Name: \_\_\_\_\_



### Data Literacy

Fall 2025 Student Workbook - Pyret Edition



Workbook v3.1

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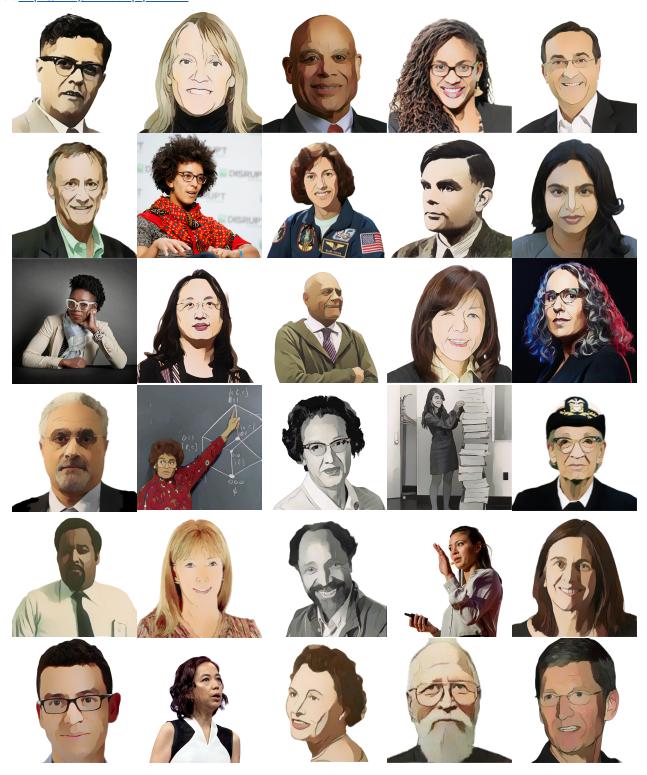


### **Table of Contents**

Computing Needs All Voices	1
Ethics, Privacy, and Bias	5
Introduction to Data Science	6
Simple Data Types	9
Contracts for Strings and Images	12
Contracts for Tables and Rows	21
Contracts for Data Visualization	25
Bar and Pie Charts	29
Dot Plots	35
From Dot Plots to Histograms	41
Histograms: Visualizing "Shape"	45
Data Collection	47
Probability, Inference, and Sample Size	51
The Data Cycle	54
Choosing Your Dataset	59
Scatter Plots	63
Measures of Center	68
Histograms: Interpreting "Shape"	74
Introduction to Box Plots	79
Box Plots: Interpreting Spread	85
Standard Deviation	90
Correlations	94
Linear Regression	101
Threats to Validity	109

### Pioneers in Computing and Mathematics

The pioneers pictured below are featured in our Computing Needs All Voices lesson. To learn more about them and their contributions, visit <a href="https://bit.ly/bootstrap-pioneers">https://bit.ly/bootstrap-pioneers</a>.



We are in the process of expanding our collection of pioneers. If there's someone else whose work inspires you, please let us know at <a href="https://bit.ly/pioneer-suggestion">https://bit.ly/pioneer-suggestion</a>.

### **Notice and Wonder**

Write down what you Notice and Wonder from the What Most Schools Don't Teach video.

"Notices" should be statements, not questions. What stood out to you? What do you remember? "Wonders" are questions.

What do you Notice?	What do you Wonder?

### Windows and Mirrors

Think about the stories you've just encountered. Identify something(s) from the film and/or posters that served as a mirror for you, onnecting you with your own identity and experience of the world. Write about who or what you connected with and why.						
) Identify something( xpanding your thinki	s) from the film or the ng in some way.	posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
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		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or
		posters that served a	s a window for you,	giving you insight in	to other people's ex	periences or

### Reflection: Try Thinking About Ketchup

This reflection is designed to follow reading <u>LA Times Perspective</u>: A solution to tech's lingering diversity problem? Try thinking about ketchup

1) Think of a time when someone else had a strategy or idea that you would never have thought of, but was interesting to you and/or pushed your thinking to a new level.
2) Think of a time when you had an idea that felt "out of the box". Did you share your idea? Why or why not?
3) The author argues that tech companies with diverse teams have an advantage. Why?
4) What suggestions did the article offer for tech companies looking to diversify their teams?
5) What is one thing of interest to you in the author's bio?
6) Based on your experience of exceptions to mainstream assumptions, propose another pair of questions that could be used in place of "Where do you keep your ketchup?" and "What would you reach for instead?"

### Case Study: Ethics, Privacy, and Bias

These questions are designed to accompany one of the case studies provided in the Ethics, Privacy, and Bias

My Case Study is
1) Read the case study you were assigned, and write your summary here.
2) Is this a good thing or a bad thing? Why?
3) What are the arguments on each side? Data Science used for this purpose is good because
Data Science used for this purpose is bad because

### Categorical and Quantitative Data in a Nutshell

Many important questions ("What's the best restaurant in town?", "Is this law good for citizens?", etc.) are answered with data. Data Scientists try to answer these questions by writing programs that ask questions about data.

Data of all types can be organized into Tables.

- Every Table has a header row and some number of data rows.
- Quantitative data is numeric and measures *an amount*, such as a person's height, a score on a test, distance, etc. A list of quantitative data can be ordered from smallest to largest.
- Categorical data is data that specifies *qualities*, such as sex, eye color, country of origin, etc. Categorical data is not subject to the laws of arithmetic for example, we cannot take the "average" of a list of colors.

### Categorical or Quantitative?

- Quantitative data measures an amount and can be ordered from smallest to largest.
- Categorical data specifies qualities and is not subject to the laws of arithmetic for example, we cannot take the "average" of a list of colors. Note: Numbers can sometimes be categorical rather than quantitative!

For each piece of data below, circle whether it is Categorical or Quantitative.

1)	Hair color	categorical	quantitative
2)	Age	categorical	quantitative
3)	ZIP Code	categorical	quantitative
4)	Date	categorical	quantitative
5)	Height	categorical	quantitative
6)	Sex	categorical	quantitative
7)	Street Name	categorical	quantitative
For eac	h question below, circle whether it will be answered by <b>Categorical</b> or <b>Quantita</b>	tive data.	
8)	We'd like to find out the average price of cars in a lot.	categorical	quantitative
9)	We'd like to find out the most popular color for cars.	categorical	quantitative
10)	We'd like to find out which puppy is the youngest.	categorical	quantitative
11)	We'd like to find out which cats have been fixed.	categorical	quantitative
12)	We want to know which people have a ZIP code of 02907.	categorical	quantitative
<b>★</b> We d	can sort the animals in ascending order (smallest-to-largest) by age and then sor	t the table in alphabetical order (A-to-7	7) by name
	nat mean name is a quantitative column? Why or why not?		

### Questions and Column Descriptions

- 1) Take some time to look through the Animals Dataset. What stands out to you? Which animals are interesting? What patterns do you notice? Put your observations in the **Notice** column below.
- 2) Do any of these observations make you wonder? If so, write your question next to the observation in the **Wonder** column. If not, think of another question to write down.

Notice	Wonder	Answered by this dataset?
I notice that	la it basquas ha was sa bis?	Yes No
Kujo took a long time to be adopted	Is it because he was so big?	
I notice that		Yes No
I notice that		Yes No
I notice that		Yes No
I notice that		Yes No
I notice that		Yes No
I notice that		Yes No
scribe the table, and two of the columns, by filling in the bl	anks below.	

1. This datas	et is about			; it contains	data rows
2. Some of the	ne columns are:				
a	column name	, which contains	categorical or quantitative	data. Some examp	ole values are:
b	column name	, which contains	categorical or quantitative	data. Some examp	ole values are:

### Introduction to Programming in a Nutshell

The **Editor** is a software program we use to write Code. Our Editor allows us to experiment with Code on the right-hand side, in the **Interactions Area**. For Code that we want to *keep*, we can put it on the left-hand side in the **Definitions Area**. Clicking the "Run" button causes the computer to re-read everything in the Definitions Area and erase anything that was typed into the Interactions Area.

### **Data Types**

Programming languages involve different data types, such as Numbers, Strings, Booleans, and even Images.

- Numbers are values like 1, 0.4, 1/3, and -8261.003.
  - Numbers are usually used for quantitative data and other values are usually used as categorical data.
  - In Pyret, decimals must start with a zero. For example, 0.22 is valid, but .22 is not.
- Strings are values like "Emma", "Rosanna", "Jen and Ed", or even "08/28/1980".
  - All strings must be surrounded by quotation marks.
- Booleans are either true or false.

All values evaluate to themselves. The program 42 will evaluate to 42, the String "Hello" will evaluate to "Hello", and the Boolean false will evaluate to false.

### **Operators**

Operators (like +, -, \*, <, etc.) work the same way in Pyret that they do in math.

- Operators are written between values, for example: 4 + 2.
- In Pyret, operators must always have spaces around them. 4 + 2 is valid, but 4+2 is not.
- If an expression has different operators, parentheses must be used to show order of operations. 4 + 2 + 6 and 4 + (2 \* 6) are valid, but 4 + 2 \* 6 is not.

### **Applying Functions**

Functions work much the way they do in math. Every function has a name, takes some inputs, and produces some output. The function name is written first, followed by a list of *arguments* in parentheses.

- In math this could look like f(5) or g(10, 4).
- In Pyret, these examples would be written as f(5) and q(10, 4).
- Applying a function to make images would look like star(50, "solid", "red").
- There are many other functions in Pyret, for example sqr, sqrt, triangle, square, string-repeat, etc.

Functions have *contracts*, which help explain how a function should be used. Every Contract has three parts:

- The Name of the function literally, what it's called.
- The Domain of the function what type(s) of value(s) the function consumes, and in what order.
- The Range of the function what type of value the function produces.

### **Strings and Numbers**

Make sure you've loaded code, pyret.org (CPO), clicked "Run", and are working in the Interactions Area on the right. Hit Enter/return to evaluate expressions you test out.

### Strings

String values are always in quotes.

- Try typing your name (in quotes!).
- Try typing a sentence like "I'm excited to learn to code!" (in quotes!).
- Try typing your name with the opening quote, but without the closing quote. Read the error message!

Now try typing your name without any quotes. Read the error message!
1) Explain what you understand about how strings work in this programming language.
Numbers
2) Try typing 42 into the Interactions Area and hitting "Enter". Is 42 the same as "42"? Why or why not?
3) What is the largest number the editor can handle?
4) Try typing 0.5. Then try typing .5. Then try clicking on the answer. Experiment with other decimals.
Explain what you understand about how decimals work in this programming language.
5) What happens if you try a fraction like 1/3?
6) Try writing <b>negative</b> integers, fractions and decimals. What do you learn?
Operators
7) Just like math, Pyret has <i>operators</i> like $+$ , $-$ , $*$ and $/$ . Try typing in $4+2$ and then $4+2$ (without the spaces). What can you conclude from this?
8) Type in the following expressions, <b>one at a time</b> : 4 + 2 * 6 (4 + 2) * 6 4 + (2 * 6) What do you notice?
9) Try typing in 4 + "cat", and then "dog" + "cat". What can you conclude from this?

### **Booleans**

Boolean-producing expressions are yes-or-no questions, and will always evaluate to either true ("yes") or false ("no").

What will the expressions below evaluate to? Write down your prediction, then type the code into the Interactions Area to see what it returns.

	Prediction	Result			Prediction	Result
1) 3 <= 4			2) "a" > "b"			
3) 3 == 2			4) "a" < "b"			
5) 2 < 4			6) "a" == "k	)"		
7) 5 >= 5			8) "a" <> "a	<b>\</b> "		
9) 4 >= 6			10) "a" >= '	a"		
11) 3 <> 3			12) "a" <> '	b"		
13) 4 <> 3			14) "a" >= '	b"		
15) In your own words  16) In your own words						
17) In your own words	s, describe what <> do	oes.				
				Prediction	<b>:</b>	Result:
18) string-contai	ns("catnap", "c	at")				
19) string-contai	ns("cat", "catn	ap")	_			
20) In your own words returns true?	s, describe what stri	ng-contains doe	s. Can you genera	te another expres	sion using string-0	contains that
★ There are infinite st	tring values ("a", "aa", "	aaa") and infinite no	umber values out	there (2,-1,0,-1,	2). But how many d	ifferent <i>Boolean</i>
values are there?						

### **Applying Functions**

Open code.pyret.org (CPO) and click "Run". We will be working in the Interactions Area on the right.

Test out these two	expressions and	record what v	ou learn below:

- regular-polygon(40, 6, "solid", "green")
- regular-polygon(80, 5, "outline", "dark-green")
- 1) You've seen data types like Numbers, Strings, and Booleans. What data type did the regular-polygon function produce?
- 2) How would you describe what a regular polygon is?
- 3) The regular-polygon function takes in four pieces of information (called arguments). Record what you know about them below.

	Data Type	Information it Contains
Argument 1		
Argument 2		
Argument 3		
Argument 4		

There are many other functions available to us in Pyret. We can describe them using **contracts**. The Contract for regular-polygon is: # regular-polygon:: Number, String, String -> Image

- Each Contract begins with the function name: in this case regular-polygon
- Lists the data types required to satisfy its Domain: in this case Number, Number, String, String
- And then declares the data type of the Range it will return: in this case Image

Contracts can also be written with more detail, by annotating the Domain with variable names:

- 4) We know that a square is a regular polygon because \_\_\_\_\_
- 5) What code would you write to make a big, blue square using the regular-polygon function?

6) Pyret also has a square function whose contract is: # square :: ( Number , String | String

What code would you write to make a big blue square using the square function?

	(		,
function-name	size :: Number	fill-style :: String	color :: String

- 7) Why does square need fewer arguments to make a square than regular-polygon?
- ★ Where else have you heard the word *contract* used before?

### Practicing Contracts: Domain & Range

Note: The contracts on this page are not defined in Pyret and cannot be tested in the editor.

is-beach-weather
Consider the following Contract: # is-beach-weather :: Number, String -> Boolean
1) What is the <b>Name</b> of this function?
2) How many arguments are in this function's <b>Domain</b> ?
3) What is the <b>Type</b> of this function's <b>first argument</b> ?
4) What is the <b>Type</b> of this function's <b>second argument</b> ?
5) What is the <b>Range</b> of this function?
6) Circle the expression below that shows the correct application of this function, based on its Contract.
A. is-beach-weather(70, 90)
<pre>B. is-beach-weather(80, 100, "cloudy") C. is-beach-weather("sunny", 90)</pre>
D. is-beach-weather(90, "stormy weather")
cylinder
Consider the following Contract: # cylinder :: Number, Number, String -> Image
7) What is the <b>Name</b> of this function?
B) How many arguments are in this function's <b>Domain</b> ?
9) What is the <b>Type</b> of this function's <b>first argument</b> ?
10) What is the <b>Type</b> of this function's <b>second argument</b> ?
11) What is the <b>Type</b> of this function's <b>third argument</b> ?
12) What is the <b>Range</b> of this function?
13) Circle the expression below that shows the correct application of this function, based on its Contract.
A. cylinder("red", 10, 60)
B. cylinder(30, "green")
C. cylinder(10, 25, "blue") D. cylinder(14, "orange", 25)

### ${\bf Matching\,Expressions\,and\,Contracts}$

Match the Contract (left) with the expression that uses it correctly (right). Note: The contracts on this page are not defined in Pyret and cannot be tested in the editor.

Contract		Expression
# make-id :: String, Number -> Image	1	A make-id("Savannah", "Lopez", 32)
<pre># make-id :: String, Number, String -&gt; Image</pre>	2	B make-id("Pilar", 17)
# make-id :: String -> Image	3	C make-id("Akemi", 39, "red")
<pre># make-id :: String, String -&gt; Image</pre>	4	D make-id("Raïssa", "McCracken")
<pre># make-id :: String, String, Number -&gt; Image</pre>	5	E make-id("von Einsiedel")

Contract		Expression
<pre># is-capital :: String, String -&gt; Boolean</pre>	6 A	show-pop("Juneau", "AK", 31848)
<pre># is-capital :: String, String, String -&gt; Boolean</pre>	7 B	show-pop("San Juan", 395426)
# show-pop :: String, Number -> Image	8 C	is-capital("Accra", "Ghana")
<pre># show-pop :: String, String, Number -&gt; Image</pre>	9 D	show-pop(3751351, "Oklahoma")
<pre># show-pop :: Number, String -&gt; Number</pre>	10 E	<pre>is-capital("Albany", "NY", "USA")</pre>

### **Contracts for Image-Producing Functions**

Log into <u>code.pyret.org (CPO)</u> and click "Run". Experiment with each of the functions listed below in the interactions area. Try to find an expression that produces an image. Record the contract and example code for each function you are able to use!

Name	Domain		Range
# triangle	:: Number, String, String	->	Image
triangle(80, "solid",	"darkgreen")		
# star	::	->	
# circle	::	->	
# rectangle	::	->	
# text	**	->	
# square	::	->	
# rhombus	::	->	
# ellipse	::	->	
# regular-polygon	::	->	
# right-triangle	::	->	
# isosceles-triangle	::	->	
# radial-star	::	->	
# star-polygon	::	->	
# triangle-sas	::	->	
# triangle-asa	::	->	

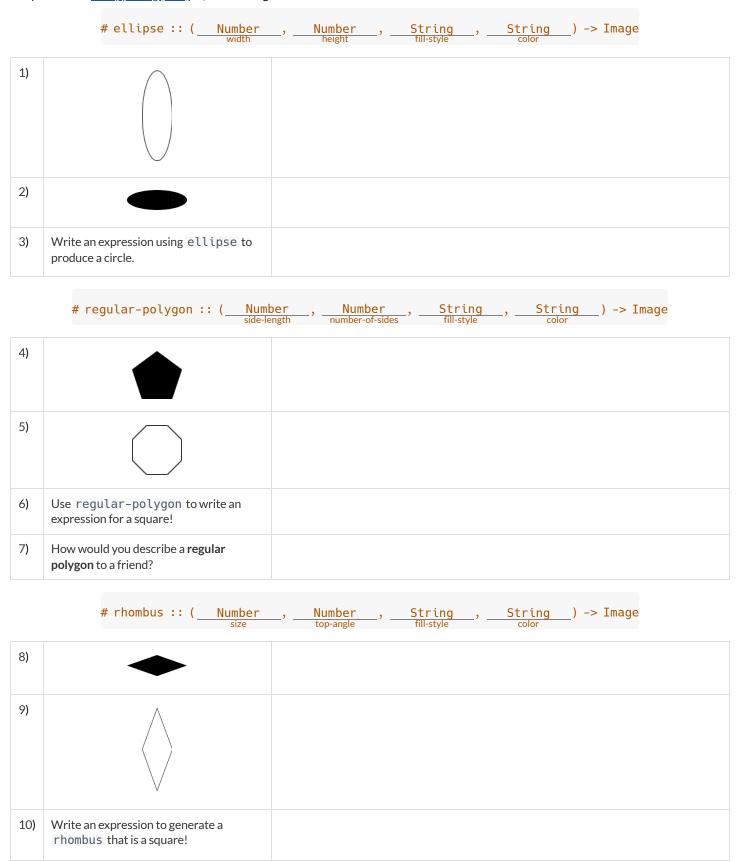
### Catching Bugs when Making Triangles

### Learning about a Function through Error Messages

1) Type triangle into the Interactions Area of <u>code.pyret.org (CPO)</u> and hit "Enter". What do you learn?				
2) We know that all functions will need an open parenthesis and at least one input! Type triangle(80) in the Interactions Area and hit Enter/return. Read the error message. What hint does it give us about how to use this function?				
3) Using the hint from the error message, experiment until you can make a triangle. What is the contract for triangle?				
4) Read the explanation below. Then explain the difference in your own words. syntax errors - when the computer cannot make sense of the code because of unclosed strings, missing commas or parentheses, etc. contract errors - when the function isn't given what it needs (the wrong type or number of arguments are used) The difference between syntax errors and contract errors is:				
Finding Mistakes with Error Messages				
The following lines of code are all BUGGY! Read the code and the error messages below. See if you can find the mistake WITHOUT typing it into Pyret.				
5) triangle(20, "solid" "red") Pyret didn't understand your program around triangle(20, "solid" <b>"red"</b> )				
This is a error. The problem is that				
6) triangle(20, "solid") This <u>application expression</u> errored: triangle(20, "solid") 2 <u>arguments</u> were passed to the <u>operator</u> . The <u>operator</u> evaluated to a function accepting 3 parameters. An <u>application expression</u> expects the number of parameters and <u>arguments</u> to be the same.				
This is a error. The problem is that				
7) triangle(20, 10, "solid", "red") This <u>application expression</u> errored: triangle(20, 10, "solid", "red") <u>4 arguments</u> were passed to the <u>operator</u> . The <u>operator</u> evaluated to a function accepting 3 parameters. An <u>application expression</u> expects the number of parameters and <u>arguments</u> to be the same.				
This is a error. The problem is that				
8) triangle (20, "solid", "red")				
Pyret thinks this code is probably a function call:  triangle (20, "solid", "red")  Function calls must not have space between the function expression and the arguments.				
This is a error. The problem is that				

### **Using Contracts**

For questions 1,2,4,5,8 & 9, use the contracts provided to find expressions that will generate images similar to the ones pictured. Test your code in <u>code.pyret.org (CPO)</u> before recording it.

