### A (quick) Introduction to Using Python Notebooks for Ocean Science Research Day 2

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2020 Data Labs Virtual REU
June 2020



datalab.marine.rutgers.edu

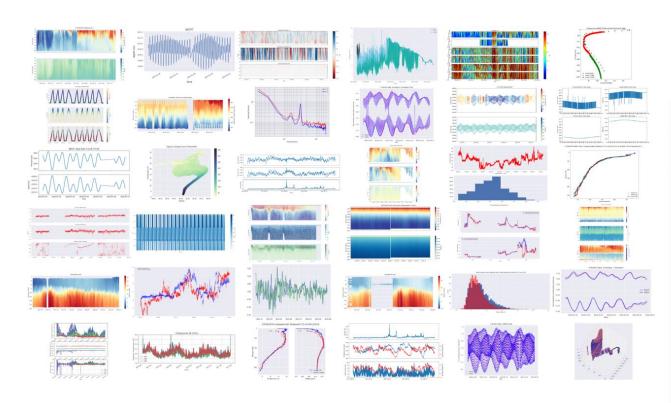






### Today's Agenda

- Quick Intro to Data Visualization
- Data Visualization in Python
  - Customizing Plots
  - More visualization types
- Bonus Activity 4 More plots
  - A new dataset Argo Floats
  - Profile plots
  - T-S Diagrams
  - Maps





### What is "Visualization"?

Visual Analysis

**Data Visualization** 

Info Aesthetics

**Information Design** 

**Explorative Visualization** 

Visual Analytics

Infographics

### Visualization

### Information Visualization (InfoVis)

Charting

Data Art

Infoporn

**Information Art** 

**Bioinformatics** 

Cartography

Mapping

Chart Junk

Pragmatic Visualization

Graphing

Scientific Illustration

**Artistic Visualization** 

"Visual analysis is not primarily about the pictures, but about finding ways to use our powerful visual systems to analyze data. It's analysis done in a visual way. It's visual exploration, visual data analysis, and visual presentation of results."

Robert Kosara, eagereyes.org

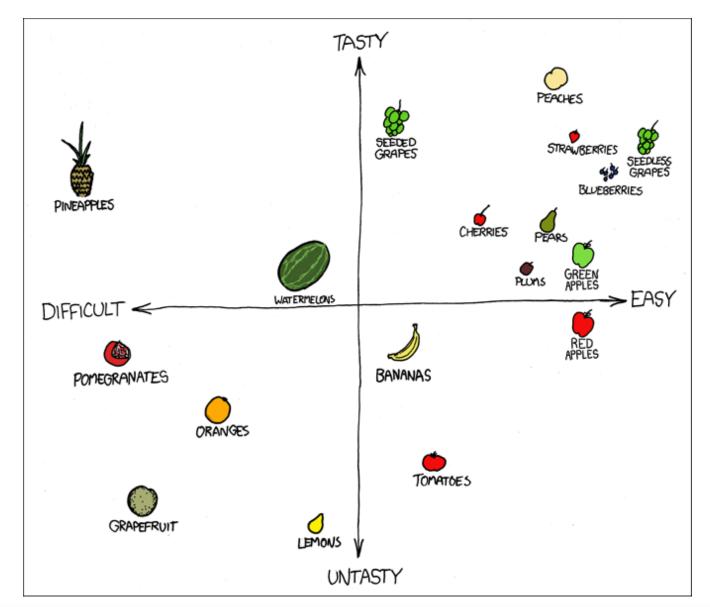




# The World's Greatest Chart?





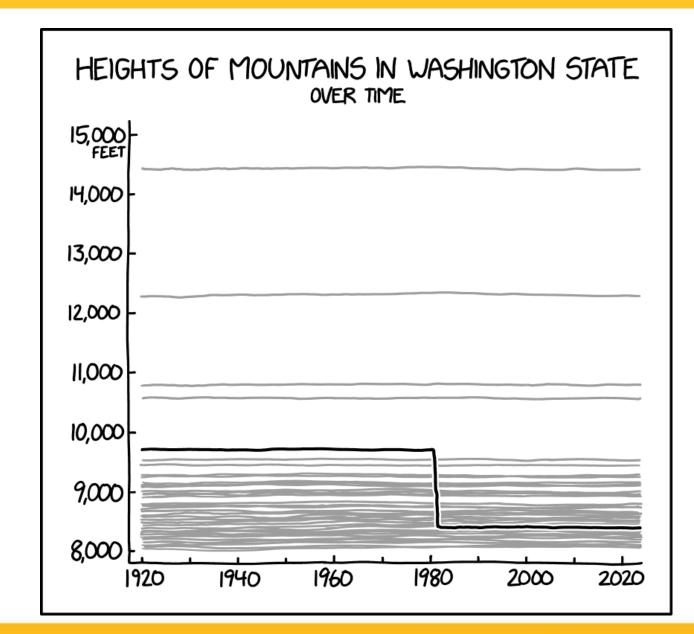


Reference: <a href="https://xkcd.com/388/">https://xkcd.com/388/</a>

Lots more xkcd charts:

