#### NSTA Nashville, April 2016

















#### **Practice 4 Analyzing and Interpreting Data**

Once collected, data must be presented in a form that can reveal any patterns and relationships and that allows results to be communicated to others. Because raw data as such have little meaning, a major practice of scientists is to organize and interpret data through tabulating, graphing, or statistical analysis. Such analysis can bring out the meaning of data—and their relevance—so that they may be used as evidence.

Engineers, too, make decisions based on evidence that a given design will work; they rarely rely on trial and error. Engineers often analyze a design by creating a model or prototype and collecting extensive data on how it performs, including under extreme conditions. Analysis of this kind of data not only informs design decisions and enables the prediction or assessment of performance but also helps define or clarify problems, determine economic feasibility, evaluate alternatives, and investigate failures. (NRC Framework, 2012, p. 61-62)

As students mature, they are expected to expand their capabilities to use a range of tools for tabulation, graphical representation, visualization, and statistical analysis. Students are also expected to improve their abilities to interpret data by identifying significant features and patterns, use mathematics to represent relationships between variables, and take into account sources of error. When possible and feasible, students should use digital tools to analyze and interpret data. Whether analyzing data for the purpose of science or engineering, it is important students present data as evidence to support their conclusions.

Analyzing data in K-2 builds on prior experiences and progresses to introducing and progresses to introducing and progresses to introducing multiple trials of conducting multiple trials of data and error analysis.  When possible and feasible, distinguishing between correlation and causation, and basic statistical tendingues of data and/or interpret graphical displays of data and/or large data sets to identify linear and nonlinear relationships.  **Onservations**  **Onservations**  **Analyze and interpret data to provide evidence for phenomena.**  **Analyze and interpret data to provide evidence for phenomena.**  **Analyze and interpret data to determine a problems statement or the design of a proposed object, tool, or process.**  **Analyze and interpret data to determine a problem statement or the design of a proposed object, tool, or process.**  **Analyze and interpret data to determine a problem statement or the design o	Grades K-2	Grades 3-5	Grades 6-8	Grades 9-12
criteria for success.  system to optimize it relative to criteria for success.	builds on prior experiences and progresses to collecting, recording, and sharing observations.  Record information (observations, thoughts, and ideas).  Use and share pictures, drawings, and/or writings of observations.  Use observations (firsthand or from media) to describe patterns and/or relationships in the natural and designed world(s) in order to answer scientific questions and solve problems.  Compare predictions (based on prior experiences) to what occurred (observable events).  Analyze data from tests of an object or tool to determine if it works as	on K-2 experiences and progresses to introducing quantitative approaches to collecting data and conducting multiple trials of qualitative observations.  When possible and feasible, digital tools should be used.  Represent data in tables and/or various graphical displays (bar graphs, pictographs and/or pie charts) to reveal patterns that indicate relationships.  Analyze and interpret data to make sense of phenomena, using logical reasoning, mathematics, and/or computation.  Compare and contrast data collected by different groups in order to discuss similarities and differences in their findings.  Analyze data to refine a problem statement or the design of a proposed object, tool, or process.  Use data to evaluate and	experiences and progresses to extending quantitative analysis to investigations, distinguishing between correlation and causation, and basic statistical techniques of data and error analysis.  Construct, analyze, and/or interpret graphical displays of data and/or large data sets to identify linear and nonlinear relationships.  Use graphical displays (e.g., maps, charts, graphs, and/or tables) of large data sets to identify temporal and spatial relationships.  Distinguish between causal and correlational relationships in data.  Analyze and interpret data to provide evidence for phenomena.  Apply concepts of statistics and probability (including mean, median, mode, and variability) to analyze and characterize data, using digital tools when feasible.  Consider limitations of data analysis (e.g., measurement error), and/or seek to improve precision and accuracy of data with better technological tools and methods (e.g., multiple trials).  Analyze and interpret data to determine similarities and differences in findings.  Analyze data to define an optimal operational range for a proposed object, tool, process or system that best meets	experiences and progresses to introducing more detailed statistical analysis, the comparison of data sets for consistency, and the use of models to generate and analyze data.  • Analyze data using tools, technologies, and/or models (e.g., computational, mathematical) in order to make valid and reliable scientific claims or determine an optimal design solution.  • Apply concepts of statistics and probability (including determining function fits to data, slope, intercept, and correlation coefficient for linear fits) to scientific and engineering questions and problems, using digital tools when feasible.  • Consider limitations of data analysis (e.g., measurement error, sample selection) when analyzing and interpreting data.  • Compare and contrast various types of data sets (e.g., self-generated, archival) to examine consistency of measurements and observations.  • Evaluate the impact of new data on a working explanation and/or model of a proposed process or system.  • Analyze data to identify design features or characteristics of the components of a proposed process or system to optimize it relative to

