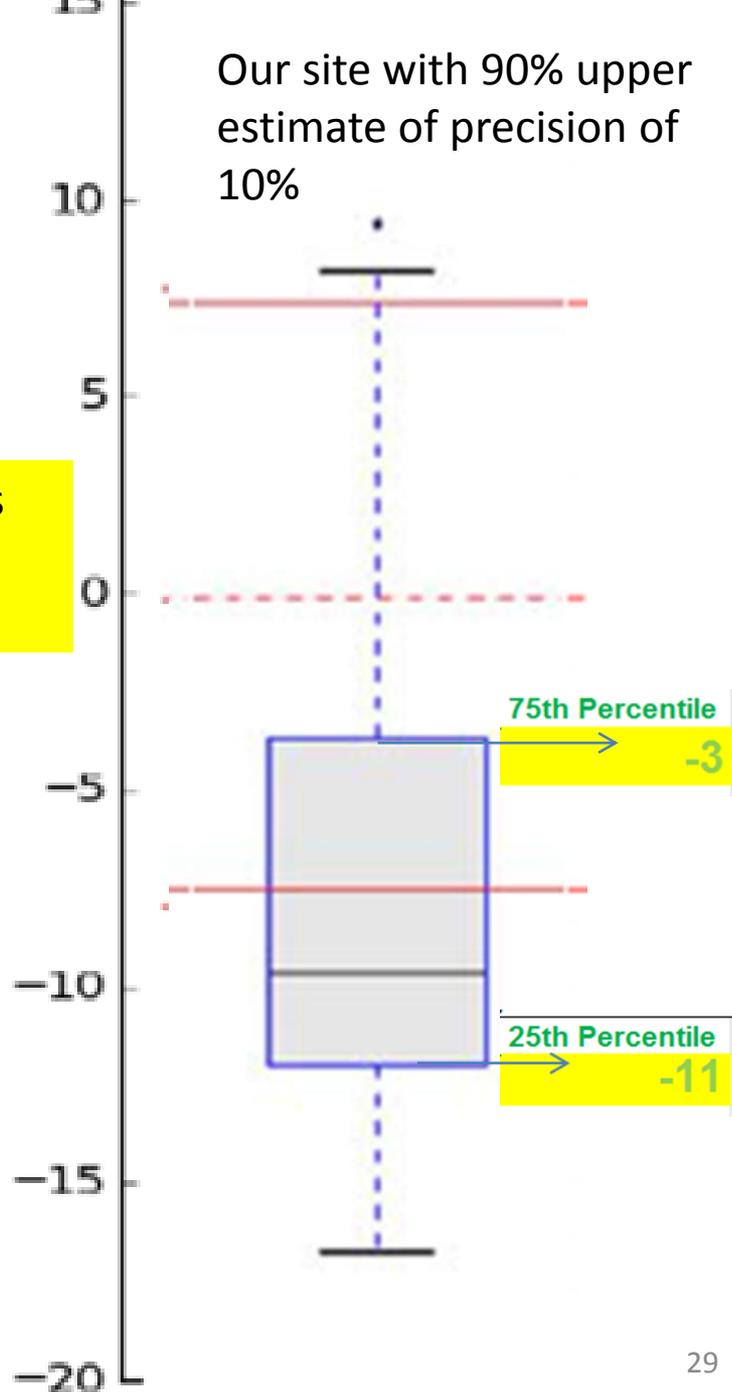
Box and whisker charts show this faster—compare our site on the right with a different CA site



Whiskers are the highest and lowest points within the "fence" of one and a half times the middle half of the data (Q3-Q1)

Outliers

Asterisks are "outliers" that are outside the "fence"



# PM<sub>2.5</sub> Precision

- PM2.5 is the same as gaseous, except:
  - d-sub-i are from COLLOCATED, and the known is the average of the two PM2.5, so d-sub-i is
  - (RO-CO)/(avg of RO & CO)
  - Because the known is the avg of 2 measurements, add **SQRT(2)** to the denominator (divide by best estimate of truth)

$$CV_{ub} = \sqrt{\frac{n \cdot \sum_{i=1}^n d_i^2 - \left(\sum_{i=1}^n d_i\right)^2}{2n(n-1)}} \cdot \sqrt{\frac{n-1}{\chi_{0.1, n-1}^2}}$$

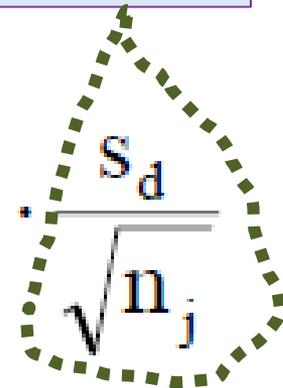
The term  $\sqrt{\frac{n \cdot \sum_{i=1}^n d_i^2 - \left(\sum_{i=1}^n d_i\right)^2}{2n(n-1)}}$  is circled in purple and labeled **STDEV**. The term  $\sqrt{\frac{n-1}{\chi_{0.1, n-1}^2}}$  is circled in red.

That's the only difference in the precision stat from gas stats

# PM<sub>2.5</sub> Bias

- PM<sub>2.5</sub> bias same as gaseous, except:
  - known = PEP audit filter results, so the d-sub-i is the (field-PEP)/PEP
  - Don't take abs value of the d-sub-i
  - D is avg of these d-sub-i values
  - n is # of PEP audits, and if n=3 then t=2.9
    - (as n grows,  $t_{0.95}$  goes to 1.65)
  - Use the 25% and 75% quartiles  $\Rightarrow$  + or -

Std error



A diagram showing the standard error formula  $\frac{S_d}{\sqrt{n_j}}$  enclosed in a dashed green triangle. The text 'Std error' is written in a purple box above the triangle.