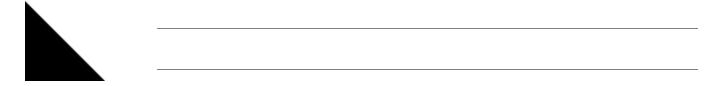


### **Triangle Contracts**

Respond to the questions. Go to <u>code.pyret.org (CPO)</u> to test your code.

1) What kind of triangle does the triangle function produce?
There are lots of other kinds of triangles! And Pyret has lots of other functions that make triangles!
<pre># triangle :: (Number, String, String) -&gt; Image fill-style</pre>
<pre># right-triangle :: (Number, Number, String fill-style / String color) -&gt; Image</pre>
<pre># isosceles-triangle :: (Number to leg to leg</pre>
2) Why do you think triangle only needs one number, while right-triangle and isosceles-triangle need two numbers?
3) Write right-triangle expressions for the images below using 100 as one argument for each.
4) Write isosceles-triangle expressions for the images below using 100 as one argument for each.

5) Write 2 expressions that would build **right-isosceles** triangles. Use right-triangle for one expression and isosceles-triangle for the other expression.



6) Which do you like better? Why?

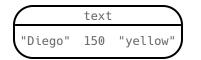
### **Composing with Circles of Evaluation**

### **Notice and Wonder**

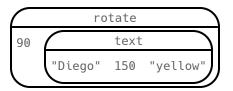
Suppose we want to see the text "Diego" written vertically in yellow letters of size 150. Let's use Circles of Evaluation to look at the structure:

We can start by generating the Diego image.

And then use the rotate function to rotate it 90 degrees.



 $\rightarrow$ 



text("Diego", 150, "yellow")

1) What do you Notice?

2) What do you Wonder?

### Let's Rotate an Image of Your Name!

Suppose you wanted the computer to show your name in your favorite color and rotate it so that it's diagonal...

Write your name (any size), in your favorite color

rotate the image so that it's diagonal

3) Draw the circle of evaluation:

4) Draw the circle of evaluation:

5) Convert the Circle of Evaluation to code:

6) Convert the Circle of Evaluation to code:

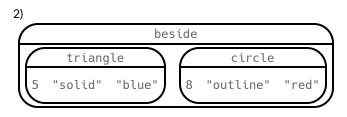
### Circle of Evaluation to Code (Scaffolded)

### Complete the Code by Filling in the Blanks!

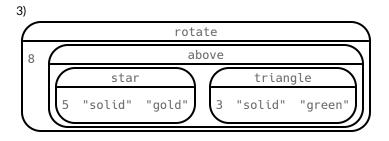
Finish the Code by filling in the blanks.

### Complete the Code by adding Parentheses

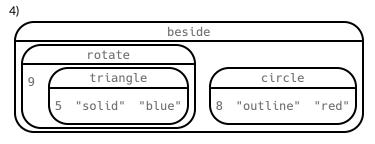
For each Circle of Evaluation, finish the Code by adding parentheses and commas.



beside triangle 5 "solid" "blue" circle 8 "outline" "red"



rotate 8 above star 5 "solid" "gold" triangle 3 "solid" "green"



beside rotate 9 triangle 5 "solid" "blue" circle 8 "outline" "red"

### Sorting and Summarizing Tables

Open the <u>Animals Starter File</u> and click "Run". In the Interactions Area (right), type an imals-table. Hit "Enter" to see the default view of the table.

Ordering a Table with sor	Ord	ering	a Tab	le with	sor
---------------------------	-----	-------	-------	---------	-----

1) Mabel Lee wants to sort this tab are some other ways we could sort		o sort the table by pounds (heaviest-to-lightest). What
a		
b.		
	Pyret has a function called sort that will produ	
	Le,"age", <mark>true</mark> )in the Interactions Area. Try us <b>circling</b> the behavior you observed for each Boolean.	
(a) true sorts the table	in ascending order (from least to greatest)	in descending order (from largest to smallest)
(b) false sorts the table	in ascending order (from least to greatest)	in <b>descending order</b> (from largest to smallest)
3) The Domain of sort has three	inputs. One of them is the table itself. Can you identif	y the data types of the other two?
# sort :: ( Table table-name, _		ole
4) What code will sort the animals	by alphabetical order of their <i>names</i> ?	
5) Did you use <mark>true</mark> or false?E	xplain why.	
Summarizing a Column value is explore another table function # count :: Table, String -6) What do you expect the code co	n, beginning with its contract:	
Type the code into the Interaction	ns Area and click "Enter" to test it out.	
7) How many animals had 4 legs?		
8) Think of another question you m	night be able to answer by making a different table us	ing the count function.
9) Fill in the blanks with the code to	o make the table:((	name:: Table column-name:: String
10) Try using the count function (	to summarize the pounds column. Is the resulting s	ummary useful? Why or why not?
11) Tables that summarize data wit	th a count are commonly used in the real world. Write	e an example of where you've seen them before:
12) Newspapers often incorporate	data into their reporting. How else might they displa	ny this information, besides using a table?

### Functions for Tables (continued)

### Grabbing a Single Row

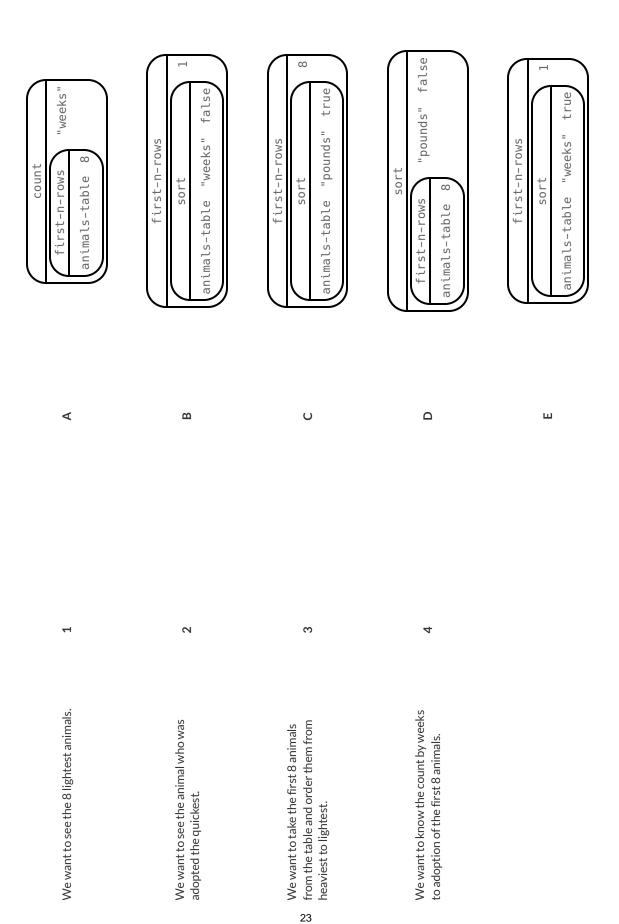
function-name

Graphing a Single Now
In addition to Numbers, Strings, Booleans, Images and Tables, Pyret has a <i>data type</i> for an individual Row.
Open the <u>Animals Starter File</u> and click "Run". In the Interactions Area (right), type animals-table. Hit "Enter" to see the default view of the table. Then type row-n(animals-table, 2) and compare the result to the table.
1) Write the code that generates the first row of the table.
2) Explain what the second input to row-n means, in as much detail as possible.
Grabbing Multiple Rows
3) Type first-n-rows(animals-table, 5). What happens?
4) If we wanted a table of the first 3 rows of the animals-table, what code would we write?
5) What is the Contract for first-n-rows?
Defining Values  Pyret lets us <i>define</i> values that we want to use later. We can define any kind of values we like!
6) If we tell Pyret that $x = 4 * 2$ , what would you expect to get back when you type $x + 1$ ?  Test it out by typing $x = 4 * 2$ into the Interactions Area, hitting "Enter" and then typing $x + 1$ .
7) Try typing gt = triangle(50, "solid", "green") and hitting "Enter".
What happens?
Now type gt. What do you get back?
8) Explain what is happening on Line 14 of the <u>Animals Starter File</u> .
9) On line 16 of the Definitions Area, add a new definition called my-pet, which is defined to be your favorite animal.
code:
10) Add a new line at the bottom of the Definitions Area, define first-3 to be a subset of the first 3 rows of the animals-table.
code:
★ What happens when you type first-n-rows(sort(animals-table, "pounds", true), 5)?
Note: In this case, the output of sort(animals-table, "pounds", true) is the Table first-n-rows is taking in!
★★ See if you can figure out how to compose the code that would generate a table of the 10 oldest animals!

Table

# Matching Descriptions to Circles of Evaluation: sort, count, first-n-rows

Match each prompt on the left to the Circle of Evaluation used to answer it.



★ Translate each Circle of Evaluation into code and test it out in the Animals Starter File to confirm it does what you'd expect it to. count(first-n-rows(animals-table, 8), "weeks") Hint: The Code for A is

### Circles of Evaluation: Count, Sort, First-n-rows

For each scenario below, draw the Circle of Evaluation and then use it to write the code.  When you're done, test your code out in the <u>Animals Starter File</u> and make sure it does what you'd expect it to.
# count :: Table, String -> Table
# first-n-rows :: Table, Number -> Table
# sort :: Table, String, Boolean -> Table
1) We want to see the 10 animals who were adopted the quickest.  Circle of Evaluation:
code:
2) We want to see the heaviest animal. Circle of Evaluation:
code:
3) We want to take the first 8 animals from the table and put them in alphabetical order (by name).  Circle of Evaluation:
code:
4) You notice that the lightest 16 animals weigh under 10 pounds and you want to know the count ( by species ) of those animals. Circle of Evaluation:

### **Catching Bugs when Sorting Tables** Learning about a Function through Error Messages 1) Type sort into the Interactions Area of the Animals Starter File and hit "Enter". What do you learn? 2) We know that all functions need an open parenthesis and at least one input! Type sort(animals-table) in the Interactions Area and hit Enter. Read the error message. What hint does it give us about how to use this function? 3) Read the explanations below. Then explain the difference in your own words. syntax errors - when the computer cannot make sense of the code because of unclosed strings, missing commas or parentheses, etc. contract errors - when the function isn't given what it needs (the wrong type or number of arguments are used) The difference between **syntax errors** and **contract errors** is: Finding Mistakes with Error Messages The code below is BUGGY! Read the code and the error messages, and see if you can catch the mistake WITHOUT typing the code into Pyret. 4) sort(animals-table, "name", true Pyret didn't expect your program to end as soon as it did: sort(animals-table, "name", true You may be missing an "end", or closing punctuation like ")" or "]" somewhere in your program. error. The problem is that \_\_\_\_\_ This is a \_\_\_\_\_\_contract/syntax 5) sort(animals-table "name" true) Pyret didn't understand your program around: sort(animals-table "name" true) You may need to add or remove some text to fix your program. Look carefully before <u>the</u> <u>highlighted text</u>. Is there a missing colon (:), comma (,), string marker ("), or keyword? Is there something there that shouldn't be? error. The problem is that \_\_\_\_ 6) sort(animals-table, "name", "true") The **Boolean annotation**: fun sort(t :: Table, col :: String, asc :: Boolean) was not satisfied by the value "true" This is a \_\_\_\_\_\_ contract/syntax error. The problem is that 7) sort(animals-table, name , true) The name <u>name</u> is unbound:

### **Exploring Data Visualizations**

Use the contracts provided below to make each type of display in the <u>Animals Starter File</u>. Then answer the questions about each display.

Bar Charts: # bar-chart	:: Table, String -> Image
function-name ( table-name :: Tab	,) le column-name :: String
Sketch a bar chart below.	Bar charts summarize 1 column of data.
	This kind of display tells us
Pie Charts: # pie-chart	:: Table, String -> Image
function-name (	,) le column-name :: String
Sketch a pie chart below.	Pie charts summarize 1 column of data.
	This kind of display tells us
Dot Plots: # dot-plot :: T	able, String, String -> Image
function-name table-name :: Table	, labels :: String values :: String
Sketch a dot plot below.	Dot plots summarize 1 column of data.
	This kind of display tells us
Histograms: # histogram :: Tabl	e, String, String, Number -> Image
(	labels :: String values :: String bin-width :: Number
Sketch a histogram below.	Histograms summarize 1 column of data.
	This kind of display tells us

## Composing Functions: Match Descriptions to Circles of Evaluation

Match each prompt on the left to the Circle of Evaluation used to answer it.

Make a pie-chart, showing the species of the 4 oldest animals.

⊣

"count" false animals-table "species" sort count

4

false "count" first-n-rows "species" sort count animals-table

Θ

7

Take the 4 heaviest animals and make a box plot of their weight.

U

က

Make a table showing the count of the

species in this dataset, sorted from

most to least.

"spunod" false box-plot animals-table "pounds" irst-n-rows sort

Δ

"species" false pie-chart first-n-rows "age" sort animals-table

4

4 species with the most animals

Make a table showing the count of the

27

### Circles of Evaluation: Composing Functions to Make Visualizations

Using the Contracts below as a reference, draw the Circle of Evaluation for each prompt.

# sort :: Table, String, Boolean -> Table

### Displaying Categorical Data in a Nutshell

Data Scientists use data visualizations to interpret data. You've probably seen some of these charts, graphs and plots yourselves!

When it comes to displaying Categorical Data, there are two visualizations that are especially useful:

- 1. Bar charts show the count or percentage of rows in each category.
  - Bar charts provide a visual representation of the frequency of values in a categorical column.
  - Bar charts have a bar for every category in a column.
  - The more rows in a category, the taller the bar.
  - Bars in a bar chart can be shown in *any order*, without changing the meaning of the chart. However, bars are usually shown in some sensible order (bars for the number of orders for different t-shirt sizes might be presented in order of smallest to largest shirt).
- 2. **Pie charts** show the *percentage* of rows in each category.
  - Pie charts provide a visual representation of the relative frequency of values in a categorical column.
  - Pie charts have a slice for every category in a column.
  - The more rows in a category, the larger the slice.
  - Slices in a pie chart can be shown in *any order*, without changing the meaning of the chart. However, slices are usually shown in some sensible order (e.g. slices might be shown in alphabetical order or from the smallest to largest slice).

### Frequency Tables, Bar Charts and Pie Charts

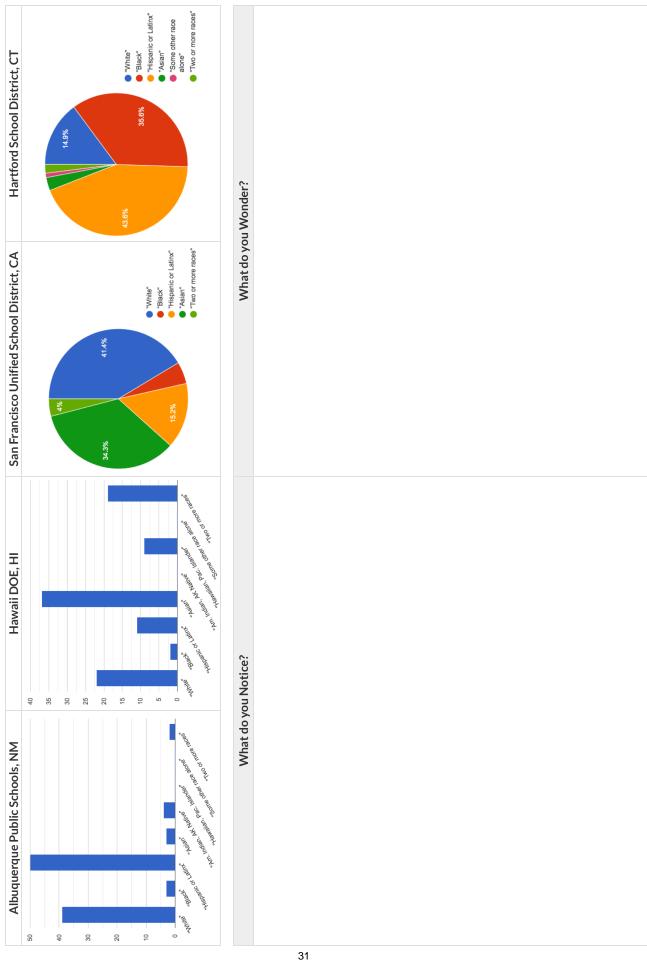
Open the Expanded Animals Starter File and click "Run".

Part 1 - Visualizations for Categorical Data
Test the following expressions in the Interactions Area:
• count(more-animals, "species")
• bar-chart(more-animals, "species")
1) How are they similar?
2) Which do you like better: the bar chart or the frequency table? Why?
Now test out the expression pie-chart(more-animals, "species")
3) How does the pie chart connect to the bar chart you just made?
Note: When you first build a bar chart or pie chart in Pyret, they are interactive visualizations. That means that you can mouse over them for more information. Hit the up arrow in the interactions area to reload your last expression and test it out!
Part 2 - Comparing Bar and Pie Charts
Best completed after Bar & Pie Chart - Notice and Wonder and Matching Bar and Pie Charts.
4) How are pie charts similar to bar charts?
5) How are pie charts and bar charts different?
6) What information is provided in bar charts that is hidden in pie charts?
7) Why might this sometimes be problematic?
8) When would you want to use one chart instead of another?
C - Bar and Pie Charts for Quantitative Data?
9) Make a pie-chart and bar-chart for the pounds column. Why isn't grouping the pounds column very useful?
10) Look at the list of columns in the Definitions Area. For which columns do you expect pie charts to be most useful?

 $\bigstar$  What questions about the dataset are you curious to investigate using these visualizations?