#### **Analyzing and Interpreting Data Practice 4**

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skills

verbs

products

tools

## High School

Complex analysis

Chi squared

Scatterplots

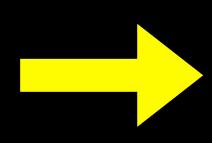
Statistical analysis

Computer simulations

Large Pata Sets



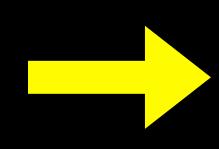




0 Heads



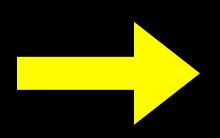




1 Head

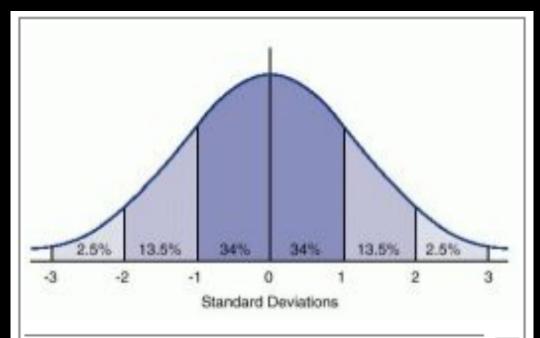






2 Heads





Normal distribution. The approximate percentage of the area (or frequency) lying under the curve between standard deviations is indicated.



#### Natural Artificial Light (cm)

-		В
2	46	45
3	46	45
4	46	46
5	47	47
6	47	48
7	47	49
8	48	51
9	49	52
10	49	54
11	50	51
12	50	55
13	50	54
14	51	58
15	51	57
16	52	58
17	52	48
18	52	57
19	52	61
20	53	61
21	53	60
22	54	55
23	54	58
24	54	54
25	55	55
26	55	64
27	55	63
28	56	62
29	56	63
30	56	58
31	57	62
32	57	60
33	57	58
34	59	57
35	59	55
36	59	58
37	59	55
38	59	52
39	60	55
40		
41		
42	52.94736842	55.28947368
43		
44		





Plants under natural light

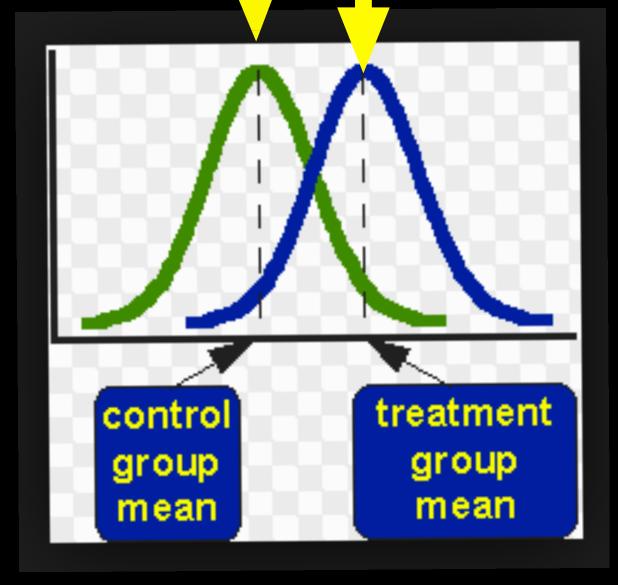
mean=52.9 cm

Plants under artificial light

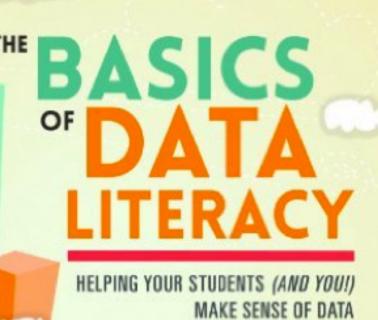
mean=55.3 cm

Plants under natural light

Plants under artificial light



t-test



MICHAEL BOWEN ANTHONY BARTLEY

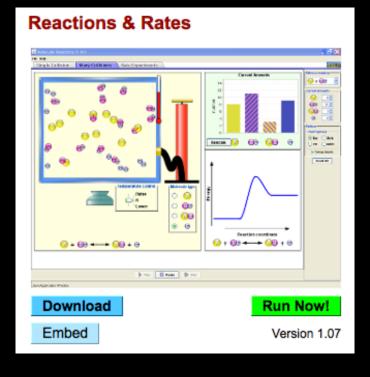


Home Donate Statistical Test Calculators Quick P Value Calculators About Contact Student T-Test Calculator for 2 Independent Means The Calculator Enter your sample values into the text boxes below, either one value per line or as a comma delimited list. Population/Group 1 Population/Group 2 Significance Level: 95% confidence  $\bigcirc$ 0.01 0.05 0.10One-tailed or two-tailed hypothesis?: One-tailed Two-tailed The T-value is 2.133927. The P-Value is 0.03616. The result is significant at p < 0.05. Calculate T and P Values Reset