Upper 90% Confidence Interval =  $D + t_{0.95,df}$

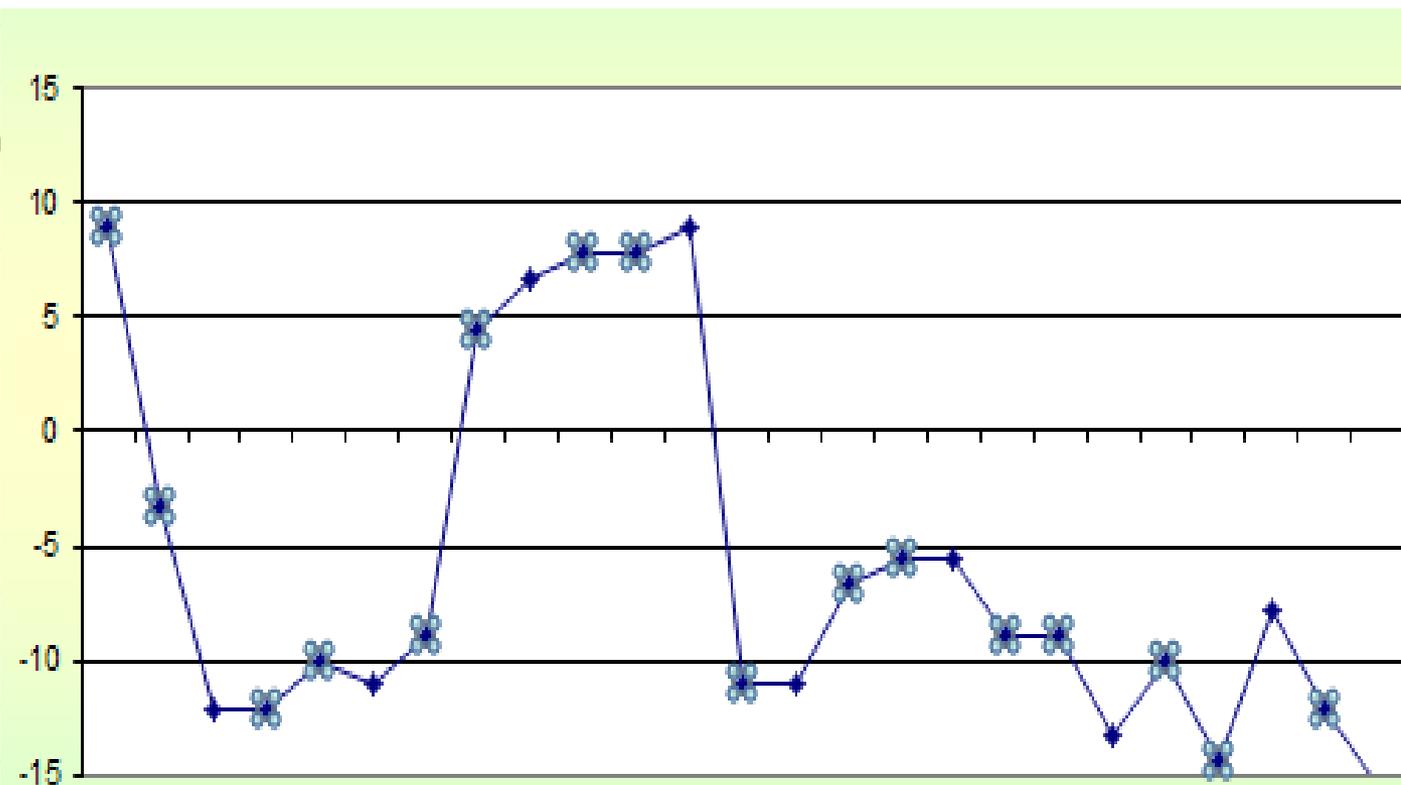
(and the lower confidence interval is  
D minus t\*std error!)

# PM10 statistics:

- Bias confidence intervals based on monthly flow rate (FR) checks:
  - d-sub-i from FR
  - THEN bias statistics are the same as PM2.5
- Flow rate “acceptability” limits are based on 6-month FR audits (with FR audit device not the same one you use for the monthly):
  - Limit =  $D \pm 1.96 * STDEV$

d-sub-i = (sampler-audit\_FR)/audit\_FR  
and D is their average

Meas Val (Y)	Audit Val (Z)	d (Eqn. 1)
98	90	9
87	90	-3
79	90	-12
79	90	-12
81	90	-10
80	90	-11
82	90	-9
94	90	4
96	90	7
97	90	8
97	90	8
98	90	9
80	90	-11
80	90	-11
84	90	-7
85	90	-6
85	90	-6
82	90	-9
82	90	-9
78	90	-13
81	90	-10
77	90	-14
83	90	-8
79	90	-12
76	90	-16



Date of QC check

**Do not overlook the built-in control chart, from which you can tell the story of your QC**

# Thank you!

- Work with Tribal Air Agencies
- Knowledge = Power; Let's Share
  - <http://datatools.tamscenter.com/>
- Melinda Ronca-Battista [melinda.ronca-battista@nau.edu](mailto:melinda.ronca-battista@nau.edu);  
<https://www.youtube.com/c/melindaroncabattista>