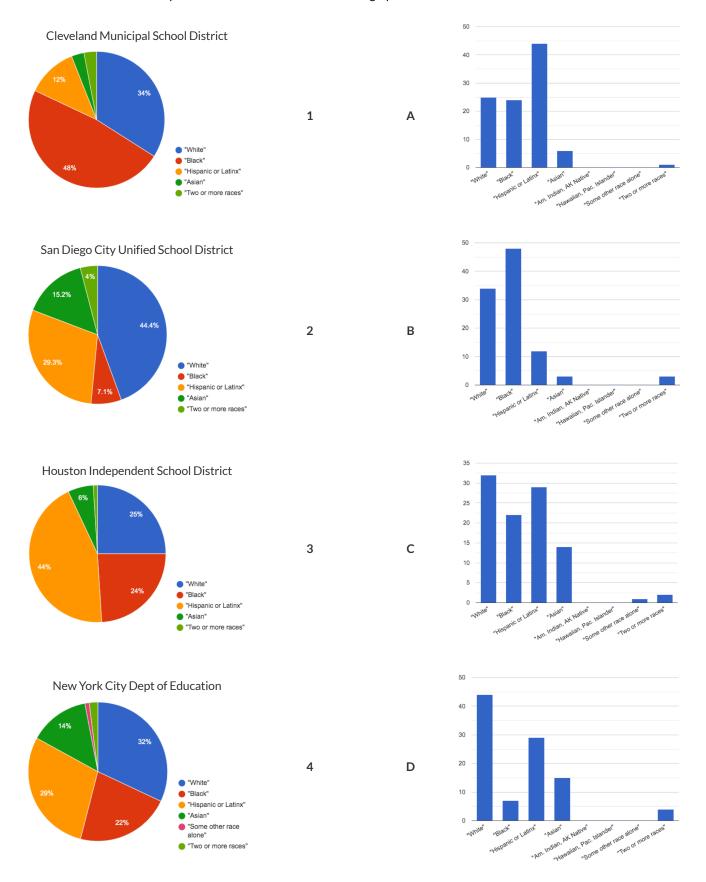
### Bar & Pie Chart - Notice and Wonder

What do you Notice and Wonder about the visualizations below?



### Matching Bar and Pie Charts

Match each bar chart below to the pie chart that visualizes the racial demographic data from the same school district.



### Introducing Visualizations for Subgroups

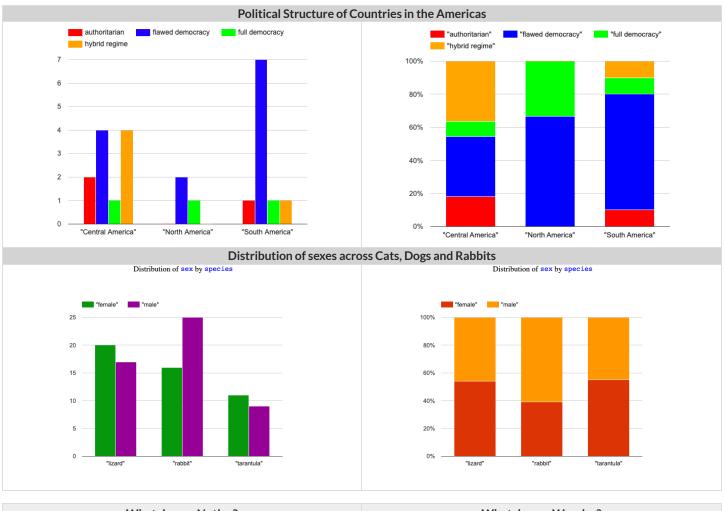
This page is designed to be used with the <u>Expanded Animals Starter File</u>.

Part A
1) How many tarantulas are male? Hint: Sort the table by species!
2) How many tarantulas are female?
3) Would you imagine that the distribution of male and female animals will be similar for every species at the shelter? Why or why not?
Part B
Sometimes we want to compare <i>sub-groups across groups</i> . In this example, we want to compare the distribution of sexes across each species.
Fortunately, Pyret has two functions that let us specify both a group and a subgroup:
# stacked-bar-chart :: (Table table-name, String subgroup) -> Image subgroup
<pre># multi-bar-chart :: ( Table table-name table-name table-name table-name table-name table-name table-name table-name table.)</pre>
4) Make a stacked-bar-chart showing the distribution of sexes across species in our shelter.
5) Make a multi-bar-chart showing the distribution of sexes across species in our shelter.
6) What do you notice?
7) What do you wonder?
8) Which display would be most efficient for answering the question: "What percentage of cats are female?" Why?
9) Which display would be most efficient for answering the question: "Are there more cats or dogs?" Why?
10) Write a question of your own that involves comparing subgroups across groups.
Which display would be most efficient for answering your question? Make the display.
What did you learn?
11) Write a different question that would be more efficient to answer with the other kind of display.
What did you learn from making this display?

## Multi Bar & Stacked Bar Charts - Notice and Wonder

The visualizations on the left are called multi bar charts.

The visualizations on the right are called **stacked bar charts**.



What do you Notice?	What do you Wonder?

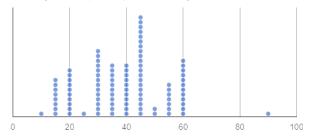
1) Is it possible that the same data was used for the multi bar charts as for the stacked bar charts? How do you know?

2) Write a question that it would be easiest to answer by looking at one of the multi bar charts.

3) Write a question that it would be easiest to answer by looking at one of the stacked bar charts.

# Dot Plots: Distribution, Typicality, Variability in a Nutshell

A dot plot (below) is a data visualization consisting of data points plotted along a number line.



On the dot plot (above), each data point represents one student in a sample.

The position of the data point indicates how many minutes it takes for that student to get ready for school. We see, for example, that there is only one students who gets ready in 10 minutes and there are 8 students who take 15 minutes to get ready.

**Distribution of Data.** To describe the distribution of data—the way that it is spread out on a number line—it is helpful to locate any outliers, clusters, peaks, and gaps.

- A cluster is a group of data points that are close together. Most of the data in the dot plot above is clustered from 10-60, meaning that most students spend between 10 minutes and an hour getting ready for school in the morning.
- A gap is an interval where there are no data points. On the dot plot above, there is a gap from 60 to 90. In this sample, no one takes between 60 and 90 minutes to get ready.
- An **outlier** occurs when one data point is much larger or smaller than the other data points. There is an outlier on the above dot plot at 90. One student requires much more time to get ready in the morning.
- A peak is the value(s) with the most data. In this sample, 45 minutes is the most common amount of time spent getting ready for school.

#### **Typicality of Data**

- Typicality in a dataset is what we expect from a dataset. We can estimate typicality by looking for peaks and clusters in a dataset.
- In looking at the dot plot above, we might estimate that students typically spend 40 or 45 minutes getting ready for school.

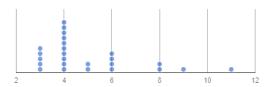
#### Variability of Data

- **Variability** is how different or alike the data points are. In a quantitative dataset we can measure and describe the variability using range, interquartile range, and standard deviation.
- Statistical questions are questions that anticipate variability.
- "In general, how tall are the students in your class?" does anticipate variability.
- "How many inches are in a foot?" does not anticipate variability. The answer is always 12.

# **Interpreting Dot Plots**

#### Reading a Dot Plot (Group A)

The dot plot below is a name length data visualization created by a group of 25 students (Group A).



1) What is the difference (in letters) between the longest and shortest name?

2) What is the most common name length?

3) What fraction of students have first names that are 5 letters long?

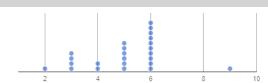
#### Interpreting Peaks, Clusters, Gaps, and Outliers

4) The distribution of the data is the way that it is spread out on the number line. One way to describe distribution is by identifying peaks, clusters, gaps, and outliers. As a class, label any peaks, clusters, gaps, or outliers on the dot plot **above**.

5) Let's think about what those peaks, clusters, gaps and outliers tell us about the dataset. In the dot plot above:

- the peak indicates that letters is the most common name length
- the cluster indicates that many students' names are letters
- the gaps tell us that, in this sample, no students have names that are letters or letters
- the outlier is letters, telling us that longer names are uncommon in this sample.

#### Reading a Dot Plot (Group B)



6) Label the peaks, clusters, gaps, and outliers of this new dot plot representing the name lengths of a different group of 25 students (Group B).

7) What do the peaks, clusters, gaps, and outliers tell you about the dataset?

#### Typicality of Name Length Data

8) What do you think is a typical value in Group A? (There is more than one correct response.) Explain your reasoning.

9) Identify another value someone else might claim is typical of Group A. \_\_\_\_\_ Why would they choose that value? \_\_\_\_\_

10) Would 6 letters be a good description of the typical number of letters in students' names for Group B? \_\_\_\_\_ Explain. \_\_\_\_

# Our Class' Name Length Data

#### Create a Dot Plot: Length of First Names in My Class

1) Your class just created a communal dot plot. Copy all of its dots onto the number line below.



# Reading a Dot Plot 2) What is the difference (in letters) between the longest name and the shortest name? 3) What is/are the most common name length(s)? 4) What fraction of students have first names that are 5 letters long? Peaks, Clusters, Gaps, and Outliers in Name Length Data 5) Label any peaks, clusters, gaps, and outliers on the class dot plot (above). 6) Describe what you can conclude about students' name lengths in your class, based on those peaks, clusters, gaps, and outliers. Typicality of Name Length Data 7) What is one possible typical value for class name length? Explain. 8) Give another possible typical value: . Explain why it is appropriate. Compare 9) Compare and contrast your class dataset with either Group A or Group B from Interpreting Dot Plots. Give at least one way that the distributions are alike, and at least one way that they are different.

# Two Ways of Thinking about Variability

Variability of Categorical Data							
Sana's Groceries	Juliette's Groceries						
12 apples and 1 banana	4 peaches, 4 kiwis, 4 oranges, and 1 lime						
L) Which dataset has greater variability - Sana's groceries or Juliette's groceries? Explain.							
<ul> <li>2) You ask a group of sixth grade students to respond to two different</li> <li>Statement A: I am in sixth grade.</li> <li>Statement B: I am wearing blue today.</li> <li>Which statement do you predict will produce greater variability? Exp</li> </ul>							
Variability of Quantitative Data							
3) Someone looks at your class roster and says, "In general, students in	our class have the same number of letters in their first names."						
Do you agree or disagree? Explain your reasoning.							
4) Which dataset do you predict will have greater variability for a gro	up of ninth graders who attend the same school - wake-up times on						
Wednesday or Saturday? Explain.							
5) Below are the students' responses for their wake-up times on Wed  • Wednesday: 6:30, 6:15, 6, 6:45, 6:30, 5:45, 6:45, 6:30, 6:30, 6:15  • Saturday: 7:00, 8:00, 8:30, 6:30, 9:45, 10:30, 6:00, 5:45, 10:15, 9:3							
Designing Datasets with High and Low Variability							
6) Make up two <b>categorical</b> datasets with 5 items, each.							
Dataset with Low Variability	Dataset with High Variability						
7) Make up two <b>quantitative</b> datasets with ten quantities, each.							
Dataset with Low Variability	Dataset with High Variability						

# Variability of Dot Plots

The person who created the dot plots below forgot to label them. For each row, decide which description matches which dot plot. Then explain your choice.

Explain your choice					
Dot Plot B		000 000 000 000 000 000 000 000 000 00	00 25 50 75 100 125		
Dot Plot A		0 10 15			2 4 6
Which dot plot corresponds, A or B?	Students' hours of sleep:  on Monday night:  on Saturday night:	Ages:  of all sixth graders at a K-12 school:  of all students at a K-12 school:	<ul><li>Weights:</li><li>of cats in the shelter:</li><li>of dogs in a shelter:</li></ul>	Number of minutes:  • spent brushing teeth in a day:  • spent getting ready for school:	Number of televisions:  • per household:  • per bedroom:
	1)	7)	3)	4	5)

# Variability of Animals' Weights

#### **Make Your Predictions**

The staff at the shelter know there is a relationship between how much an animal weighs and how much it eats. They're about to order food for the month, and need some help analyzing the distribution of animals' weights!

1) Imagine a typical animal from each of these four species. Rank the animals from lightest (1) to heaviest (4).

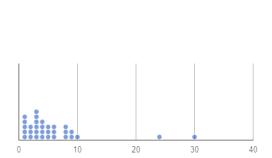
dog:\_\_\_\_\_ rabbit:\_\_\_\_ cat:\_\_\_\_ tarantula:\_\_\_\_

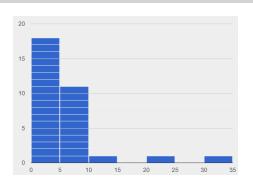
2) Circle the species	you expect to have the gre	eatest variability in weight:	dog	rabbit	cat	tarantula
3) Circle the species	you expect to have the lea	st variability in weight:	dog	rabbit	cat	tarantula
4) The dot plots belo	ow display the weight distri	butions of dogs, rabbits, and	tarantulas. Id	lentify the species o	of each plot.	
1 2	4 5 6	0.0 0.1 0.2	0.3	0.4 0	50 100	150
species:		species:		species: _		
Test Your Pre	dictions Using Pyre	t tarter File, build a dot plot fo e cells. You can hover your m	r each specie	s. In your code, use	the tables defin	ed on lines 22-25.
on an individual anir	nal. Some cells have been c	ompleted for you.				
	dogs	cats	rabbit	ts	tarantula	
Range/variability	3-172 lbs					
Gaps	123-161 lbs		No sig	gnificant gaps	No signific	cant gaps
Outliers	Kujo (172 lbs) Mr. PB (161 lbs)		No sig	gnificant outliers	No signific	ant outliers
Peak(s)	72 pounds					
of the four species in	the <u>Dogs, Rabbits, Cats &amp;</u>	y dog ate roughly the <i>same ar</i> Tarantulas Starter File? Can				

# **Comparing Dot Plots and Histograms**

The displays below both show the distribution of weeks that animals spend at the shelter.

#### **Notice and Wonder**





1) What do you Notice about the dot plot (left) and the histogram (right)? What do you Wonder?

#### **Dot Plots versus Histograms**

Answer the questions below using only the dot plot, and then only the histogram. If you cannot answer a question precisely, write "X".

Question	Dot Plot	Histogram
2) How many animals were in the shelter for fewer than 10 weeks?		
3) How many animals were in the shelter for exactly 30 weeks?		
4) What is the longest amount of time that an animal stayed in the shelter?		
5) How many animals were in the shelter for at least 5 weeks but not more than 25?		
6) Are there any gaps in the data?		
7) Are there any peaks in the data?		

#### Reflect

8) Wł	nen you	answered	the questi	ons using	the dot <b>plot</b> :
-------	---------	----------	------------	-----------	-----------------------

- i. Which questions were **easy** to answer?
- ii. Which questions were **hard** to answer?
- iii. Which questions were **impossible** to answer?
- 9) When you answered the questions using the histogram:
  - i. Which questions were **easy** to answer?

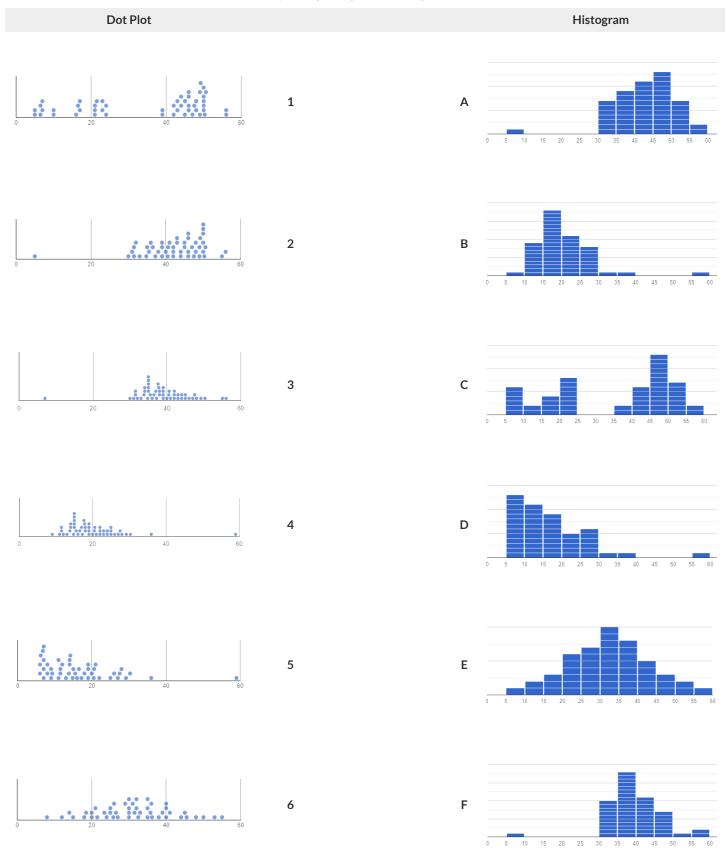
Ο١	\//hen	might a	histogram	he more	ucaful	thana	dot nla	+2
LU)	vviien	IIIIgiit a	HISLOGIAIII	be more	userui	uldila	a dot pic	JL:

11) When might a dot plot be more useful than a histogram?

ii. Which questions were **hard** to answer? iii. Which questions were **impossible** to answer?

# Matching Dot Plots and Histograms

Draw a line from each dot plot on the left to the corresponding histogram on the right.



# **Making Histograms**

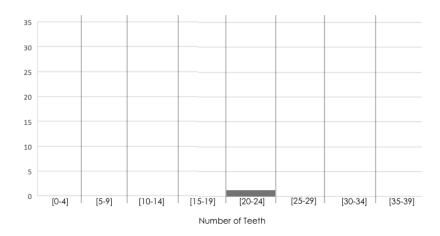
#### **Bv Hand**

Suppose we have a dataset for a group of 50 adults, showing the number of teeth each person has...

1) Use the data to complete the frequency table below. (The last cell has been completed for you.)

number of teeth	0-4	5-9	10-14	15-19	20-24	25-29	30-34
frequency							35

2) Use the frequency table to draw a histogram below, filling in each interval so that its height is equal to the frequency.



#### In Pvret

Open the Tooth Data Starter File. Make a copy, and click "Run".

3) Type tooth-table in the Interactions window. Press enter. What do you see?	

- 4) Type count(tooth-table, "num-teeth") in the Interactions window and press enter. How is the frequency table created in Pyret different from the one that you created, above?
- 5) What bin sized was used for the Tooth Data frequency table and the histogram above?
- 6) Build tooth-table. Does this data appear to be the same or different from the tooth data that appeared in the first section?
- 7) Use the contract below to build a histogram in Pyret of the distribution of teeth.

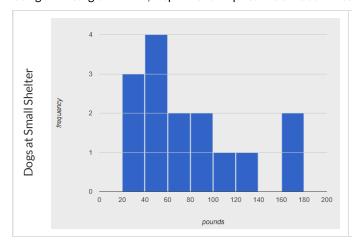
8) How does the histogram you created in Pyret look *similar* to the one that you drew? Are there any ways in which the histogram you created

in Pyret is different than the one you created by hand?

# **Reading Histograms**

#### Small Local Animal Shelter

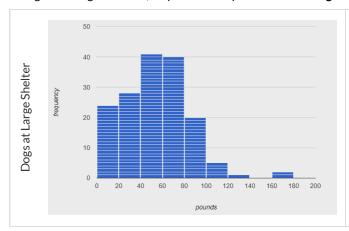
Using the histogram below, respond to the questions about the distribution of dogs' weights at a small local animal shelter.



- 1) How many dogs are represented on the histogram?
- 2) How many dogs weigh less than 100 pounds?
- 3) True or False: The majority of dogs weigh between 40 and 60 pounds.
- 4) True or False: The dogs weigh between 20 and 180 pounds.
- 5) True or False: The heaviest dog weighs between 40 and 60 pounds.
- 6) True or False: The histogram shows us that one dog weighs exactly  $140 \, \text{pounds}.$

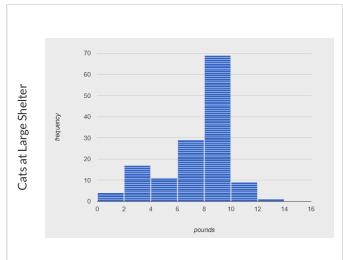
#### **Larger Animal Shelter**

Using the histogram below, respond to the questions about dogs' weights at a different (much larger) animal shelter.