# Plinko Probability N=309 R=72941 p=77 S=201 v=128 Download Run Now! Version 2.02

# Computer simulations Large Data Sets







## Science Teacher Summer 2015

#### The Graph Choice Chart. The Graph Choice. The Science What question would you like to explore? Write your question as a complete sentence. Teacher. Nov. 2014, p. 40. Does your question FREQUENCY ask about the variability of d. like . L either DOT PLOT PLOT make a 1. Do all high tides rise to the same height? a group of data points? measurement values How variable are windspeeds here? YES -3. What is the range and distribution of incomes (i.e. the range of the data, For each group the shape of the distribution, HISTOGRAM HISTOGRAM make a or what the center of the data is) Do you want to compare the variability Examples: Which of the two car designs is most of all data points in each group to **BOX PLOT** measurement unlars consistently the fastest? decide if any difference between the Is there a meaningful difference in the heights of fertilized and unfertilized bean plants? groups is meaningful? BOX PLOTS Does your question compare di two or more groups to YES Are you comparing decide if the groups are 1. Was the total snowfall greater this single numbers that the same or different? winter than last winter? - make a → BAR GRAPH summarize a group? 2. Do cats and dogs have the same (such as mean, median, average body temperature ? or total...) 3. How do the median incomes for the U.S. and Sweden compare? Does it ask if Examples: 1. Is the fuel efficiency of a car related to its weight? two numeric factors are Are smoking rates correlated with median income? make a - SCATTER PLOT correlated? 3. Given a fixed volume, how are temperature and pressure related? Does it ask about Is the temperature inside the how something changes YEShouse correlated with the through linear TIME? temperature outside? How did electricity used by the 1. Have summer lake water temperatures warmed kitchen circuit fluctuate during make a - LINE GRAPH YES over the last ten years? the past week? 2. How did my weight change over the last 3 months? LINE GRAPH PIE CHART unear time PIE CHART Does your question ask how 1. Which circuit accounts for the largest proportion of the electricity use by our household? 2. What proportion of U.S. energy comes a total is proportioned into sub-groups? YESmake either from wind? (Or what proportion STACKED 3. What proportion of U.S. residents take public STACKED BAR CHART a sub-group is of a total?) transportation to work?

#### Crosscutting Concepts





Analyzing data in 9-12 builds on K-8 and progresses to introducing	g m	ore	de	taile	ed statistical analysis, the comparison of
data sets for consistency, and the use of models to generate and analyze data.					
Use tools, technologies, and/or models (e.g., computational,					
mathematical) to generate and analyze data in order to make valid and					
reliable scientific claims or determine an optimal design solution.					
Consider limitations (e.g., measurement error, sample selection) when					
analyzing and interpreting data.					
Determine function fits to data, including slope, intercept, and					
correlation coefficient for linear fits.					
Compare and contrast various types of data sets (e.g., self-generated,					

Adapted from Brunsell E, Kneser D, Niemi K (2014), Introducing Teachers and Administrators to the NGSS. NSTA Press: Arlington, VA