https://www.explainxkcd.com/wiki/index.php/Category:Charts





#### Mount St. Helens

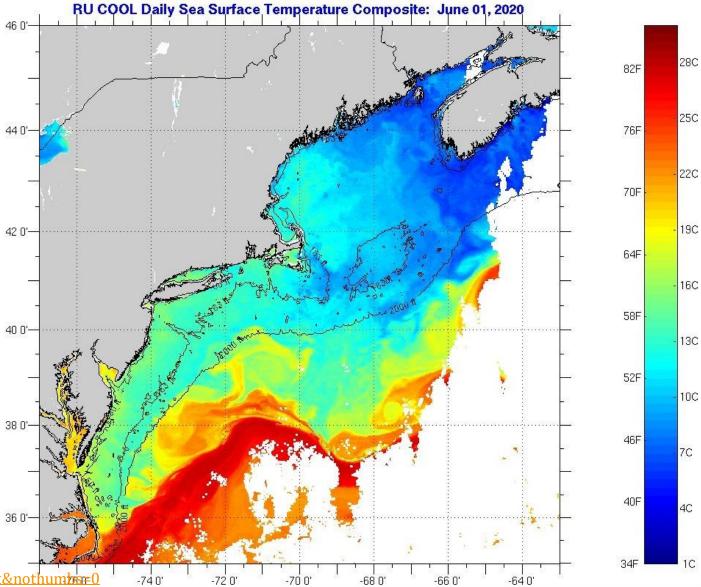
"It's a good mountain, but it really peaked in the 80s."

https://xkcd.com/2308/https://www.explainxkcd.com/wiki/index.php/2308:\_Mount\_St.\_Helens





### Sea Surface Temp



https://marine.rutgers.edu/cool/sat\_data/?product=sst\_comp&region=bigbight&nothumbrsr=0 -740' -720' -700' -680' -660' -640'



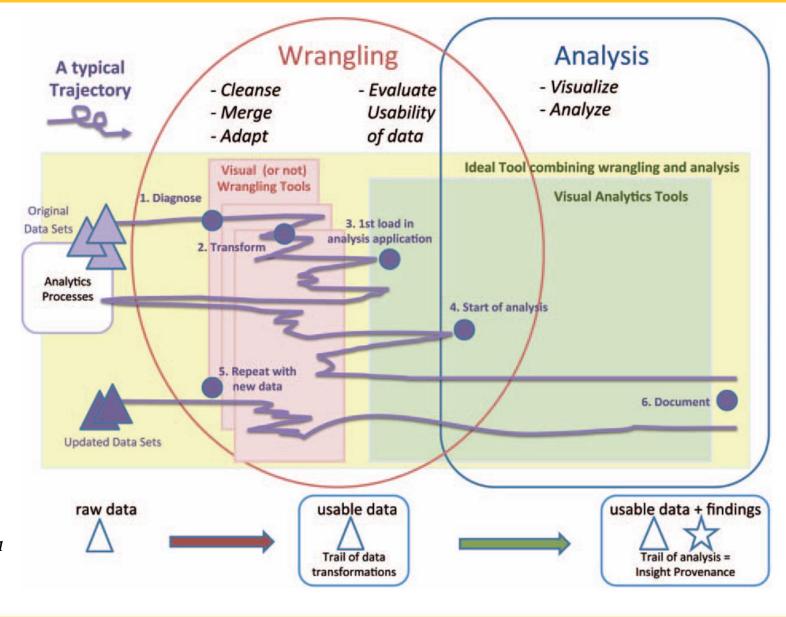
Global Biosphere 2008 Chlorophyll Concentration (mg/m3) 0.01 0.1 Vegetation Index 10 50 0.4 0.6 0.8 0.2  $\underline{https://earthobservatory.nasa.gov/world-of\text{-}change/Biosphere}$ 



### Data Wrangling

A "linear" process?

Kandel, S., et al (2011), Research directions in data wrangling: Visualizations and transformations for usable and credible data, Inf. Vis., 10(4), 271–288.