- 7) True or False: There are two dogs that weigh at least 160 pounds.
- 8) True or False: The majority of the dogs weigh between 40 and 60 pounds.
- 9) True or False: The lightest dog weighs zero pounds.
- 10) True or False: Most commonly, dogs at this shelter weigh 40-60 pounds.
- 11) True or False: There are 180 dogs at this animal shelter.
- 12) True or False: There are more than 150 dogs at this animal shelter.

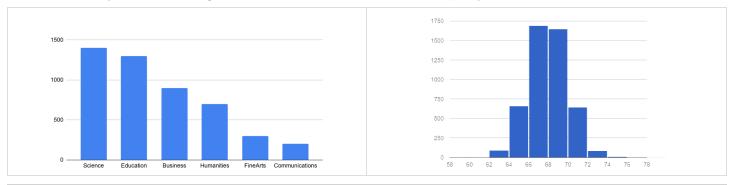
Using the histogram below, write three statements about the cats' weights and their distribution at the large animal shelter.



- 13)
- 14)
- \_\_\_\_\_

# **Bar Charts Versus Histograms**

A university consists of six colleges. Each student in the university has chosen to enroll in one of these colleges. The **bar chart** below shows the distribution of college choice. The **histogram** below shows the distribution of students by height in inches.



#### **Differences and Similarities**

Respond to the prompts to complete the table below.

	Bar Chart	Histogram
Displays frequency: yes or no?		
Type of data: categorical or quantitative?		
Bars touch: yes or no?		
Bars can be reordered: yes or no?		
The shape of the data matters: yes or no?		

1) What are some of the ways that bar charts and histograms are alike? Summarize your conclusions from the table.	

2) What are some of the ways that bar charts and histograms are <b>different</b> ? Summarize your conclusions from the table.	

#### Distribution of College Choice

Four different students share their conclusions about the **bar graph** displayed above. Only **one** of those conclusions is correct. Respond whether you agree or not, and then explain your stance.

Student A: "The distribution is skewed to the left."

Student B: "The distribution is skewed to the right."

Student C: "The majority of students are enrolled in the college of science."

Student D: "After science and education, there is a large drop in enrollments for the other colleges."

# Choosing the Right Bin Size

Open your saved <u>Animals Starter File</u>, or make a new copy, and click "Run".

# histogram :: ( <u>Table</u> , <u>String</u> , <u>String</u> , <u>Number</u> ) -> Image
Make a histogram for the "weeks" column in the animals-table, using a bin size of 10 and the "name" column for your labels.
1) How many animals took between 0 and 10 weeks to be adopted?
2) How many animals took between 10 and 20 weeks to be adopted?
Try some other bin sizes (be sure to experiment with bigger and smaller bins!)
3) What shape emerges?
4) What bin size gives you a picture of the distribution with between 5 and 10 bins.
5) Are there any outliers? If so, are they high or low?
6) How many animals took between 0 and 5 weeks to be adopted?
7) How many animals took between 5 and 10 weeks to be adopted?
8) What else do you Notice? What do you Wonder?
9) What was a typical time to adoption?

#### Data Collection in a Nutshell

#### With Great Power Comes Great Responsibility

Politicians pass laws, shoppers choose brands, and countries go to war based on studies that sound reliable. But sometimes the data those decisions are made on is unreliable and misleading!

There are many ways for a study and its analysis to be flawed, whether by accident, by incompetence or by intent.

Being an ethical data scientist means making sure that every element of your study is designed to minimize bias in the data and analysis.

It is also best practice to acknowledge any limitations of datasets we create by writing a Datasheet for the Dataset that describes how the data was collected, what efforts were made to avoid bias, and what data may have been left out, so that people who are trying to make sense of studies that use the dataset don't have to wonder about how reliable it is for the purposes they want to use it for.

#### **Data Cleaning**

In order to process data, it needs to be clean. Four ways that data can be dirty include:

- 1) Missing Data A column containing some cells with data, but some cells left blank.
- 2) **Inconsistent Types** A column where some values have one data type and some cells have another. For example, a years column where almost every cell is a Number, but one cell contains the string "5 years old".
- 3) **Inconsistent Units** A column where the data types are the same, but they represent different units. For example, a weight column where some entries are in pounds but others are in kilograms.
- 4) **Inconsistent Naming** Inconsistent spelling and capitalization for entries lead to them being counted as different. For example, a species column where some entries are "cat" and others are "Cat" will not give us a full picture of the cats.

Once the data is dirty, we have to make careful choices about how to clean it. It's never as simple as just deleting dirty rows! That might, for example, lead us to draw conclusions about the world in general based on a dataset the underrepresents the reality for developing countries.

#### **Survey Validation**

We can design a survey to improve the odds of getting clean data. A few design features that improve results include:

- 1) Required Questions By making a question "required", we can eliminate missing data and blank cells.
- 2) **Question Format** When you have a fixed number of categories, a drop-down can ensure that everyone selects one and only one! category.
- 3) **Descriptive Instructions** Sometimes it's helpful to just add instructions! This can remind respondents to use inches instead of centimeters, for example, or give them extra guidance to answer accurately.
- 4) Adding Validation Most survey tools allow you to specify whether some data should be a number or a string, which helps guard against inconsistent types. Often, you can even specify parameters for the data as well, such as "strings that are email addresses", or "numbers between 24 and 96".

# Analyzing Survey Results When Data is Dirty

These questions are designed to accompany the <u>Survey of Eighth Graders and their Favorite Desserts Starter File</u>.

graders!
Make the pie-chart in Pyret to see what he's looking at. Why is this display misleading? How is the data "dirty"?
2) What ideas do you have for how the survey designer could have made sure that the data in the dessert column would have been cleaner?
3) Make a data visualization showing the ages of the 8th graders surveyed. What "dirty" data problems do you spot and how are they misleading?
4) What ideas do you have for how the survey designer could have made sure that the data in the age column would have been cleaner?
5) Experiment with making data visualizations for other columns. What other issues can you spot? What other suggestions do you have for how the survey could have been improved?

# Dirty Data!

Open the New Animals Spreadsheet and take a careful look. A bunch of new animals are coming to the shelter, and that means more data!

What do you Notice?	What do you Wonder?
cell contains the string "5 years old".	ample, a years column where almost every cell is a Number, but one insistent units. For example, a weight column where some entries are entries lead to them being counted as different. For example, a
1) Which animals' row(s) have <b>missing data</b> ?	
2) Which column(s) have inconsistent types?	
3) Which column(s) have inconsistent units?	
4) Which column(s) have inconsistent naming?	
5) If we want to analyze this data, what should we do with the rows for	Tanner, Toni, and Lizzy?
6) If we want to analyze this data, what should we do with the rows for	Chanel and Bibbles?
7) If we want to analyze this data, what should we do with the rows for	Porche and Boss?
8) If we want to analyze this data, what should we do with the row for N	Niko?
9) If we want to analyze this data, what should we do with rows for Mo	na, Rover, Susie Q, and Happy?
10) Sometimes data cleaning is straightforward. Sometimes the proble	m is evident but the solution is less certain. For which questions were
you certain of your data cleaning suggestion? For which were you less of	certain? Why?

# **Bad Questions Make Dirty Data**

The **Height v Wingspan Survey** has *lots* of problems, which can lead to many kinds of dirty data: Missing Data, Inconsistent Types, Inconsistent Units and Inconsistent Language! Using the link provided by your teacher to your class' copy of the survey, try filling it out with bad data. Record the problems for each question and make some recommendations for how to improve the survey!

	What examples of bad data were you able to submit?	How could the survey be improved to avoid bad data?
<b>A</b> Age		
<b>B</b> Grade		
<b>C</b> Height		
<b>D</b> Wingspan		

# Probability, Inference, and Sample Size in a Nutshell

How can you tell if a coin is fair, or designed to cheat you? Statisticians know that a fair coin should turn up "heads" about as often as "tails", so they begin with the **null hypothesis:** they assume the coin is fair, and start flipping it over and over to record the results.

A coin that comes up "heads" three times in a row could still be fair! The odds are 1-in-8, so it's totally possible that the null hypothesis is still true. But what if it comes up "heads" five times in a row? Ten times in a row?

Eventually, the chances of the coin being fair get smaller and smaller, and a Data Scientist can say "this coin is a cheat! The chances of it being fair are one in a million!"

By sampling the flips of a coin, we can infer whether the coin itself is fair or not.

Using information from a sample to draw conclusions about the larger population from which the sample was taken is called **Inference** and it plays a major role in Data Science and Statistics! For example:

- If we survey pet owners about whether they prefer cats or dogs, the **null hypothesis** is that the odds of someone preferring dogs are about the same as them preferring cats. And if the first three people we ask vote for dogs (a 1-in-8 chance), the null hypothesis could still be true! But after five people? Ten?
- If we're looking for gender bias in hiring, we might start with the null hypothesis that no such bias exists. If the first three people hired are all men, that doesn't necessarily mean there's a bias! But if 30 out of 35 hires are male, this is evidence that undermines the null hypothesis and suggests a real problem.
- If we poll voters for the next election, the **null hypothesis** is that the odds of voting for one candidate are the same as voting for the other. But if 80 out of 100 people say they'll vote for the same candidate, we might reject the null hypothesis and infer that the population as a whole is biased towards that candidate!

**Sample size matters!** The more bias there is, the smaller the sample we need to detect it. Major biases might need only a small sample, but subtle ones might need a huge sample to be found. However, choosing a **good sample** can be tricky!

Random Samples are a subset of a population in which each member of the subset has an equal chance of being chosen. A random sample is intended to be a representative subset of the population. The larger the random sample, the more closely it will represent the population and the better our inferences about the population will tend to be.

**Grouped Samples** are a subset of a population in which each member of the subset was chosen for a specific reason. For example, we might want to look at the difference in trends between two groups ("Is the age of a dog a bigger factor in adoption time v. the age of a cat?"). This would require making grouped samples of *just the dogs* and *just the cats*.

# Finding the Trick Coin

Open the Fair Coins Starter File, which defines coin1, coin2, and coin3. Click "Run".

You can flip each coin by evaluating flip(coin1) in the Interactions Area (repeat for coins 2 and 3).

One of these coins is fair, one will land on "heads" 75% of the time, and one will land on "heads" 90% of the time. \*Which one is which?\*

1) Complete the table below by recording the results for five flips of each coin and *totalling* the number of "heads" you saw. Convert the ratio of heads to flips into a *percentage*. Finally, decide whether or not you think each coin is *fair* based on your sample.

Sample	coi	in1	coin2		со	in3
1	Н	Т	Н	Т	Н	Т
2	Н	Т	Н	Т	Н	Т
3	Н	Т	Н	Т	Н	Т
4	Н	Т	Н	Т	Н	Т
5	Н	Т	Н	Т	Н	Т
#heads		/5		/5 /5		/5
% heads		%	%			%
fair?	Υ	N	Υ	N	Υ	N

2) Record 15 more flips of each coin in the table below and total the number of "heads" you saw in all 20 flips of each coin.

Convert the ratio of total heads to total flips into a percentage. Finally, decide whether you think each coin is fair based on this larger sample.

Sample	coi	in1	coi	coin2		in3
6	Н	Т	Н	Т	Н	Т
7	Н	Т	Н	Т	Н	Т
8	Н	Т	Н	Т	Н	Т
9	Н	Т	Н	Т	Н	Т
10	Н	Т	Н	Т	Н	Т
11	Н	Т	Н	Т	Н	Т
12	Н	Т	Н	Т	Н	Т
13	Н	Т	Н	Т	Н	Т
14	Н	Т	Н	Т	Н	Т
15	Н	Т	Н	Т	Н	Т
16	Н	Т	Н	Т	Н	Т
17	Н	Т	Н	Т	Н	Т
18	Н	Т	Н	Т	Н	Т
19	Н	Т	Н	Т	Н	Т
20	Н	Т	Н	Т	Н	Т
#heads		/20	/20		/20	
% heads		%	%		%	
fair?	Υ	N	Y	N	Y	N

3) Which coin was the easiest to identify?	fair?	75%?	90%?
4) Why was that coin the easiest to identify?			

# Sampling and Inference

Open the Expanded Animals Starter File, and save a copy.

1) Evaluate the more-animals table in the Interactions Area. This is the *complete* population of animals from the shelter!

Here is a true statement about that population: The population is 47.7% fixed and 52.3% unfixed.

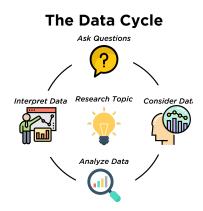
Type each of the following lines into the Interactions Area and hit "Enter".  random-rows(more-animals, 10)  random-rows(more-animals, 40)
2) What do you get?
3) What is the Contract for random-rows?
4) What does the random-rows function do?
5) In the Definitions Area,
<ul> <li>define small-sample to be random-rows(more-animals, 10)</li> </ul>
<ul> <li>define large-sample to be random-rows(more-animals, 40)</li> </ul>
6) Make a pie-chart for the animals in each sample, showing percentages of fixed and unfixed.
The percentage of fixed animals in the entire population is
The percentage of fixed animals in small-sample is
The percentage of fixed animals in large-sample is
7) Make a pie-chart for the animals in each sample, showing percentages for each species.
The percentage of tarantulas in the entire population is roughly 5%
The percentage of tarantulas in small-sample is
The percentage of tarantulas in large-sample is
8) Click "Run" to direct the computer to generate a different set of random samples of these sizes. Make a new pie-chart for each sample showing percentages for each species.
The percentage of tarantulas in the entire population is     roughly 4.9%
The percentage of tarantulas in small-sample is
The percentage of tarantulas in large-sample is
9) Which sample size gave us a more accurate inference about the whole population? Why?

# The Data Cycle in a Nutshell

Data Science is all about asking questions of data.

- Sometimes the answer is easy to compute.
- Sometimes the answer to a question is already in the dataset no computation needed.
- Sometimes the answer just sparks more questions!

Each question a Data Scientist asks adds a chapter to the story of their research. Even if a question is a "dead-end", it's valuable to share what the question was and what work you did to answer it!



1) We start by **Asking Questions** after reviewing and closely observing the data. These questions can come from initial wonderings, or as a result of previous data cycle. Most questions can be broken down into one of four categories:

- Lookup questions Answered by only reading the table, no further calculations are necessary! Once you find the value, you're done! Examples of lookup questions might be "How many legs does Felix have?" or "What species is Sheba?"
- Arithmetic questions Answered by doing calculations (comparing, averaging, totaling, etc.) with values from one single column. Examples of arithmetic questions might be "How much does the heaviest animal weigh?" or "What is the average age of animals from the shelter?"
- Statistical questions These are questions that both expect some variability in the data related to the question and account for it in the answers. Statistical questions often involve multiple steps to answer, and the answers aren't black and white. When we compare two statistics we are actually comparing two datasets. If we ask "are dogs heavier than cats?", we know that not every dog is heavier than every cat! We just want to know if it is generally true or generally false!
- Questions we can't answer We might wonder where the animal shelter is located, or what time of year the data was gathered! But the data in the table won't help us answer that question, so as Data Scientists we might need to do some research beyond the data. And if nothing turns up, we simply recognize that there are limits to what we can analyze.
- 2) Next, we **Consider Data**, by determining which parts of the dataset we need to answer our question. Sometimes we don't have the data we need, so we conduct a survey, observe and record data, or find another existing dataset. Since our data is contained in a table, it's useful to start by asking two questions:
- What rows do we care about? Is it all the animals? Just the lizards?
- What columns do we need? Are we examining the ages of the animals? Their weights?
- 3) Then, we **Analyze the Data**, by completing calculations, creating data visualizations, creating new tables, or filtering existing tables. The results of this step are calculations, patterns, and relationships.
- Are we making a pie chart? A bar chart? Something else?
- 4) Finally, we Interpret the Data, by answering our original question and summarizing the process we took and the results we found.

Sometimes the data cycle ends once we've interpreted the data... but often our interpretations lead to new questions... and the cycle begins again!

# Which Question Type?

name	type1	hitpoint	attack	defense	speed
Bulbasaur	Grass	45	49	49	45
lvysaur	Grass	60	62	63	60
Venusaur	Grass	80	82	83	80
Mega Venusaur	Grass	80	100	123	80
Charmander	Fire	39	52	43	65
Charmeleon	Fire	58	64	58	80
Charizard	Fire	78	84	78	100
Mega Charizard X	Fire	78	130	111	100
Mega Charizard Y	Fire	78	104	78	100
Squirtle	Water	44	48	65	43
Wartortle	Water	59	63	80	58

Start by filling out **ONLY the "Question Type"** column of the table below.

Based on the Pokemon data above, decide whether each question is best described as:

- Lookup Answered by only reading the table, no further calculations are necessary!
- Arithmetic Answered by doing calculations (comparing, averaging, totalling, etc.) with values from one single column.
- **Statistical** Best asked with "in general" attached, because the answer isn't black and white. If we ask "are dogs heavier than cats?", we know that not every dog is heavier than every cat! We just want to know if it is *generally true* or *generally false*!

	Question	Question Type	Which Rows?	Which Column(s)?
1	What type is Charizard?			
2	Which Pokemon is the fastest?			
3	What is Wartortle's attack score?			
4	What is the mean defense score?			
5	What is a typical defense score?			
6	Is Ivysaur faster than Venusaur?			
7	Is speed related to attack score?			
8	What is the most common type?			
9	Does one type tend to be faster than others?			
10	Are hitpoints (hp) similar for all Pokemon in the table?			
11	How many Fire-type Pokemon have a speed of 78?			

# Data Cycle: Consider Data

Part 1: For each question below, identify the type of question and fill in the Rows and Columns needed to answer the question.

Ask Questions	How old is Boo-boo? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
<del>-</del> -	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Ask Questions	Are there more cate than dogs in the chalter?	Question Type (circle one):
3	Are there more cats than dogs in the shelter? What question do you have?	Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
art 2: Think of 2 c	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.) uestions of your own and follow the same process for them.	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
<del></del>	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
		Question Type
Ask Questions	What question do you have?	(circle one):  Lookup Arithmetic Statistical

# Data Cycle: Categorical Distributions (Animals)

Using the Expanded Animals Starter File, let's make a pie-chart to see what we can learn about the distribution of fixed animals and what new questions it may lead us to.

Ask Questions	Are more animals fixed or unfixed? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	All the rows Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  fixed What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	The chart shows that there are fixed animals unfix unfix some new questions this raises include:	ed animals.
Let's make a <b>stack</b> e	ed-bar-chart to see if the ratio of fixed to unfixed animals differs by species.	
Ask Questions	How does the ratio of fixed to unfixed animals differ by species? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	The stacked bar chart shows that species have fixed anim unfixed animals. I also notice Some new questions this raises include:	alsas/than

# Data Cycle: Categorical Distributions 2 (Animals)

Open the Expanded Animals Starter File. Explore the distribution of a categorical column using pie-chart or bar-chart.

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	☐ The chart shows that there is an even distribution of  ☐ The chart shows that the most common is/are  ☐ Inotice that  ☐ Wonder  ☐ How does the distribution of differ by  ☐ Variable  Another question I have is  ution of two categorical columns using stacked-bar-chart or multi-bar-chart.	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Analyze Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  What code will make the table or display you want?	
Interpret Data	When we break the distribution of down by: variable: variable: I notice that  Another question I have is	

# **Choosing Your Dataset in a Nutshell**

When selecting a dataset to explore, *pick something that matters to you!* You'll be working with this data for a while, so you don't want to pick something at random just to get it done.