# Middle School Display, Analyze, Interpret

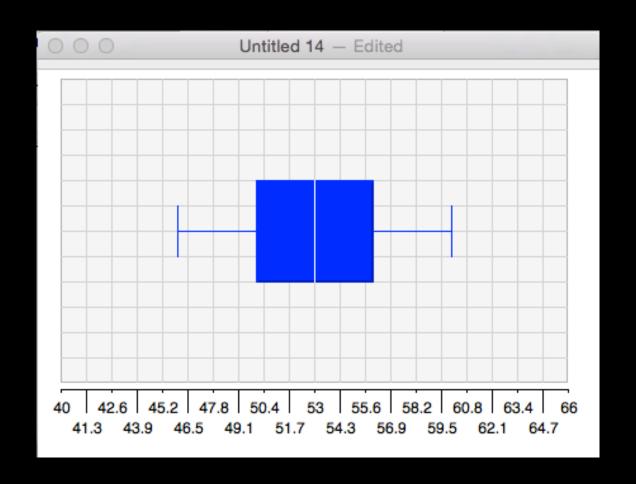
Graphing

Outliers

Averaging

Measurement Error

#### Box and Whisker Plots

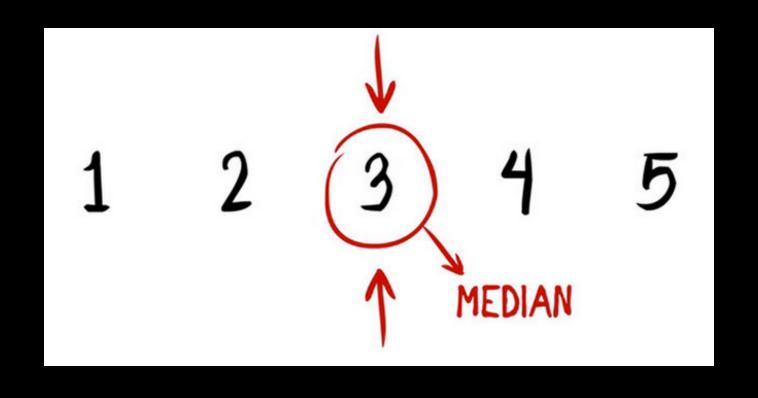


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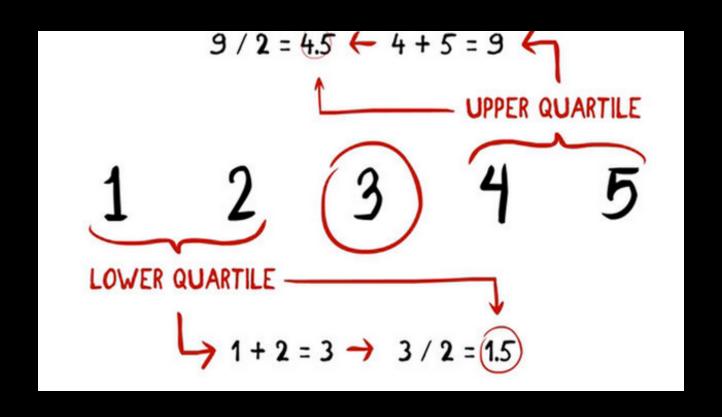
L ----> G