When choosing a dataset, it's a good idea to consider a few factors:

#### 1. Is it interesting?

Pick a dataset you're genuinely interested in, so that you can explore questions that fascinate you!

#### 2. Is it relevant?

Pick a dataset that deals with something personally relevant to you and your community!

Does this data impact you in any way?

Are there questions you have about the dataset that mean something to you or someone you know?

#### 3. Is it familiar?

Pick a dataset you know about, so you can use your expertise to deepen your analysis! You wouldn't be able to make samples of the Animals Dataset properly if you didn't know that some animals are much bigger or longer-lived than others.

# Consider and Analyze

Fill in the tables below by considering the rows and columns you need. Look up the <u>Contract</u> for the display and record the Pyret code you'd need to make it. If time allows, type your code into <u>code.pyret.org (CPO)</u> to see your display!

1) A pie-chart showing the species of animals from the shelter.

	Which Rows?	Which Column(s)?	What will you Create
	All the animals		
ode:			
Abar-c	hart showing the sex of animals f	rom the shelter.	
	Which Rows?	Which Column(s)?	What will you Create
	All the animals		
ode:			
)Ahisto	gram of the number of pounds tha	at animals weigh.	
	Which Rows?	Which Column(s)?	What will you Create
	All the animals		
ode:			
) A box-p	lot of the number of pounds that	animals weigh.	
	Which Rows?	Which Column(s)?	What will you Create
	All the animals		
ode:			
) A scatt	er-plot, using the animals' spec	ies as the labels, age as the x-axis, and pounds as	s the y-axis.
	Which Rows?	Which Column(s)?	What will you Create
	All the animals		
ode:			
	er-plot, using the animals' name	as the labels, pounds as the x-axis, and weeks as	the y-axis.
) A scatt			
) A scatt	Which Rows?	Which Column(s)?	What will you Create

# My Dataset

The	dataset contains data rows.	
1) I'm interested in this data because		
2) My friends, family or neighbors would be interested because	ise	
3) Someone else should care about this data because		
4) In the table below, write down what you Notice and Wond	er about this dataset.	
What do you Notice?	What do you Wonder?	Question
		Lookup Arithmetic Statistical Can't Answer
5) Consider each Wonder you wrote above and Circle what ty	ype of question it is.	
Choose two columns to describe below.		
6), which contains categorical.	data. Example values from this column include:	
7), which contains categorical.	data. Example values from this column include:	

# Data Cycle: Categorical Data

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
Analyze Data	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	

## Relationships Between Quantitative Columns

#### **Scatter Plots**

Scatter plots can be used to look for relationships between columns. Each row in the dataset is represented by a point, with one column providing the x-value (*explanatory variable*) and the other providing the y-value (*response variable*). The resulting "point cloud" makes it possible to look for a relationship between those two columns.

- Form
  - If the points in a scatter plot appear to follow a straight line, it suggests that a linear relationship exists between those two columns.
  - Relationships may take other forms (u-shaped for example). If they aren't linear, it won't make sense to look for a correlation.
  - Sometimes there will be no relationship at all between two variables.
- Direction
  - The correlation is **positive** if the point cloud slopes up as it goes farther to the right. This means larger y-values tend to go with larger x-values.
  - The correlation is **negative** if the point cloud slopes down as it goes farther to the right.
- Strength
  - It is a **strong** correlation if the points are tightly clustered around a line. In this case, knowing the x-value gives us a pretty good idea of the y-value.
  - It is a weak correlation if the points are loosely scattered and the y-value doesn't depend much on the x-value.

#### Line of Best Fit

**Linear Relationships** can be graphically summarized by drawing a straight line through the data cloud. This summary line is called a "model", as it attempts to provide a simple summary for trends in the dataset. For most datasets, there is no line that will touch every dot, so *all possible models will have some error!* But if the line is close enough to enough of the dots, the model can still help us reason and make predictions about y-values from x-values

$$Data = Model + Error$$

The line that is *closest* to all the other points is known as the *line of best fit*, meaning it is the *best possible summary* of the relationship and therefore the *best possible model*.

**Linear Regression** is a way of computing the **line of best fit**. It considers every single data point to generate the optimal linear model, with the smallest possible vertical distance between the line and all the points taken together. (*More specifically, the computer minimizes the sum of the squares of the vertical distances from all of the points to the line. There's a reason we use computers to do this!)* 

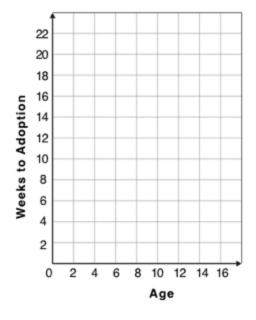
Points that do not fit the trend line in a scatter plot are called unusual observations.

# **Creating a Scatter Plot**

#### **New Animals**

- 1) The table below has some new animals!
- Choose an animal and plot a dot for it on the scatter plot on the right using its age and weeks values. (Pay careful attention to how the axes are labelled.)
- Then write the animal's name next to the dot you made.

name	species	age	weeks
"Alice"	"cat"	1	2
"Bob"	"dog"	17	2
"Callie"	"cat"	14	16
"Diver"	"lizard"	1	20
"Eddie"	"dog"	6	9
"Fuzzy"	"cat"	8	5
"Gary"	"rabbit"	4	2
"Hazel"	"dog"	3	3
"Chelsea"	"cat"	12	14
"Josie"	"dog"	9	12
"Cheetah"	"dog"	10	8

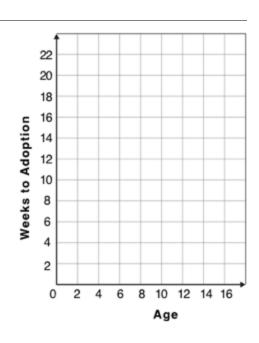


- 2) Plot the rest of the animals one at a time labeling each point as you go. After each animal, ask yourself whether or not you see a pattern in the data.
- 3) After how many animals did you begin to see a pattern?

#### Generalizing the pattern

- 4) Use a straight edge to draw a line on the graph that best represents the pattern you see, then circle the cloud of points around that line.
- 5) Are the points tightly clustered around the line or loosely scattered?
- 6) Does this display support the claim that younger animals get adopted faster? Why or why not?

7) Now place 10 points on the graph to make a scatter plot that appears to have NO relationship.



# **Exploring Relationships Between Columns**

This page is designed to be used with the <u>Animals Starter File</u>. Log into <u>code.pyret.org (CPO)</u> to open your saved copy.

As you consider each of the following relationships, first think about what you *expect*, then make the scatter plot to see if it supports your hunch.

1) How are the <u>pounds</u> an animal weighs related to its <u>age</u> ?  response variable?
What would you expect?
What did you learn from your scatter plot?
2) How are the number of weeks response variable it takes for an animal to be adopted related to its number of legs response variable?
What would you expect?
What did you learn from your scatter plot?
3) How are the number oflegs an animal has related to itsage?  response variable  What would you expect?
What did you learn from your scatter plot?
4) Do any of these relationships appear to be linear (straight-line)?
5) Are there any unusual observations?

# Data Cycle: Looking for Relationships (Animals)

Open the <u>Animals Starter File</u>. Use the Data Cycle to search for relationships between columns. The first cycle has a question to get you started. What question will you ask for the second?

vvnat question will y	ou ask for the secona:	
Ask Questions	Is there a relationship between weight and adoption time? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	

# Data Cycle: Looking for Relationships (My Dataset)

Open <u>your chosen dataset</u>. Use the Data Cycle to search for relationships between columns.

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data		
	What code will make the table or display you want?	
	☐ There appears to be no relationship between and	le .
Interpret Data	☐ There appears to be a relation relatio	tionship
	between and  x-variable	
	Some possible outliers might be	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
4	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
	☐ There appears to be no relationship between and	 le
Interpret Data		tionship
	between and  x-variable y-variable	
	Some possible outliers might be	

#### Measures of Center in a Nutshell

#### There are three values used to report the center of a dataset.

- Each of these measures of center summarizes a whole column of quantitative data using just one number:
- Mean is the average of all the numbers in a dataset.
- Median: Half of the dataset will always be greater than or equal to the median. Half of the dataset will always be less than or equal to the median. In an ordered list, the median will either be the middle number or the average of the two middle numbers.
- Mode(s) of a dataset is the value (or values) occurring most often. When all of the values occur equally often, a dataset has no mode.

#### Which Measure of Center is most typical, depends on the shape of the data and the number of values.

- When a dataset is symmetric, values are just as likely to occur a certain distance above the mean as below the mean, and the median and mean are usually close together.
- When a dataset is asymmetric, the median is a more descriptive measure of center than the mean.
- Left skew datasets have a few values that are unusually low, which pull the mean below the median.
- Right skew datasets have a few values that are unusually high, which pull the mean above the median.
  - When a dataset contains a small number of values, the mode(s) may be the most descriptive measure of center. (Note that a small number of *values* is not the same as a small number of *data points*!)

# Mean, Median, Mode(s) Practice

Mean  1) Find the mean of each dataset.	6 6 6 6 6 6 6 6 6 6 6 6 6 6 6 6 6 6 6	, t	7 7 7 7 7 7 7 7 7 7 7 7 7 7 7 7 7 7 7	7 2 6 7 7 6 6
17, 23, 25, 23, 22	11, 3, 7, 4, 5	11, 3, 7, 4	5, 7, 11, 11, 7, 7	2, 3, 5, 4, 3, 7, 4
Modian				
2) Find the median of each dataset.				
17, 23, 25, 23, 22	5, 11, 3, 7, 4	11, 3, 7, 4	5, 7, 11, 11, 7, 7	2, 3, 5, 4, 3, 7, 4
Mode(s)				
3) Find the mode(s) of each dataset.				
17, 23, 25, 23, 22	5, 11, 3, 7, 4	11, 3, 7, 4	5, 7, 11, 11, 7, 7	2, 3, 5, 4, 3, 7,4

### Choosing the Best Measure of Center

Find the measures of center to summarize the pounds column of the Animals Starter File, then respond to the prompts.

1) The three measures of center for this column are:

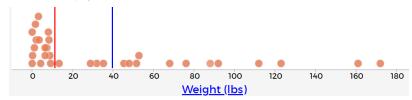
Mean (Average)	Median	Mode(s)
<pre>mean(animals-table, "pounds")</pre>	<pre>median(animals-table, "pounds")</pre>	<pre>modes(animals-table, "pounds")</pre>

2) If we scan the dataset, we can quickly see that <b>most</b> of the animals weigh less than the mean weight. Why is the average so high?	

- 3) Referring to the pounds column of the Animals dataset, fill in the blanks:
- Outliers on the right pull the mean toward the right, causing the mean to be \_\_\_\_\_\_ the median.

  | Greater than/less than | Greater than | Gr
- When the mean is greater than the median, the shape of the data is \_\_\_\_\_\_skewed right/skewed left \_\_\_\_\_.
- Outliers on the left pull the mean toward the left, causing the mean to be \_\_\_\_\_\_ the median.
   When the mean is less than the median, the shape of the data is \_\_\_\_\_.

4) In the dot plot below, identify which line is the median and which is the mean. Then label the lines. Hint: You can refer to the table at the top of the page.



- Which has more data clustered quite close to it, the median or the mean?
- Which do you think better represents the data, the median or the mean? Why?
- 5) What did you learn from calculating the mode(s)?
- 6) In the Interactions area of the <u>Animals Starter File</u>, type modes (animals-table, "species"). What does Pyret return?
- 7) Are there any measures of center that we can use for categorical data?
- 8) For which quantitative column(s) in the animals table do you think the modes might be a good measure of center? Why?
- 9) To take the average of a column, we add all the numbers in that column and divide by the number of rows. Will that work for every column?

## **Critiquing Written Findings**

Consider the following dataset, representing the heaviest bench press (in lbs) for ten powerlifters:

135, 95, 230, 135, 203, 55, 1075, 135, 110, 185

- 1) In the space below, rewrite this dataset in sorted order.
- 2) In the table below, compute the measures of center for this dataset.

Mean (Average)	Median	Mode(s)

3) The following statements are correct ... but misleading. Write down the reason why.

Statement	Why it's misleading
"More personal records are set at 135 lbs than any other weight!"	
"The average powerlifter can bench press about 236 lbs."	
"With a median of 135, that means that half the people in this group can't even lift 135 lbs."	

# Data Cycle: Measures of Center (Animals)

Open the Animals Starter File. Complete both of the Data Cycles shown here, which have questions defined to get you started.

Ask Questions	What is the mean age for animals at the shelter? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	
	What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	
Ask Questions	What is the median time it takes for an animal to be adopted? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions  Consider Data	What is the median time it takes for an animal to be adopted? What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
?	What question do you have?	(circle one): Lookup Arithmetic
?	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
Consider Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic
Consider Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data  Analyze Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic

# Data Cycle: Measures of Center (My Dataset)

Open your chosen dataset. Complete both of the Data Cycles shown here.

Open <u>your chosen a</u>	·	
Ask Questions	What question do you have?	Question Type (circle one):
(3)	That question do you have.	Lookup Arithmetic Statistical
Consider Data		
	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
7	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	
	If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	
	What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	
Ask Questions	What question do you have?	(circle one):
Ask Questions	What question do you have?	
Ask Questions  Consider Data		(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
?		(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic
Consider Data  Analyze Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic
Consider Data  Analyze Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?  What did you find out? What can you infer?	Lookup Arithmetic

## Using Shape to Interpret Data

Read each scenario. Draw a **rough** histogram sketch (you do not need to label the axes), then decide if the histogram is skew left, skew right, or symmetric. Explain your interpretation.

1) In the United States, there are a few billionaires that have far greater incomes than the average (about \$28,000).

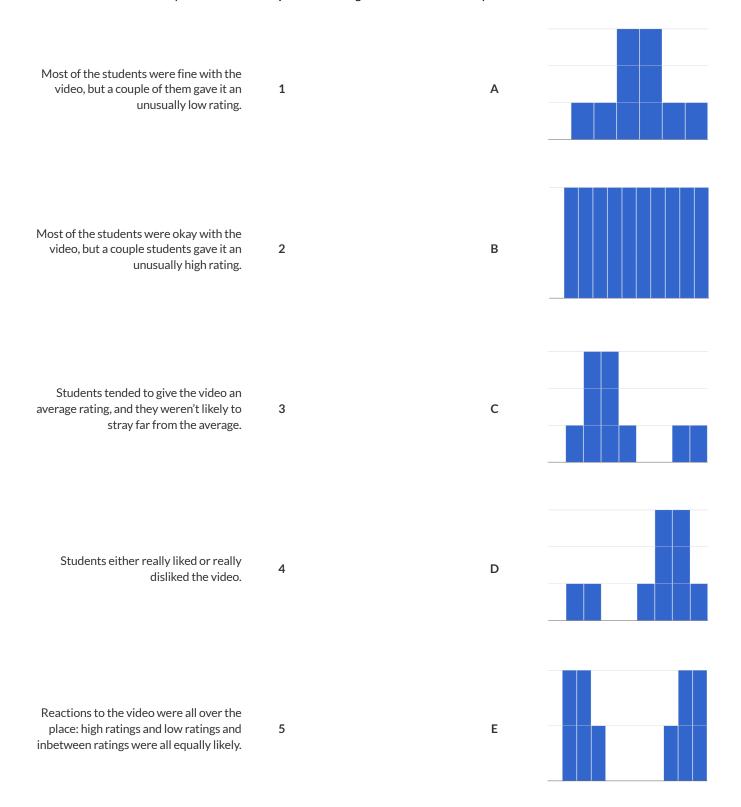
Rough histogram sketch:	Circle one:	skew left	skew right	symmetric
	Explain your c	hoice:		
) A school cafeteria mostly buys canned goo	ds in huge sizes (48-64 ounces),	but also purchas	ses a few ingredients	s in smaller sizes.
Rough histogram sketch:	Circle one:	skew left	skew right	symmetric
	Explain your c	hoice:		
	certain number of ounces below	w the average we	eight (approximately	7.5 pounds) as it is to be
) It's just as likely for a newborn baby to be a umber of ounces above the average weight. Rough histogram sketch:	certain number of ounces below		eight (approximately skew right	7.5 pounds) as it is to be
umber of ounces above the average weight.	Circle one:	skew left	skew right	
umber of ounces above the average weight.	Circle one: Explain your c	skew left hoice:	skew right	symmetric
umber of ounces above the average weight.	Circle one: Explain your c	skew left hoice:	skew right	symmetric
umber of ounces above the average weight.	Circle one: Explain your c	skew left hoice:	skew right	symmetric
umber of ounces above the average weight. Rough histogram sketch:	Circle one:  Explain your c	skew left hoice:	skew right	symmetric
umber of ounces above the average weight.  Rough histogram sketch:  At many restaurants, the busiest dinner tin	Circle one:  Explain your c	skew left hoice:	skew right	symmetric
umber of ounces above the average weight.	Circle one:  Explain your content of the content of	skew left hoice: always a few pec	skew right  ople who want to eat  skew right	symmetric earlier or later. symmetric
umber of ounces above the average weight.  Rough histogram sketch:  At many restaurants, the busiest dinner tin	Circle one:  Explain your content of the content of	skew left hoice: always a few pec	skew right  ople who want to eat  skew right	symmetric
umber of ounces above the average weight.  Rough histogram sketch:  At many restaurants, the busiest dinner tin	Circle one:  Explain your content of the content of	skew left hoice: always a few pec	skew right  ople who want to eat  skew right	symmetric earlier or later. symmetric

#### **Reading Histograms**

Students watched 5 videos, and rated them on a scale of 1 to 10. The average score for every video is the same (5.5).

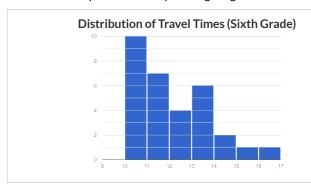
Match the summary description (left) with the *shape* of the histogram of student ratings (right).

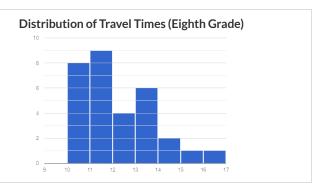
- The x-axis shows the score, and the y-axis shows the number of students who gave it that score.
- These axes are intentionally unlabeled the shapes of the ratings distributions were very different! And that's the focus here.



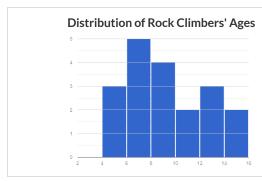
### Histograms and Measures of Center

1) The two histograms below show the number of minutes students spent traveling to school: one represents a sample of sixth grade students and the other represents a sample of eighth grade students. All travel times in the dataset are whole numbers.





- 2) Which group has the larger mode(s).
- sixth graders
- eighth graders
- the modes are roughly the same
- 3) The histogram below shows the ages of the 19 children who signed up for rock climbing camp.

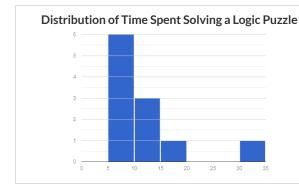


The median age for these 19 climbers is:

- □ about 6 or 7
- □ about 8 or 9
- □ about 10 or 11
- □ about 12 or 13

Explain how you determined the median value:

4) Eleven students were asked to solve a logic puzzle. The minimum time was 5 minutes, and the maximum time was 35 minutes. The distribution of their times is shown on the histogram below.