1 2 3 4 5

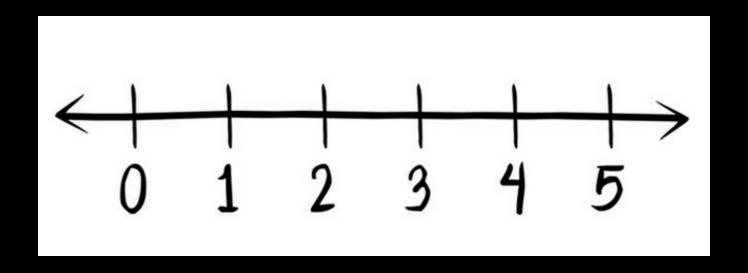
Circle Middle Number



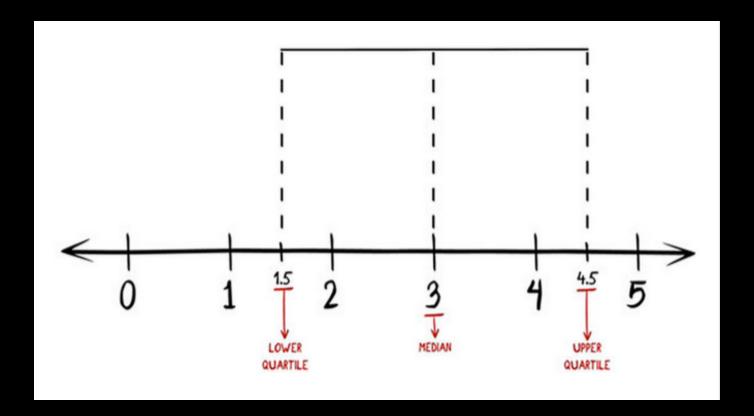
Find 1st/3rd Quartile



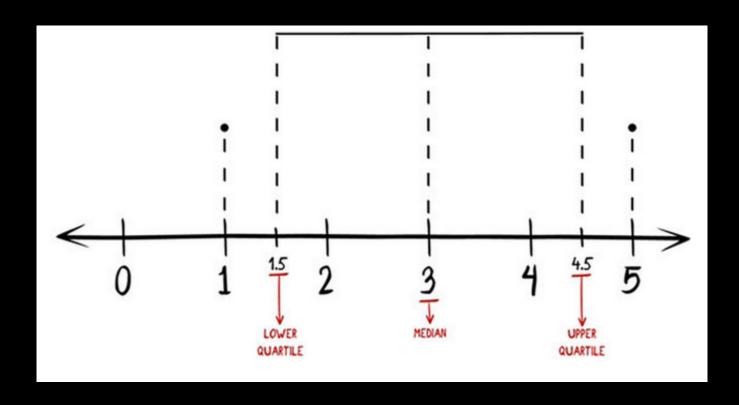
#### Draw a Plot Line



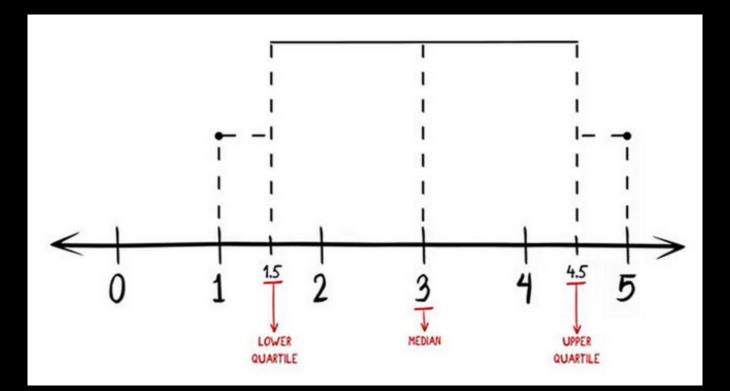
Mark 1st, 2nd, 3rd Quartiles on Line

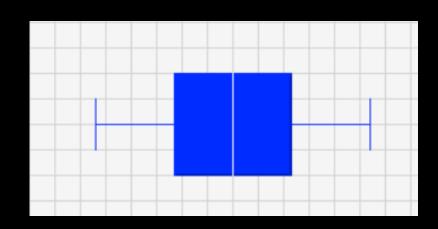


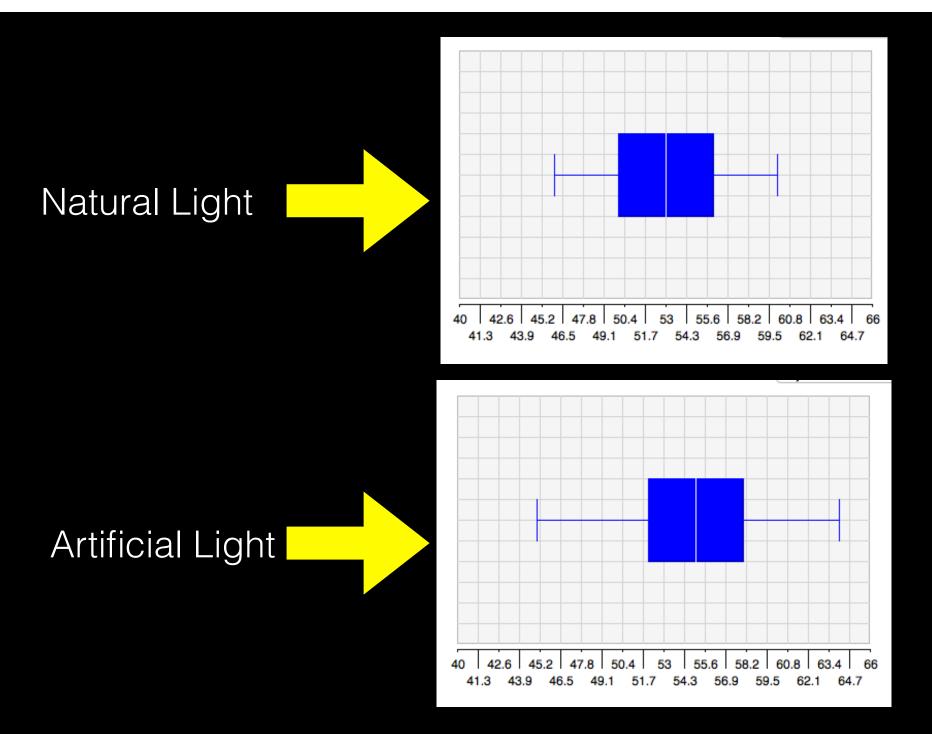
#### Mark Outliers



#### Connect Outliers w/ Horizontal Line







http://www.shodor.org/interactivate/activities/BoxPlot/



OLD FAITHFUL ERUPTION 2/27

	OCE	) FAII	H- U	LER	UPTION		,
>	_	Day	DA	1	of gard	tion	4
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	1111	Duration (sec)	Interval (min)	9/14/99	9:23	236	A C
9/1/99	9:03	253	83	9/14/99	10:48	241	91
9/1/99	10:31	247	88	9/14/99	12:07	255	85
9/1/99	11:57	255	86	9/14/99	13:28	237	79
9/1/99	13:25	276	88	9/14/99	14:54	215	81
9/1/99	14:55	256	90	9/14/99	16:13	247	86 79
9/1/99	16:29	251	94	9/14/99	17:42	237	89
9/1/99	17:59	1260	90	9/14/99	19:05	240	83
9/1/99	19:27	242	88	9/15/99	10:41	240	89
9/3/99	9:02	250	83	9/15/99	12:05	245	84
9/3/99	10:22	244	80	9/15/99	13:26	228	81
9/3/99	11:55	239	93	9/15/99	14:46	235	80
9/3/99	13:22	. 240	87	9/15/99	16:13	261	87
9/3/99	14:52	253	90	9/15/99	17:18	122	65
9/3/99	16:17	238	85	9/16/99	10:28	256	90
9/3/99	17:51	248	94	9/16/99	11:55	242	87
9/3/99	19:19	264	88	9/16/99	13:21	224	86
9/7/99	9:22	262	92	9/16/99	14:43	247	82
9/7/99	10:50	250	88	9/16/99	16:17	257	94
9/7/99	12:22	249	92	9/16/99	17:37	238	80
9/7/99	13:50	252	88	9/16/99	19:00	235	83
9/7/99	15:15	245	87	9/19/99	10:15	255	89
9/7/99	16:42	252	51	9/19/99	11:40	261	85
9/7/99	17:33	107	86	9/19/99	12:40	120	60
9/7/99	18:59	271	86	9/19/99	14:13	261	93
9/9/99	11:05	274	104	9/19/99	17:01	247	77
9/9/99	12:25	254	80	9/19/99	18:08	119	67
9/9/99	13:52	254	87	9/21/99	10:19	150	65
9/9/99	15:10	239	78	9/21/99	11:54	261	95
9/9/99	16:39	247	89	9/21/99	13:21	244	87
9/9/99	17:58	224	79	9/21/99	14:47	235	86
9/9/99	19:25	249	87	9/21/99	16:15	250	88
9/11/99	14:12	248	82	9/21/99	17:36	246	81
9/11/99	15:32	233	80	9/21/99	19:09	265	93
9/11/99	17:09	260	97	9/25/99	10:56	261	94
9/11/99	18:42	243	93	9/25/99	12:34	266	98
9/12/99	10:57	235	96	9/25/99	14:08	270	94
9/12/99	12:15	267	78	9/25/99	15:29	267	81
9/12/99	14:59	243	85	9/25/99	16:54	251	85
9/12/99	16:30	235	91	9/25/99	18:20	247	86
9/12/99	17:47	207	77	8/1/99	11:00	254	91
9/12/99	19:25	248	98	8/1/99	12:24	255	84
9/13/99	11:00	230	82	8/1/99	13:33	131	69
9/13/99	12:23	257	83	8/1/99	15:04	272	91
9/13/99	13:45	194	82	8/1/99	16:29	244	85
9/13/99	15:13	189	88	8/1/99	17:59	260	90
9/13/99	16:34	236	81	8/1/99	19:29	254	90
9/13/99	17:37	110	63	8/6/99	10:01	256	95
9/13/99	19:11	259	94	8/6/99	11:24	260	83