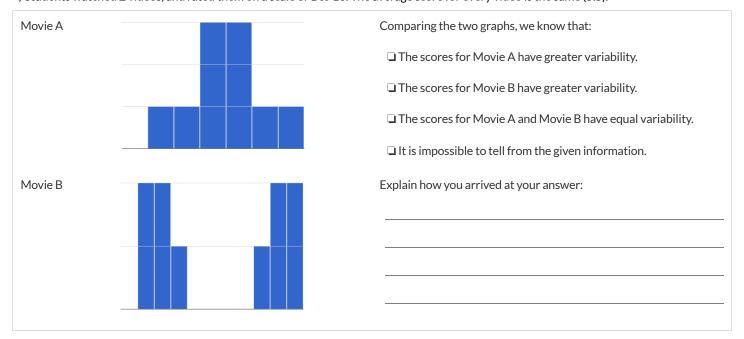
Which of the following statements is likely a correct comparison of the mean and median number of minutes spent working?

- ☐ The mean time is less than the median time.
- ☐ The mean time is equal to the median time.
- $\hfill\Box$  The mean time is greater than the median time.
- ☐ There isn't enough information provided to determine which is greater.

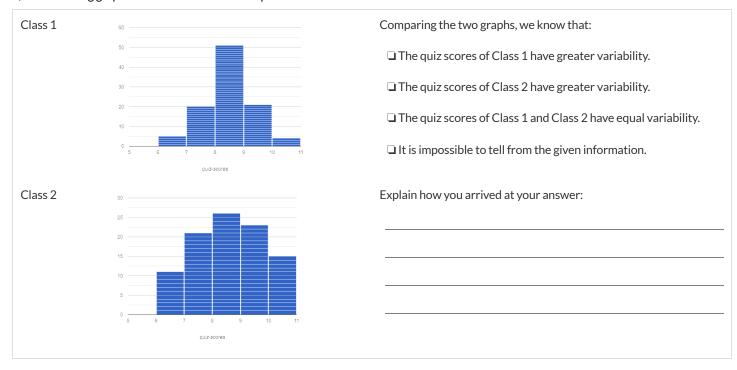
Explain how you arrived at your choice:

### Histograms and Variability

1) Students watched 2 videos, and rated them on a scale of 1 to 10. The average score for every video is the same (5.5).



2) The following graphs show the distribution of quiz scores for two classes.



5) Caro says, Flatter histograms always show less variability. Is she correct? Explain why you agree or disagree with Caro.					
		_			
		_			

# Data Cycle: Quantitative Distributions (Animals) - Histograms

Describe two histograms made from columns of the animals dataset.

The first question is provided. You'll need to come up with the second question on your own!

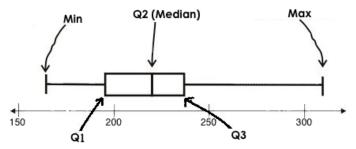
Ask Questions	What is the distribution of weight among all animals at the shelter? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	The histogram I created is for rom from dataset or subset  The shape of this histogram is There are peaks at and gaps a skewed left, skewed right, symmetric.  I notice that Consider statements like: Most of the histogram's area is / A small amount of the histograms area trails out / etc.	at
	I wonder	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions  ?  Consider Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic
?	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic Statistical

#### Measures of Spread in a Nutshell

#### Data Scientists measure the spread of a dataset using a five-number summary:

- Minimum: the smallest value in a dataset it starts the first quarter
- · Q1 (lower quartile): the number that separates the first quarter of the data from the second quarter of the data
- Q2 (Median): the middle value (median) in a dataset
- Q3 (upper quartile): the value that separates the third quarter of the data from the last
- Maximum: the largest value in a dataset it ends the fourth quarter of the data

#### The five-number summary can be used to draw a box plot.



- Each of the four sections of the box plot contains 25% of the data.
  - If the values are distributed evenly across the range, the four sections of the box plot will be equal in width.
  - Uneven distributions will show up as differently-sized sections of a box plot.
- The left whisker extends from the minimum to Q1.
- The **box**, or **interquartile range**, extends from Q1 to Q3. It is divided into 2 parts by the **median**. Each of those parts contains 25% of the data, so the whole box contains the central 50% of the data.
- The right whisker extends from Q3 to the maximum.

#### The box plot above, for example, tells us that:

- The minimum weight is about 165 pounds. The median weight is about 220 pounds. The maximum weight is about 310 pounds.
- The data is not evenly distributed across the range:
  - o 1/4 of the players weigh roughly between 165 and 195 pounds
  - $\circ \quad 1/4 \, \text{of the players weigh roughly between 195 and 220 pounds} \\$
  - $\circ \quad 1/4$  of the players weigh roughly between 220 and 235 pounds
  - $\circ \quad 1/4$  of the players weigh roughly between 235 and 310 pounds
  - 50% of the players weigh roughly between 165 and 220 pounds
  - $\circ~50\%$  of the players weigh roughly between 195 and 235 pounds
  - $\circ \quad$  50% of the players weigh roughly between 220 and 310 pounds
- The densest concentration of players' weights is between 220 and 235 pounds.
- Because the widest section of the box plot is between 235 and 310 pounds, we understand that the weights of the heaviest 25% fall across a wider span than the others.
  - o 310 may be an outlier
  - the weights of the players weighing between 235 pounds 310 pounds could be evenly distributed across the range
  - o or all of the players weighing over 235 pounds may weigh around 310 pounds.

# Distribution of a Dataset

Fa	amily Gath	nerings by	the Numbers						
Lede	et Family Age	es: 1, 44, 3, 42,	46, 74, 75, 21, 74	, 70, 40, 41, 4	5			Average: 44.3	3 years old
1) O	rder the Ages	from Least to	Greatest:						
The	n compute:	Minimum	Q1 -	Median	Q3 Ma	ximum_	Range	Interquartile Rang	ge (IQR)
Wat	son Family A	ges: 70, 68, 69	9, 72, 65, 75, 65, 7	8, 70, 72, 71,	70			Average: 70.4	4 years old
2) O	rder the Ages	s from Least to	Greatest:						
The	n compute:	Minimum	Q1	Median	Q3 Ma	ximum	Range	Interquartile Rang	ge (IQR)
Mak	e box plots fo		age distribution		er lines below. Hint rs from the box to th			ν a box around the	: IQR (from
3) Le	edet:								
	0	10	20	30	40	50	60	70	80
4) W	/atson:								
	0	10	20	30	40	50	60	70	80
C	ompare ar	nd Contras	t						
5) Fo	or which famil	ly gathering w	as the average ag	e more typica	l? How do you kno	w?			
6) W	/hat else do yo	ou Notice and	Wonder about th	e data from tl	nese two family ga	therings?			
_									
7) W	<b>/</b> e plotted bot	h of these box	plots on number	lines with the	same scale. What	are the pros and o	cons of that choic	:e?	

## Matching Dot Plots and Five-Number Summaries

Draw a line from each dot plot on the left to the corresponding five-number summary on the right. You might find it useful to label the five-number summaries before you begin matching (see question 1 for an example).

Dot Plot	5-Number Summary
min Q1   median   Q3 max 1 2 4 6 8 10	Min: 2 Q1: 4 <b>A</b> Median: 7 Q3: 9 Max: 10
<u>2</u> 4 6 8 10 <b>2</b>	Min: 2 Q1: 4 B Median: 6 Q3: 8 Max: 10
2 4 6 8 10	Min: 2 Q1: 3 C Median: 7 Q3: 9 Max: 10
<u>2</u> 4 6 8 10	Min: 2 Q1: 4 D Median: 6 Q3: 9 Max: 10
2 4 6 8 10	Min: 2 Q1: 5 E Median: 6 Q3: 7 Max: 10
<u>2</u> 4 6 8 10	Min: 2 Q1: 4 F Median: 7 Q3: 8 Max: 10
<b>7</b> 2 4 6 8 10	Min: 2 Q1: 3 <b>G</b> Median: 5 Q3: 8.5 Max: 10
<u>2</u> 4 6 8 10	Min: 2 Q1: 3 H Median: 5 Q3: 8 Max: 10

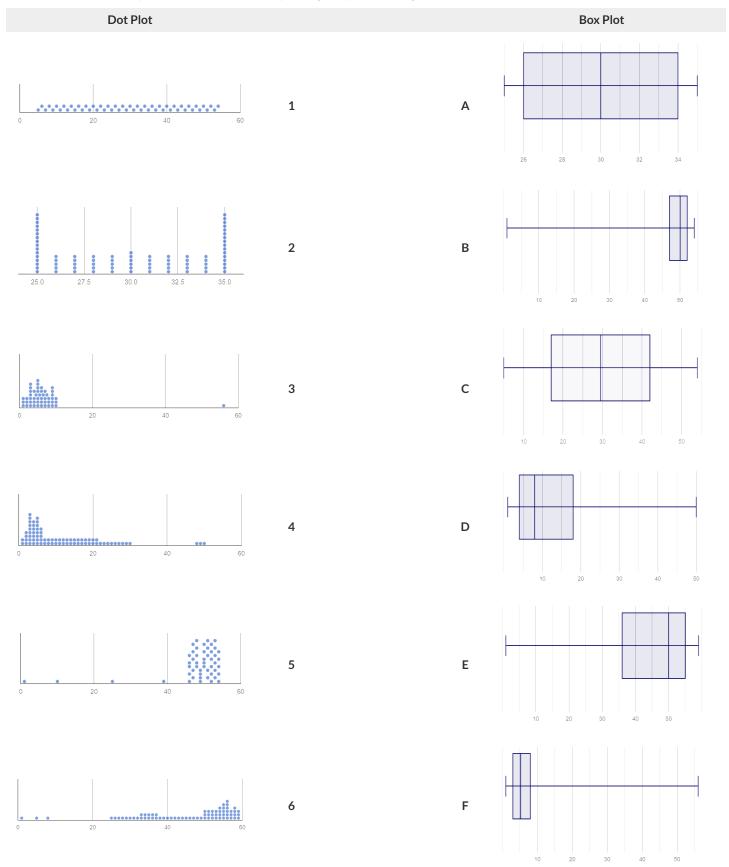
#### **Create Box Plots from Dot Plots**

Use the five-number summary to draw a box plot above the corresponding dot plot. When you're finished, identify which quarter(s) of the data are packed the densest, and which quarter(s) of the data are the most dispersed. The first row has been completed as a sample.



# Matching Dot Plots and Box Plots

Draw a line from each dot plot on the left to the corresponding box plot on the right.

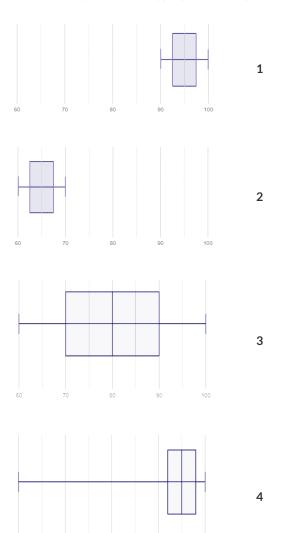


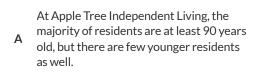
# Summarizing Columns with Measures of Spread

	unds Column			
Get the values to summarize t	the spread of thepo	ounds column of the	Animals Starter File by typ	ing
box-plot(animals-	table, "pounds") into	the Interactions Area.		
1) My five-number summary i	is:			
Minimum	Q1	Median	Q3	Maximum
2) Draw a box plot from this so	ummary on the number line	below. Be sure to label the nu	ımber line with consistent int	ervals.
	<u> </u>	Γ	T 1	
3) The <b>Range</b> is:	and the <b>interqu</b> a	artile Range(IQR) is:		
4) From this summary and box	x plot, I conclude that:			
Summarizing the		_Column		
Choose another column to inv	vestigate by making a box-	plot		
	•			
5) My five-number summary i	is:			
5) My five-number summary i	Q1	Median	Q3	Maximum
		Median	Q3	Maximum
Minimum	Q1			
	Q1			

### **Reading Box Plots**

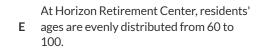
There are six different retirement homes in Retirement City. Each box plot (left) shows the spread of ages at one of the retirement homes. Match each box plot with the appropriate description (right) of residents' ages.





- B The residents of Cherry Hill Retirement Home are all at least 90 years old.
- The majority of seniors at the Edgewood C Home are younger than 70, but there are some exceptions.

D The residents of Juneau Independent Living are mostly in their sixties.



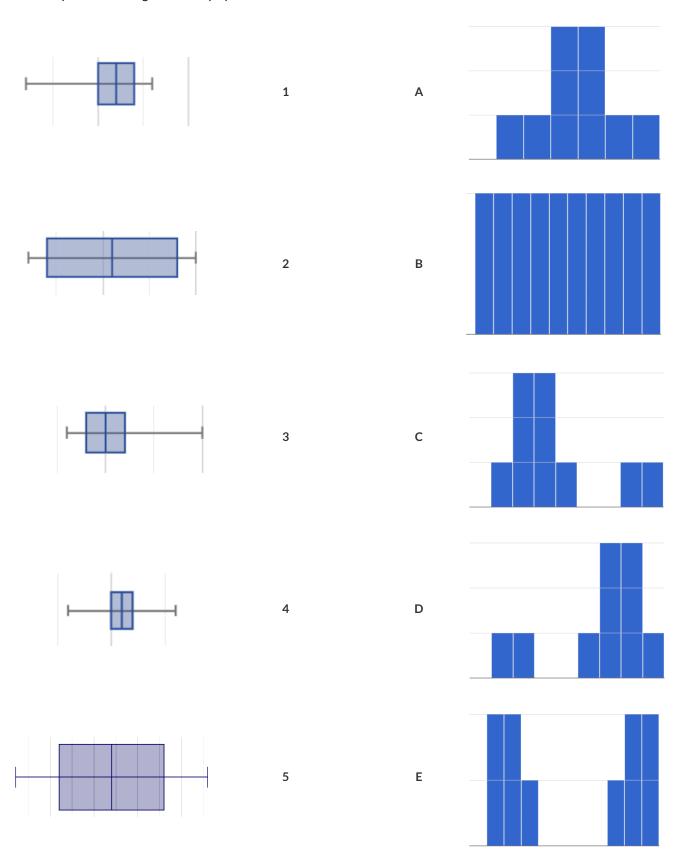
F The median age at Live Oak Assisted Living is 70.

6

5

## Matching Box Plots to Histograms

Students watched 5 videos, and rated them on a scale of 1 to 10. For each video, their ratings were used to generate box plots and histograms. Match each box plot to the histogram that displays the same data.



Directions: Connect each item on this page to at least one other item by drawing an arrow and writing an explanation of how they are connected along the arrow. (Arrows may curve.)	Maximum	50% Interquartile Range	Lower Quartile 25%
Directions: Connect each item on this page to at least are connected along the arrow. (Arrows may curve.)	Minimum	Median	Upper Quartile

# Data Cycle: Quantitative Distributions - Box Plots (Animals)

Open the Animals Starter File. Use the Data Cycle to explore the distribution of one or more quantitative columns using box plots.

Ask Questions	What is the distribution of the weeks column from the animals dataset? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	The box plot forisskewed left/skewed right/symm  The 5-number summary is: min =Q1 =median =Q3 =  The middle 50% of the data lies between andso the Interquartile Range is  I notice thatConsider statements like: 75% of the data fall below / The top 25% of the data fall between / etc	_max =
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions  Consider Data  Analyze Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic

# Data Cycle: Quantitative Distributions - Box Plots (My Dataset)

Open <u>your chosen dataset</u>. Use the Data Cycle to explore the distribution of one or more quantitative columns using **box plots**, and write down your findings.

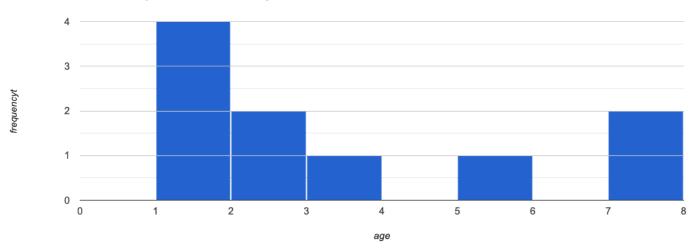
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	
	What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
<b>H</b> .	What - if any - new question(s) does this raise?	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions  Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
?		(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data  Analyze Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic

#### **Computing Standard Deviation**

Here are the ages of different cats at the shelter: 1, 7, 1, 1, 2, 2, 3, 1, 5, 7

1) How many cats are represented in this sample? \_\_\_\_

The distribution of these ages is shown in the histogram below:



2) Describe the shape of this histogram.

3) What is the mean age of the cats in this dataset?

4) How many cats are 1 year old? 2 years old? Fill in the table below. The first column has been done for you.

age	1	2	3	4	5	6	7
frequency	4						

5) Draw a star to locate the mean on the x-axis of the histogram above.

6) For each cat in the histogram above, draw a horizontal arrow under the axis from your star to the cat's interval, and label the arrow with its distance from the mean. (For example, if the mean is 3 and a cat is in the 1yr interval, your arrow would stretch from 1 to 3, and be labeled with the distance "2")

To compute the standard deviation we square each distance and take the average, then take the square root of the average.

7) We've recorded the ages (N=10) shown in the histogram above in the table below, and listed the distance-from-mean for the four 1-yearold cats for you. As you can see, 1 year-olds are 2 years away from the mean, so their squared distance is 4. Complete the table.

age of cat	1	1	1	1	2	2	3	5	7	7
distance from mean	2	2	2	2						
squared distance	4	4	4	4						

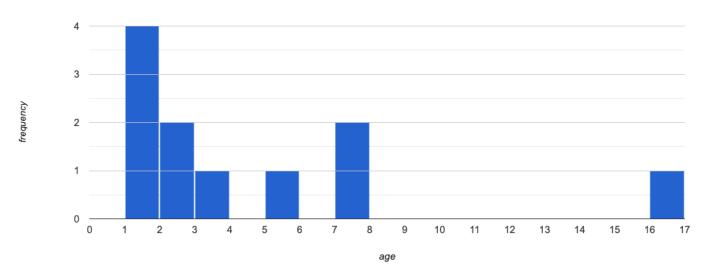
8) Add all the squared distances. What is their sum?
--

9) There are N=10 distances. What is N-1? \_\_\_\_\_ Divide the sum by N-1. What do you get? \_\_\_\_\_

10) Take the square root to find the **standard deviation**!

#### The Effect of an Outlier

The histogram below shows the ages of eleven cats at the shelter:



1) Describe the shape of this histogram.

2) How many cats are 1 year old? 2 years old? Fill in the table below by reading the histogram. The first column has been done for you.

age	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
frequency	4															

3) What is the mean age of the cats in this histogram?

- 4) Draw a star to identify the mean on the histogram above.
- 5) For each cat in the histogram above, **draw a horizontal arrow** from the mean to the cat's interval, and **label the arrow with its distance from the mean**. (If the mean is 2 and a cat is 5 years old, your arrow would stretch from 2 to 5, and be labeled with the distance "3") To compute the standard deviation we square each distance and take the average, then take the square root of the average.
- 6) Recorded the 11 ages shown in the histogram in the first row of the table below. For each age, compute the distance from the mean and the squared distance.

age of cat						
distance from mean						
squared distance						

7) Add all the squared distances. What is their sum?
--

- 8) Divide the sum by N-1. What do you get?
- 9) Take the square root to find the **standard deviation**!
- 10) How did the outlier impact the standard deviation?

# Data Cycle: Measure of Spread (Animals)

Open the <u>Animals Starter File</u>. The mean time-to-adoption is 5.75 weeks. Does that mean most animals generally get adopted in 4-6 weeks? Use the Data Cycle to find out. Write your findings on the lines below, in response to the question.