#### TEXAS INSTRUMENTS

#### TI-83 Plu





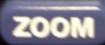
FORMAT PO CALC





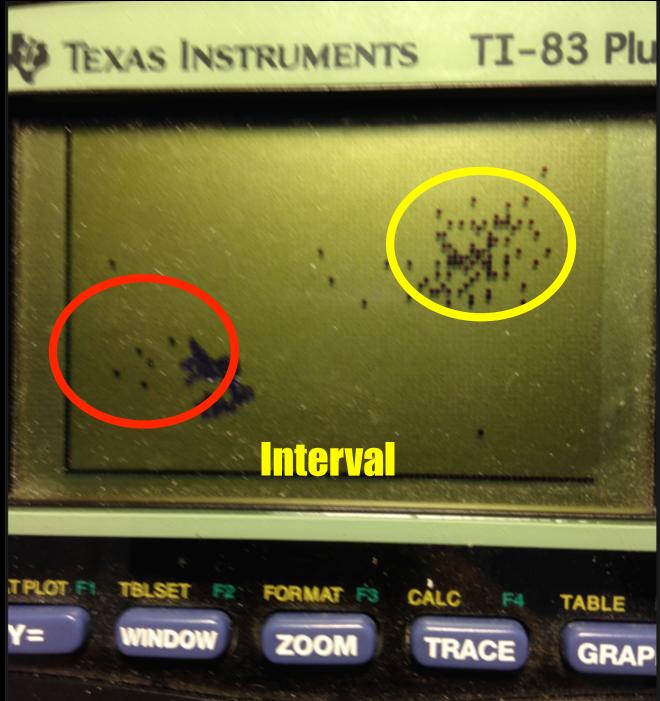
TABLE







GRAP



### http://www.geysertimes.org/

#### Old Faithful Geyser

Recent Activity

Notes

Links

Attachments

Last Known
Eruption

Show 20 \$\displayses \text{entries}\$

Eruption

Th 0m ago

Duration

Interval \$\displayses \text{Min} \text{Max} \text{Mean} \text{Max} \text{Mean} \text{Mea

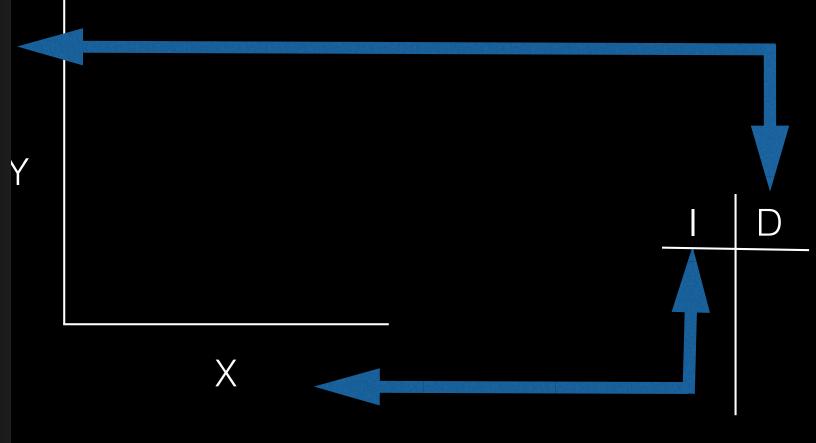
Interval Statistic	cs
# of Intervals	100
Min	55m
Max	21h 20m
Mean	2h 33m
Median	1h 33m

Baselines

Show 20 \$ entries		
Eruption	Duration	Interval
21 Jan 2015 @ 1451 wc		1h 31m
21 Jan 2015 @ 1320 wc		1h 37m
21 Jan 2015 @ 1143 wc		1h 3m
21 Jan 2015 @ 1040 wc		1h 44m
21 Jan 2015 @ 0856 wc long		1h 4m
21 Jan 2015 @ 0752 wc		1h 31m
21 Jan 2015 @ 0621 wc		13h 46m
20 Jan 2015 @ 1635 wc long		1h 25m
20 Jan 2015 @ 1510 wc long		1h 44m
20 Jan 2015 @ 1326 wc long		1h 30m
20 Jan 2015 @ 1156 wc long		1h 37m
20 Jan 2015 @ 1019 wc long		1h 0m
20 Jan 2015 @ 0919 wc short		1h 30m
20 Jan 2015 @ 0749 wc long		1h 26m
20 Jan 2015 @ 0623 ie		12h 35m
19 Jan 2015 @ 1748 wc		1h 33m
19 Jan 2015 @ 1615 wc long		1h 41m
19 Jan 2015 @ 1434 wc long		1h 32m
19 Jan 2015 @ 1302 wc long		1h 49m



### From tables to graphs



# Crosscutting Concests





Analyzing data in 6-8 builds on K-5 and progresses to extending quantitative analysis to investigations, distinguishing between correlation and causation, and basic statistical techniques of data and error analysis.					
Use mean, median, mode, and variability to analyze and characterize data.					
Use graphical displays to analyze data in order to identify linear and nonlinear relationships.					
Consider limitations of data analysis, such as measurement error, and seek to improve precision and accuracy of data with better technological tools and methods such as multiple trials.  Distinguish between causal and correlational relationships.					
Use data to define an operational range for a design solution.					

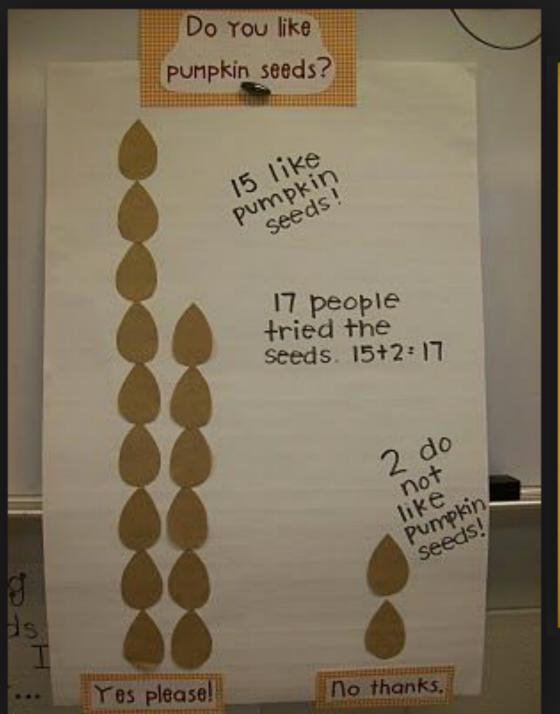
Adapted from Brunsell E, Kneser D, Niemi K (2014), Introducing Teachers and Administrators to the NGSS. NSTA Press: Arlington, VA