Ask Questions	Do the animals all get adopted in around the same length of time? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
Analyze Data	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	
	If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?  What - if any - new question(s) does this raise?	
Turn the Data Cyc	e above into a Data Story, which answers the question "If the average adoption time is 5.75 weeks, do a	all the animals get
adopted in roughly		in the drinnals get

# Data Cycle: Measure of Spread (My Dataset)

Open your chosen dataset. Use the Data Cycle to find the standard deviation in two distributions, and write down your thinking and findings.

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	
Analyze Data	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	
	If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	
Interpret Data	What did you find out? What can you infer?	
	What - if any - new question(s) does this raise?	
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions ? Consider Data	What question do you have?  Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
?		(circle one): Lookup Arithmetic
?	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic
Consider Data  Analyze Data	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic

### Identifying Form, Direction and Strength

What do your eyes tell you about the Form, Direction, & Strength of these visualizations? **Note:** If the form is nonlinear, we shouldn't report direction - a curve may rise and then fall.



# $Reflection\, on\, Form, Direction\, and\, Strength$

1) What has to be true about the <i>shape</i> of a relationship in order to start talking about the correlation's <i>direction</i> being positive or negative?
2) What is the difference between a weak relationship and a negative relationship?
3) What is the difference between a <i>strong</i> relationship and a <i>positive</i> relationship?
4) If we find a strong relationship in a sample from a larger population, will that relationship <i>always hold</i> for the whole population? Why or why not?
5) If two correlations are both positive, is the stronger one <i>more positive</i> (steeper slope) than the other?
6) A news report claims that after surveying 10 million people, a positive correlation was found between how much chocolate a person eats and how happy they are. Does this mean eating chocolate almost certainly makes you happier? Why or why not?

#### Summarizing Correlations with r-values

The *correlation* between two quantitative columns can be summarized in a single number, the r-value.

- The sign tells us whether the correlation is positive or negative.
- Distance from 0 tells us the strength of the correlation.
- Here is how we might interpret some specific r-values:
  - ∘ −1 is the strongest possible negative correlation.
  - +1 is the strongest possible positive correlation.
  - o 0 means no correlation.
  - ±0.65 or ±0.70 or more is typically considered a "strong correlation".
  - ±0.35 to ±0.65 is typically considered "moderately correlated".
  - Anything less than about  $\pm 0.25$  or  $\pm 0.35$  may be considered weak.

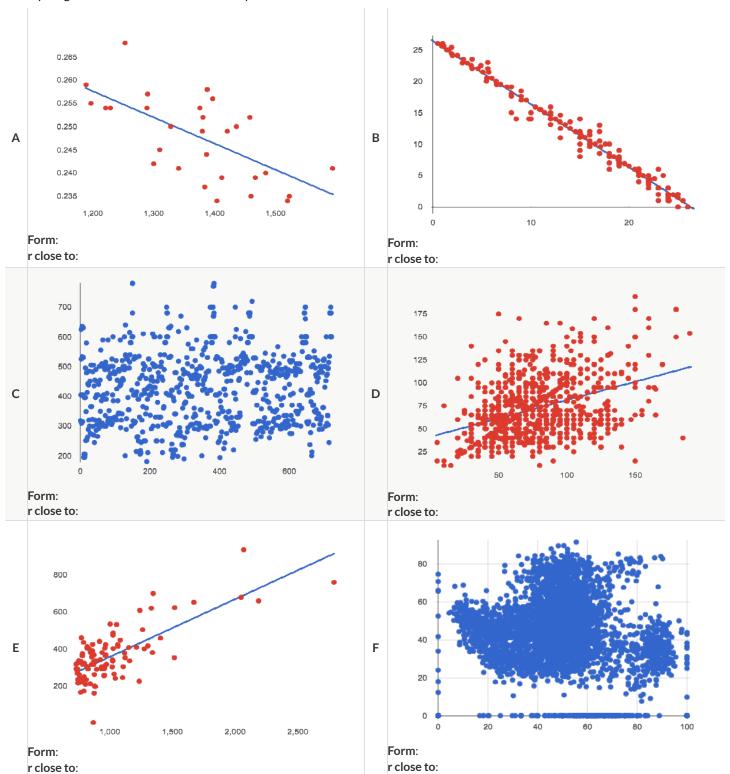
Note: These cutoffs are not an exact science! In some contexts an r-value of  $\pm 0.50$  might be considered impressively strong! And sample size matters! We'd be more convinced of a positive relationship in general between cat age and time to adoption if a correlation of  $\pm 0.57$  were based on 50 cats instead of 5.

<u>Correlation is not causation!</u> Correlation only suggests that two variables are related. It does not tell us if one causes the other. For example, hot days are correlated with people running their air conditioners, but air conditioners do not cause hot days!

### Identifying Form and r-Values

What do your eyes tell you about the Form and Direction of the data? If the form is linear, approximate the r -value. **Reminder:** 

- -1 is the strongest possible *negative* correlation, and +1 is the strongest possible *positive* correlation
- 0 means no correlation
- ±0.65 or ±0.70 or more is typically considered a "strong correlation"
- ±0.35 to ±0.65 is typically considered "moderately correlated"
- Anything less than about ±0.25 or ±0.35 may be considered weak



### **Correlation Does Not Imply Causation!**

Here are some possible correlations and the nonsense headlines a confused journalist might report as a result. In reality, the correlations have absolutely no causal relationship; they come about because both of them are related to another variable that's lurking in the background.

Can you think of another variable for each situation that might be the actual cause of the correlation and explain why the headlines the paper ran based on the correlations are nonsense?

1) <b>Correlation:</b> For a certain psychology test, the amount of time a student studied was negatively correlated with their score! <b>Headline:</b> "Students who study less do better!"				
2) <b>Correlation:</b> Weekly data gathered at a popular beach throughout the year showed a positive correlation between sunburns and shark attacks. <b>Headline:</b> "Sunburns Attract Shark Attacks!"				
3) <b>Correlation:</b> A negative correlation was found between rain and ski accidents. <b>Headline:</b> "Be Safe - Ski in the Rain!"				
4) <b>Correlation</b> : Medical records show a positive correlation between Tylenol use and Death Rates. <b>Headline</b> : "Tylenol use increases likelihood of dying!"				
5) <b>Correlation</b> : A positive correlation was found between hot cocoa sales and snow ball fights. <b>Headline</b> : "Beware: Hot Cocoa Drinking encourages Snow Throwing!"				

# Correlations in the Animals Dataset

# Correlations in My Dataset

1) There may be a correlation between		and		·
	column		column	
I think it is astrong/weak	,	positive/negative	correl	ation,
strong/weak		positive/negative		
because				
It might be stronger if I looked at	a sa	mple or extension of my data		
2) There may be a correlation between	column	and	column	·
I think it is astrong/weak		positive/negative	correl	ation,
strong/weak		positive/negative		
because				
It might be stronger if I looked at	a sa	mple or extension of my data		
3) There may be a correlation between	column	and	column	·
	column			
I think it is astrong/weak	,	positive/negative	correl	ation,
strong/weak		positive/negative		
because				
It might be stronger if I looked at	a sa	mple or extension of my data		
		, , , , , , , , , , , , , , , , , , , ,		
4) There may be a correlation between	column	and		
·	column		column	
I think it is astrong/weak	,		correl	ation,
strong/weak		positive/negative		•
because				
It might be stronger if I looked at		mple or extension of my data		
	a sa	inple or extension of my data		

#### Introduction to Linear Regression

#### How much can one point move the line of best fit?

Open the Interactive Regression Line (Geogebra). Move the blue point "P", and see what effect it has on the red line.

1) Move P so that it is centered amongst the other points. Now move it all the way to top and bottom of the screen.

2) Move P so that it is far to the left or right of the other points. Now move it all the way to top and bottom of the screen. How - if at all - does

the x-position of P impact on the line of best fit?

3) Could the regression line ever be above or below all the points (including the blue one you're dragging)? Why or why not?

4) Would it be possible to have a line with more points on one side than the other? Why or why not?

5) What is the highest r -value you can get? \_\_\_\_\_

Where did you place P? ( ,

6) What function describes the regression line with this value of P?

y = \_\_\_\_\_ x + \_\_\_\_

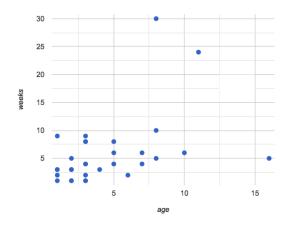
7) What is the lowest r -value you can get? \_\_\_\_\_

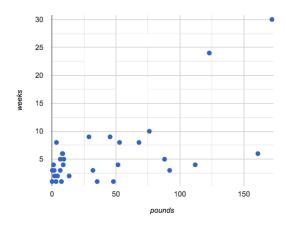
Where did you place P? (\_\_\_\_\_,\_\_\_

8) What function describes the regression line with this value of P?

y = x +

#### **Predictions from Scatter Plots**





9) Use a straight edge to draw what you think would be the line of best fit for age vs. weeks (on the left). Is this a strong correlation that will allow us to make a good prediction of an animal's adoption time just by knowing how old it is?

10) Use a straight edge to draw what you think would be the line of best fit for **pounds vs. weeks** (on the right). Is this a strong correlation that will allow us to make a good prediction of an animal's adoption time just by knowing how heavy it is?

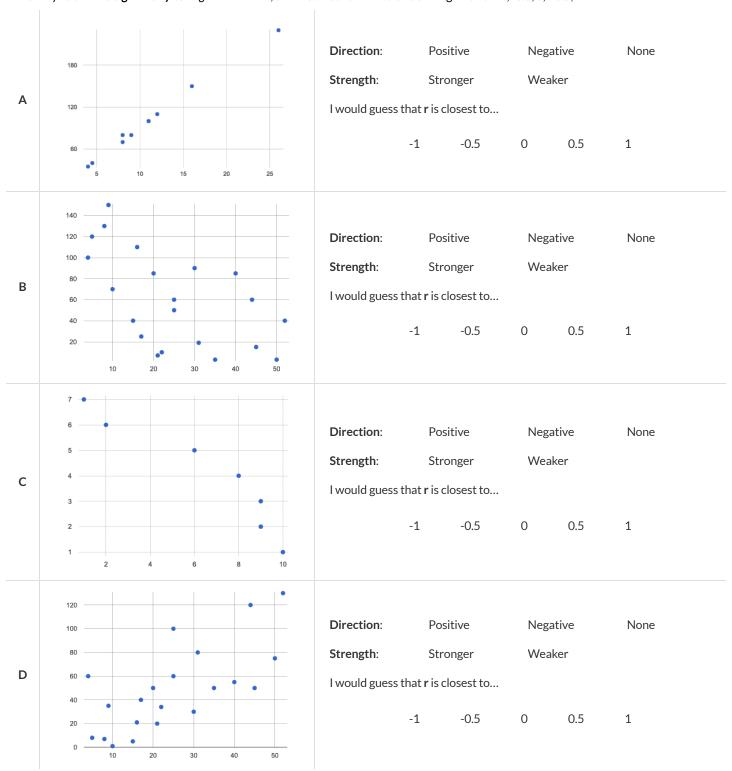
11) Do either or both of the relationships appear to be linear?

#### **Drawing Predictors**

#### Remember what we learned about r-values...

r = -1	r = -0.5	r = 0	r = 0.5	r = 1
perfect negative correlation	moderate negative association	no correlation	moderate positive association	perfect positive correlation

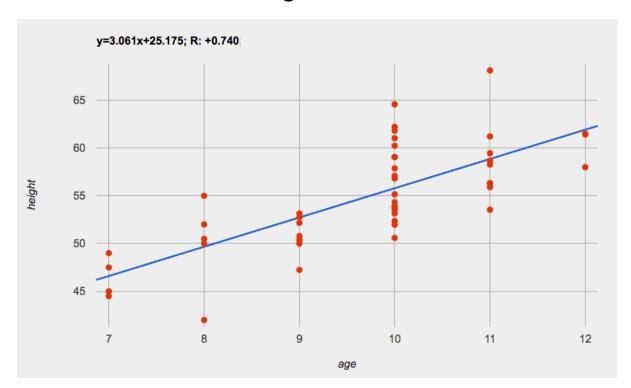
For each of the scatter plots below, draw a **predictor line** that seems like the best fit. Describe the correlation in terms of Direction and whether you think it is **generally** stronger or weaker, then estimate the r-value as being close to -1, -0.5, 0, +0.5, or +1.



# **Exploring Ir-plot**

age You should already have plotted lr-plot(animals-table, "name", "age", "weeks") in the Animals Starter File.
1) What is the predictor function? $y = \underline{\qquad} x + \underline{\qquad} r = \underline{\qquad} r = \underline{\qquad}$
2) What is the slope?
3) What is the y-intercept?
4) How long would our line of best fit predict it would take for a 5 year-old animal to be adopted?
5) What if they were a newborn, or just 0 years old?
6) Does it make sense to find the adoption time for a newborn using this predictor function? Why or why not?
weight  Make another Ir-plot, but this time use the animals' weight as our explanatory variable instead of their age.
7) How long would our line of best fit predict it would take for an animal weighing 21 pounds to be adopted?
8) What if they weighed 0.1 pounds?
<b>cats</b> Make another lr-plot, comparing the age v. weeks columns for <b>only the cats</b> using the following code:
<pre>fun is-cat(r): r["species"] == "cat" end lr-plot(filter(animals-table, is-cat), "name", "age", "weeks")</pre>
9) What is the predictor function? $y = $ $x + $ $r = $
10) What is the slope?
11) What is the y-intercept?
12) How does this line of best fit for <i>cats</i> compare to the line of best fit for <i>all animals</i> ?
13) How long would our line of best fit predict it would take for a 5 year-old cat to be adopted?  ★ Make another lr-plot, comparing the age v. weeks columns for only the dogs.

# **Making Predictions**



1) About how many inches are kids in this dataset expected to grow per year?
2) At that rate, if a child were 45" tall at age eight, how tall would you expect them to be at age twelve?
3) At that rate, if a ten-year-old were 55" tall, how tall would you expect them to have been at age 9?
4) Using the equation, how tall would you expect a seven-year-old child to be?
5) How many of the seven-year-olds in this sample are actually that height?

6) Using the equation, determine the expected height of someone who is...

7.5 years old	13 years old	6 years old	newborn	90 years old

Normalish and in this good into the matical Black to be the Locate account 200/lb 2		
Famulaida ann in this mundint of matina libral, to be the least annuate 210/lb 2		
) For which ages is this predictor function likely to be the <b>least</b> accurate? Why?		

# Interpreting Regression Lines & r-Values

Use the predictor function and r-value from each linear regression finding on the left to fill in the blanks of the corresponding description on the right.

1	sugar(m) = -3.19m + 12 r = -0.05	For every additional Marvel Universe movie released each year, the average person is predicted to consume pounds of sugar! This correlation is [strong, moderate, weak, practically non-existent]
2	height(s) = 1.65s + 52 r = 0.89	Shoe size and height are
3	babies(u) = 0.012u + 7.8 r = 0.01	There is relationship found between the number of Uber drivers in a city and the number of babies born each year.
4	score(w) = -15.3w + 1150 r = -0.65	The correlation between weeks-of-school-missed and SAT score is
5	weight(n) = 1.6n + 160 r = 0.12	There is a,

# Data Cycle: Regression Analysis (Animals)

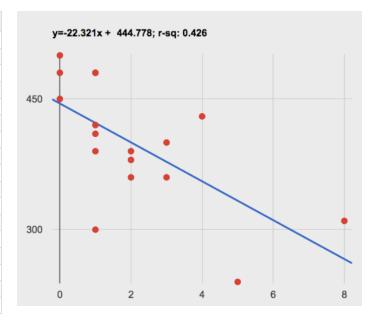
Open the <u>Animals Starter File</u>. Before completing a data cycle on your own, read the provided example.

Ask Questions	How big of a factor is age in determining adoption time? What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	all animals at the shelter Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  name, age, and weeks What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	<pre>lr-plot(animals-table, "name", "age", "weeks") What code will make the table or display you want?</pre>	
Interpret Data	I performed a linear regression on a sample of animals at the shelter [dataset or subset]  moderate (R=.448), positive correlation between age weak/strong/moderate (R=), positive/negative [x-axis]	
	time to adoption [y-axis] . I would predict that a 1 year [x-axis units] increase in age [x-axis] associated with a .789 week increase in time to adoption [slope, y-units] increase / decrease [y-axis] .	is
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions  Consider Data		(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	(circle one): Lookup Arithmetic Statistical

### **Describing Relationships**

A small sample of people were surveyed about their coffee drinking and sleeping habits. Does drinking coffee impact one's amount of sleep? **NOTE:** this data is made up for instructional purposes!

Daily Cups of Coffee	Sleep (minutes)
3	400
0	480
8	310
1	300
1	390
2	360
1	410
0	500
2	390
1	480
3	360
4	430
0	450
5	240
1	420
2	380
1	480



Describe the relationship betw	een corree intake and r	minutes of sieep sno	own in the data abov	e.	
Why is the y-axis of the display	above misleading?				
, , ,	<u> </u>				

## Data Cycle: Regression Analysis (My Dataset)

Open your chosen dataset. Ask a question about your data to tell your Data Story.

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)	
Analyze Data	What code will make the table or display you want?	
Interpret Data	I performed a linear regression on a sample of and four	nd a
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical
Ask Questions  Consider Data		(circle one): Lookup Arithmetic
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic

### Threats to Validity in a Nutshell

Threats to Validity can undermine a conclusion, even if the analysis was done correctly.

### People Make Mistakes

Sometimes even well-meaning Data Scientists can make mistakes if they're not careful. Data Scientists need to be careful to avoid the four threats below.

- Selection bias identifying the favorite food of the rabbits won't tell us anything reliable about what all the animals eat.
- **Study bias** If someone is supposed to assess how much cat food is eaten each day on average, but they only measure how much cat food is put in the bowls (instead of how much is actually consumed), they'll end up with an over-estimate.
- Poor choice of summary Suppose a different shelter that had 10 animals recorded adoption times (in weeks) as 1, 1, 1, 7, 7, 8, 8, 9, 9, 10. Using the mode (1) to report what's typical would make it seem like the animals were adopted more quickly than they really were, since 7 out of 10 animals took at least 7 weeks to be adopted.
- **Confounding variables** Some shelter workers might prefer cats, and steer people towards cats as a result. This would make it appear that "cats are more popular with people", when the real variable dominating the sample is what workers at the shelter prefer.

#### **Fake News**

But sometimes, it's not an accident: **some people deliberately misuse statistics to create "Fake News" and manipulate others!** An evil Data Scientist might make the four mistakes above *on purpose!* Here are some other slimy ways to make an analysis invalid:

- Using the Wrong Measure of Center With heavily-skewed data (like income in America), using the mean is deeply misleading.
- Using a Correlation to Imply Causation Just because two variables are correlated doesn't mean one is causing the other!
- Incorrect Interpretation of a Visualization Someone might point to the tallest bar in a bar chart or histogram and say "See? Most of the people surveyed said...", even if the tallest bar represents only a small percentage of the people surveyed!
- Intentionally Using the Wrong Chart Surveying pet-owners at a dog park to ask about their favorite animal is obviously misleading. A Bar Chart will show empty space for the "Cat" category, which would be a huge red-flag that the survey used a biased sample. But using a Pie Chart will hide the problem, because there's no such thing as an "empty pie slice"!
- Changing the Scale of a Chart A change in poverty from 10.1% to 10.3% is really small, but if the y-axis of the graph goes from 10 to 10.5 it will look like a HUGE climb! The same trick can be played with bar charts, histograms, or box-plots, to exaggerate small differences or hide large ones.