Elementary

Graph
Record Observations
Collect Data
Make Tables
Engage in Inquiry

## Elementary Activity





### **Pumpkin Seed Graph** 70 60 50 40 30 20 10 Sorohra Pumpkin Marie's Pumpkin Sammy's Pumpkin Johnny's Pumpkin

# Crosscutting Concepts

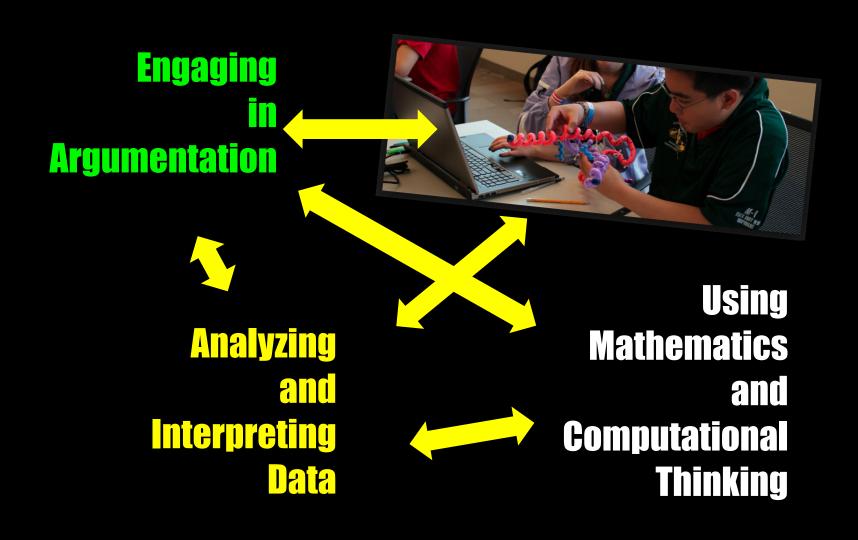




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relationships in the natural and designed world(s) in order to answer					
scientific questions and solve problems.					
Compare predictions (based on prior experiences) to what occurred					
(observable events).					
Analyze data from tests of an object or tool to determine if it works as					
intended.					

Analyzing data in 3-5 builds on K-2 experiences and progresses to and conducting multiple trials of qualitative observations. When po			
Represent data in tables and/or various graphical displays (bar graphs,			
pictographs, and/or pie charts) to reveal patterns that indicate relationships.			
Analyze and interpret data to make sense of phenomena, using logical			
reasoning, mathematics, and/or computation.			
Compare and contrast data collected by different groups in order to			
discuss similarities and differences in their findings.			
Analyze data to refine a problem statement or the design of a			
proposed object, tool, or process.			
Use data to evaluate and refine design solutions.			

#### Interconnectedness of Practices

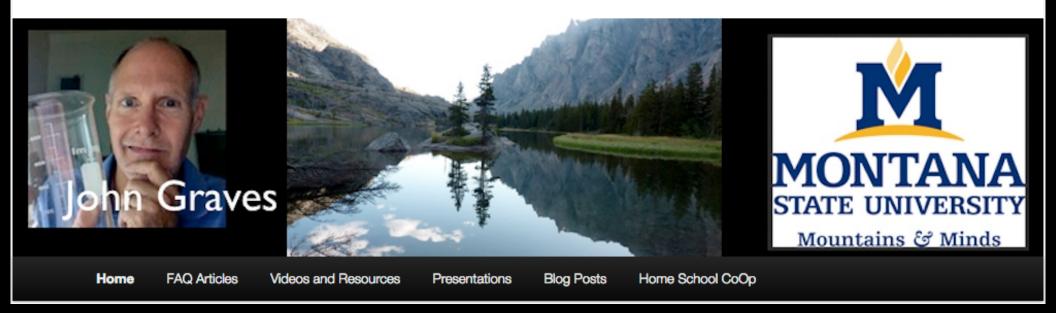




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