#### Outliers: Do they stay or do they go?

In any population, there are often one or two samples that are way outside the range of the group. These outliers can really change the results of your analysis, by altering up the average or skewing the shape of the data.

- It can be tempting to remove outliers, and *sometimes* there's a good reason to do it! You might spot an obvious typo, or an answer that you can tell was written by accident.
- But *some* outliers are completely valid, and very important! A small town that has a 30x higher rate of cancer than everywhere else might point to something really important!

As Data Scientists, outliers require us to investigate more closely. And whether we decide to keep or remove them, we should *always* explain our reasoning.

### Identifying Threats to Validity

Some volunteers from the animal shelter surveyed a group of pet owners at a local dog park. They found that almost all of the owners were there with their dogs. From this survey, they concluded that dogs are the most popular pet in the state.

1) What are some possible threats to the validity of this conclusion?
The animal shelter noticed a large increase in pet adoptions between Christmas and Valentine's Day. They conclude that at the current rate, there will be a huge demand for pets this spring.
2) What are some possible threats to the validity of this conclusion?

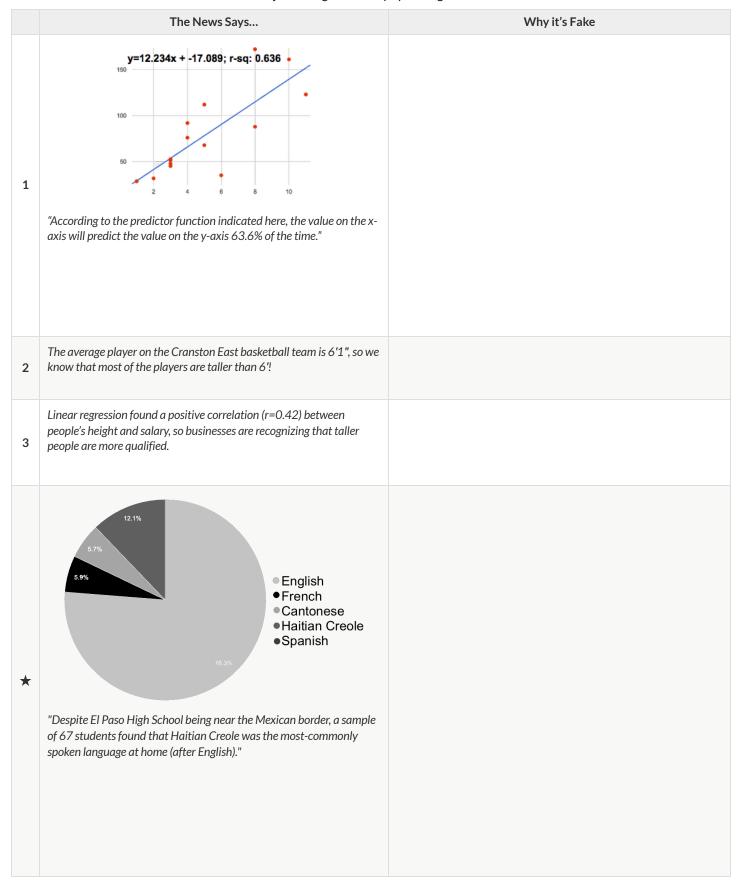
## Identifying Threats to Validity (2)

The animal shelter wanted to find out what kind of food to buy for their animals. They took a random sample of two animals and the food they eat, and they found that 100% of animals surveyed ate spider food!

I) Explain why sampling just two animals can result in unreliable conclusions about what kind of food is needed.
A volunteer opens the shelter in the morning and walks all the dogs. At mid-day, another volunteer feeds all the dogs and walks them again. In the evening, a third volunteer walks the dogs a final time and closes the shelter. The volunteers report that the dogs are much friendlier and more active at nid-day, so the shelter staff assume the second volunteer must be better with animals than the others.
2) What are some possible threats to the validity of this conclusion?

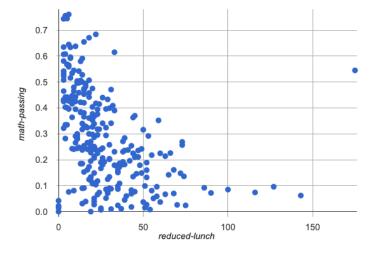
### **Fake News**

The unrelated claims below are ALL WRONG! Your job is to figure out why by looking at the data.



### Outliers: Should they Stay or Should they Go?

Tahli and Fernando are looking at a scatter plot showing the relationship between poverty and test scores at schools in Michigan. They find a trend, with low-poverty schools generally having higher test scores than high-poverty schools. However, one school is an extreme outlier: the highest poverty school in the state also has higher test scores than most of the other schools!



Tahli thinks the outlier should be removed before they start analyzing, and Fernando thinks it should stay. Here are their reasons:

Tahli's Reasons:	Fernando's Reasons:						
This outlier is so far from every other school - it <i>has</i> to be a mistake. Maybe someone entered the poverty level or the test scores incorrectly! We don't want those errors to influence our analysis. Or maybe it's a magnet, exam or private school that gets all the topperforming students. It's not right to compare that to non-magnet schools.	Maybe it's not a mistake or a special school! Maybe the school has an amazing new strategy that's different from other schools! Instead of removing an inconvenient data point from the analysis, we should be focusing our analysis on what is happening there.						
schools.  Do you think this outlier should stay or go? Why? What additional information might help you make your decision?							

# Data Cycle

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical				
Consider Data	What Column(s) do we need (age, weight, in kilograms, weeks, etc.)					
Analyze Data	What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)					
	What code will make the table or display you want?					
Interpret Data	What did you find out? What can you infer?					
	What - if any - new question(s) does this raise?					
Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical				
Ask Questions ? Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic				
?		(circle one): Lookup Arithmetic				
?	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic				
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic				
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic				
Consider Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)	(circle one): Lookup Arithmetic				
Consider Data  Analyze Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic				

# Data Cycle

Ask Questions	What question do you have?	Question Type (circle one): Lookup Arithmetic Statistical				
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?		(circle one): Lookup Arithmetic				
?	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)	(circle one): Lookup Arithmetic				
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Consider Data  Analyze Data	Which Rows should we investigate? (All the rows, just the cats, fixed dogs, etc.)  What Column(s) do we need? (age, weight-in-kilograms, weeks, etc.)  If you only need some rows, define your filter function here (Need help? Use the Design Recipe!)  If you need to make a new column, define your builder function here (Need help? Use the Design Recipe!)  What code will make the table or display you want?	(circle one): Lookup Arithmetic				

# **Design Recipe**

**Directions:** 

Cor	ntract and Purpose S	tatement					
Every	contract has three p	arts					
#		::					>
	function name				Domain		Range
#				what does	the function do?		
Exa	mples						
Write exam	some examples, the ples:	n circle and	label what char	nges			
_	function name	(	input(s)	) is		what the function produces	
end	function name	(	input(s)	) is		what the function produces	
Def	inition						
Write	the definition, giving	g variable n	ames to all your	input values			
fun _	function name	(	va	riable(s)	):		
				what the function	does with those v	variable(s)	
end				What the function	does with those v	al lable(3)	
Cor	ntract and Purpose S	tatement					
	contract has three p						
#		::					->
	function name				Domain		Range
#				what does	the function do?		
Exa	mples			What does	the function do.		
	some examples, the	n circle and	label what char	nges			
exam	ples:						
_	function name	(	input(s)	) is		what the function produces	
	function name	(	input(s)	) is		what the function produces	
end						·	
	inition		. 11				
vvrite	the definition, giving	g variable n	ames to all your	input values			
fun _	function name	(	va	riable(s)	):		
end				what the function	does with those v	rariable(s)	

# **Design Recipe**

**Directions:** 

Co	ntract and Purpose Statement					
Ever	y contract has three parts					
#	<u></u>					->
	function name			Domain		Range
#			what does	the function do?		
Ex	amples					
	e some examples, then circle and	l label what chan	ges			
exan	nples:					
	(		) is			
	function name	input(s)			what the function produces	
	((	input(s)	) is		what the function produces	
end						
	finition					
Writ	e the definition, giving variable n	ames to all your	input values			
fun	(			):		
	function name	var	iable(s)			
_		V	what the function	does with those va	riable(s)	
end		·	vilat the function	does with those ve	in labic(3)	
Dire	ctions:					
Co	ntract and Purpose Statement					
	y contract has three parts					
#	function name			Domain		->Range
#						
			what does	the function do?		
	amples e some examples, then circle and	l labal what chan	~~~			
	e some examples, then circle and n <b>ples:</b>	riabei what chan	ges			
	,		٠.			
_	function name	input(s)	) is		what the function produces	
	1		) is			
_	function name	input(s)			what the function produces	
end	£!!±!					
	f <b>inition</b> e the definition, giving variable n	ames to all your	innut values			
	e the definition, giving variable in	anies to all your	iiiput values			
fun	((	yar	iable(s)	):		
_		v	what the function	does with those va	riable(s)	
end						

### The Animals Dataset

This is a printed version of the animals spreadsheet.

\*The numbers on the left side are NOT part of the table!\* They are provided to help you identify the index of each row.

	name	species	sex	age	fixed	legs	pounds	weeks
0	Sasha	cat	female	1	false	4	6.5	3
1	Snuffles	rabbit	female	3	true	4	3.5	8
2	Mittens	cat	female	2	true	4	7.4	1
3	Sunflower	cat	female	5	true	4	8.1	6
4	Felix	cat	male	16	true	4	9.2	5
5	Sheba	cat	female	7	true	4	8.4	6
6	Billie	snail	hermaphrodite	0.5	false	0	0.1	3
7	Snowcone	cat	female	2	true	4	6.5	5
8	Wade	cat	male	1	false	4	3.2	1
9	Hercules	cat	male	3	false	4	13.4	2
10	Toggle	dog	female	3	true	4	48	1
11	Boo-boo	dog	male	11	true	4	123	24
12	Fritz	dog	male	4	true	4	92	3
13	Midnight	dog	female	5	false	4	112	4
14	Rex	dog	male	1	false	4	28.9	9
15	Gir	dog	male	8	false	4	88	5
16	Max	dog	male	3	false	4	52.8	8
17	Nori	dog	female	3	true	4	35.3	1
18	Mr. Peanutbutter	dog	male	10	false	4	161	6
19	Lucky	dog	male	3	true	3	45.4	9
20	Kujo	dog	male	8	false	4	172	30
21	Buddy	lizard	male	2	false	4	0.3	3
22	Gila	lizard	female	3	true	4	1.2	4
23	Во	dog	male	8	true	4	76.1	10
24	Nibblet	rabbit	male	6	false	4	4.3	2
25	Snuggles	tarantula	female	2	false	8	0.1	1
26	Daisy	dog	female	5	true	4	68	8
27	Ada	dog	female	2	true	4	32	3
28	Miaulis	cat	male	7	false	4	8.8	4
29	Heathcliff	cat	male	1	true	4	2.1	2
30	Tinkles	cat	female	1	true	4	1.7	3
31	Maple	dog	female	3	true	4	51.6	4

### **Sentence Starters**

Use these sentence starters to help describe patterns, make predictions, find comparisons, share discoveries, formulate hypotheses, and ask questions.

Pa	atterns:								
•	I noticed a pattern when I looked at the data. The pattern is								
•	I see a pattern in the data collected so far. My graph shows								
Pr	redictions:								
•	Based on the patterns I see in the data collected so far, I predict that								
•	My prediction for	is							
Cd	omparisons:								
•	When I compared	_ and	, I noticed that						
•	The similarities I see between	and	are						
•	The differences I see between	and	are						
Su	urprises and Discoveries:								
•	I discovered that								
•	I was surprised by								
•	I noticed something unusual about								
Н	ypotheses:								
•	• A possible explanation for what the data showed is								
•	A factor that affected this data might have been								
•	I think this data was affected by								
Q	uestions:								
•	I wonder why								
	I wonder how								
•	How are		affected by						
	Howwill		change if						

### **Contracts for Data Literacy**

Contracts tell us how to use a function, by telling us three important things:

- 1. The Name
- 2. The **Domain** of the function what kinds of inputs do we need to give the function, and how many?
- 3. The Range of the function what kind of output will the function give us back?

For example: The contract triangle :: (Number, String, String) -> Image tells us that the name of the function is triangle, it needs three inputs (a Number and two Strings), and it produces an Image.

 $With these three pieces of information, we know that typing \verb|triangle(20, "solid", "green")| will evaluate to an Image.$ 

Name	Domain		Range
# bar-chart	: ( <u>Table</u> , <u>String</u> )	->	Image
bar-chart(animals-table, "species	')		
# bar-chart-summarized	: ( <u>Table</u> , <u>String</u> , <u>String</u> )	->	Image
bar-chart-summarized(count(animal	s-table, "species"), "value","count")		
# box-plot	: ( <u>Table</u> , <u>String</u> )	->	Image
<pre>box-plot(animals-table, "weeks")</pre>			
# box-plot-scaled	: ( <u>Table</u> , <u>String</u> , <u>Number</u> , <u>Number</u> )	->	Image
box-plot-scaled(animals-table, "w	· · · · · · · · · · · · · · · · · · ·		
# circle	: ( <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
circle(50, "solid", "purple")	,		
# count	: ( <u>Table</u> , <u>String</u> )	->	Table
<pre>count(animals-table, "species")</pre>			
# dot-plot	: ( <u>Table</u> , <u>String</u> , <u>String</u> )	->	Image
<pre>dot-plot(animals-table, "name", "</pre>	oounds")		
# ellipse	: ( <u>Number</u> , <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
ellipse(100, 50, "outline", "oran	ge")		
# first-n-rows	: ( <u>Table</u> , <u>Number</u> )	->	Table
first-n-rows(animals-table, 15)			
# histogram	: ( <u>Table</u> , <u>String</u> , <u>String</u> , <u>Number</u> )	->	Image
histogram(animals-table, "species	', "weeks", 2)		
# isosceles-triangle	: ( <u>Number</u> , <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
isosceles-triangle(50, 20, "solid	·		
# line-graph	: ( <u>Table</u> , <u>String</u> , <u>String</u> , <u>String</u> )	->	Image
line-graph(animals-table, "name",	"pounds","weeks")		
# lr-plot	: ( <u>Table</u> , <u>String</u> , <u>String</u> , <u>String</u> )	->	Image
lr-plot(animals-table, "name", "p	ounds","weeks")		
# mean	: ( <u>Table</u> , <u>String</u> )	->	Number
<pre>mean(animals-table, "pounds")</pre>			

```
Domain
Name
                                                                                                    Range
# median
                                                                                                    Number
                                            <u>Table , String</u>)
median(animals-table, "pounds")
# modes
                                            Table , String )
                                                                                                    List
modes(animals-table, "pounds")
# modified-box-plot
                                            Table , String )
                                                                                                    Image
modified-box-plot(animals-table, "pounds")
# modified-box-plot-scaled
                                          (<u>Table</u>, <u>String</u>, <u>Number</u>, <u>Number</u>)
                                                                                                    Image
modified-box-plot-scaled(animals-table, "weeks", 1, 40)
# modified-vert-box-plot
                                                                                                    Image
                                          (<u>Table</u>, <u>String</u>)
modified-vert-box-plot(animals-table, "pounds")
# modified-vert-box-plot-scaled
                                          ( <u>Table</u>, <u>String</u>, <u>Number</u>, <u>Number</u>)
                                                                                                    Image
modified-vert-box-plot-scaled(animals-table, "weeks", 1, 40)
# multi-bar-chart
                                                                                               ->
                                                                                                    Image
                                            <u>Table , String , String</u> )
multi-bar-chart(animals-table, "species", "sex")
# overlay
                                            Image , Image )
                                                                                                    Image
overlay(circle(10, "solid", "black"), square(50, "solid", "red"))
# pie-chart
                                            <u>Table</u>, <u>String</u>)
                                                                                               ->
                                                                                                    Image
pie-chart(animals-table, "species")
# pie-chart-summarized
                                          ( <u>Table</u>, <u>String</u>, <u>String</u>)
                                                                                                    Image
pie-chart-summarized(count(animals-table, "species"), "value", "count")
# r-value
                                            Table , String , String )
                                                                                                    Number
r-value(animals-table, "pounds", "weeks")
# radial-star
                                              Num
                                                        Num
                                                                  Num
                                                                           Str
                                                                                     Str
                                                                                                    Image
radial-star(6, 20, 50, "solid", "red")
                                                                                                    Table
# random-rows
                                          (<u>Table</u>, <u>Number</u>)
random-rows(animals-table, 10) # select 10 random rows from the table
# rectangle
                                          (<u>Number</u>, <u>Number</u>, <u>String</u>, <u>String</u>)
                                                                                                    Image
rectangle(100, 50, "outline", "green")
# regular-polygon
                                          (<u>Number</u>, <u>Number</u>, <u>String</u>, <u>String</u>)
                                                                                                    Image
                                                                                               ->
regular-polygon(25,5, "solid", "purple")
# rhombus
                                                               String , String )
                                          (<u>Number</u>
                                                     Number
                                                                                                    Image
rhombus(100, 45, "outline", "pink")
# right-triangle
                                          (<u>Number</u>, <u>Number</u>, <u>String</u>, <u>String</u>)
                                                                                                    Image
right-triangle(50, 60, "outline", "blue")
# rotate
                                                      Image )
                                          (<u>Number</u>,
                                                                                                    Image
rotate(45, star(50, "solid", "dark-blue"))
```

Name	Domain		Range
# row-n ::	( <u>Table</u> , <u>Number</u> )	->	Row
row-n(animals-table, 2)			
# scatter-plot ::	( <u>Table</u> , <u>String</u> , <u>String</u> , <u>String</u> )	->	Image
scatter-plot(animals-table, "name",	"pounds","weeks")		
# sort ::	( <u>Table</u> , <u>String</u> , <u>Boolean</u> )	->	Table
sort(animals-table, "species", true			
# sqr ::	( <u>Number</u> )	->	Number
sqr(4)			
# sqrt ::	( <u>Number</u> )	->	Number
sqrt(4)			
# square ::	( <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
square(50, "solid", "red")			
<pre># stacked-bar-chart ::</pre>	( <u>Table</u> , <u>String</u> , <u>String</u> )	->	Image
stacked-bar-chart(animals-table, "s	pecies", "sex")		
# star ::	( <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
star(50, "solid", "red")			
# star-polygon ::	( <u>Number</u> , <u>Number</u> , <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
star-polygon(100, 10, 3 ,"outline",	"red")		
# stdev ::	( <u>Table</u> , <u>String</u> )	->	Number
<pre>stdev(animals-table, "pounds")</pre>			
<pre># string-contains</pre> ::	( <u>String</u> , <u>String</u> )	->	Boolean
<pre>string-contains("hotdog", "dog")</pre>			
# string-length ::	( <u>String</u> )	->	Number
string-length("rainbow")			
# text ::	( <u>String</u> , <u>Number</u> , <u>String</u> )	->	Image
text("Zari", 85, "orange")			
# triangle ::	( <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
triangle(50, "solid", "fuchsia")			
# triangle-asa ::	( <u>Number</u> , <u>Number</u> , <u>Number</u> , <u>String</u> , <u>String</u> )	->	Image
triangle—asa(90, 200, 10, "solid",			
# triangle-sas ::	( Number , Number , Number , String , String )	->	Image
triangle-sas(50, 20, 70, "outline",			
# vert-box-plot ::	( <u>Table</u> , <u>String</u> )	->	Image
vert-box-plot(animals-table, "weeks			
ii ii	~		

:: ->



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