### Common Data Visualizations

91%

Simple text

	А	В	С
Category 1	15%	22%	42%
Category 2	40%	36%	20%
Category 3	35%	17%	34%
Category 4	30%	29%	26%
Category 5	55%	30%	58%
Category 6	11%	25%	49%

Table

	А	В	С
Category 1	15%	22%	
Category 2			20%
Category 3		17%	
Category 4			
Category 5			58%
Category 6	11%	25%	

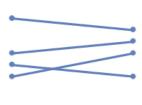
Heatmap



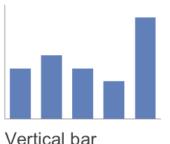
Scatterplot



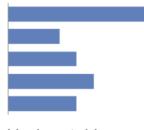
Line



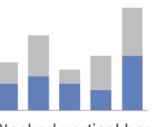
Slopegraph







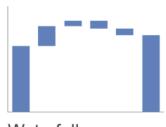
Horizontal bar



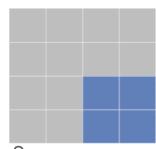
Stacked vertical bar



Stacked horizontal bar



Waterfall



Square area

http://www.storytellingwithdata.com/books

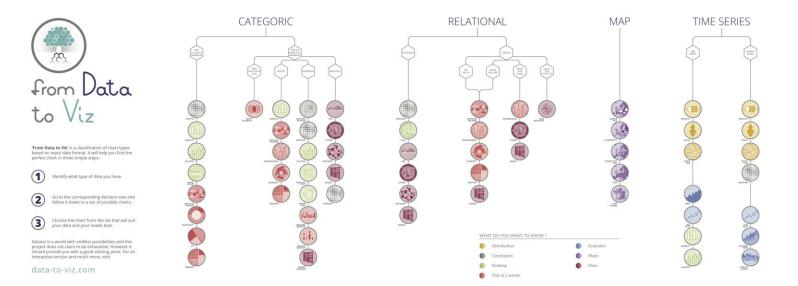
### Data Visualization Taxonomy

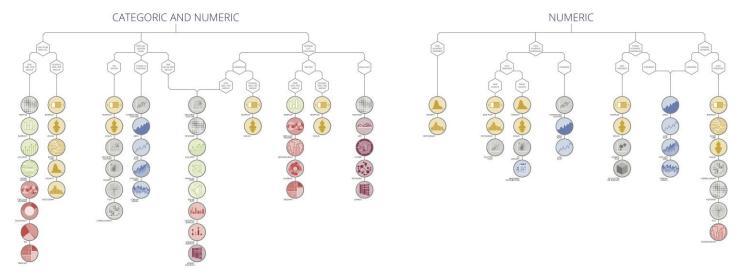
Data to Viz Poster

https://www.data-to-viz.com

**Python Gallery** 

https://python-graph-gallery.com







### Visual Encodings



https://blog.qlik.com/visual-encoding



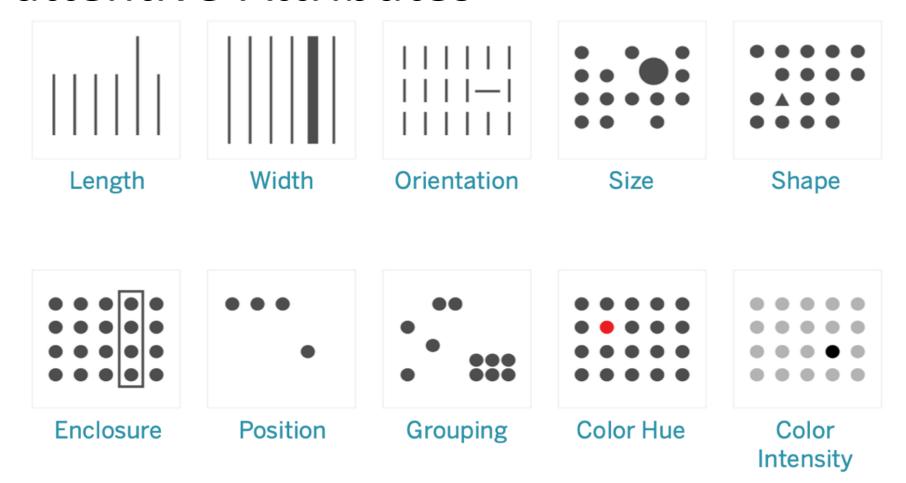
# Visual Encoding & Cognitive Research

Example	Encoding	Ordered	Useful values	Quantitative	Ordinal	Categorical	Relational
<ul><li></li></ul>	position, placement	yes	infinite	Good	Good	Good	Good
1, 2, 3; A, B, C	text labels	optional alpha or num	infinite	Good	Good	Good	Good
	length	yes	many	Good	Good		
. •	size, area	yes	many	Good	Good		
/_	angle	yes	medium	Good	Good		
	pattern density	yes	few	Good	Good		
===	weight, boldness	yes	few		Good		
	saturation, brightness	yes	few		Good		
	color	no	few (<20)			Good	
	shape, icon	no	medium			Good	
	pattern texture	no	medium			Good	
	enclosure, connection	no	infinite			Good	Good
====	line pattern	no	few				Good
	line endings	no	few				Good
	line weight	yes	few		Good		

https://www.oreilly.com/library/view/designing-data-visualizations/9781449314774/ch04.html



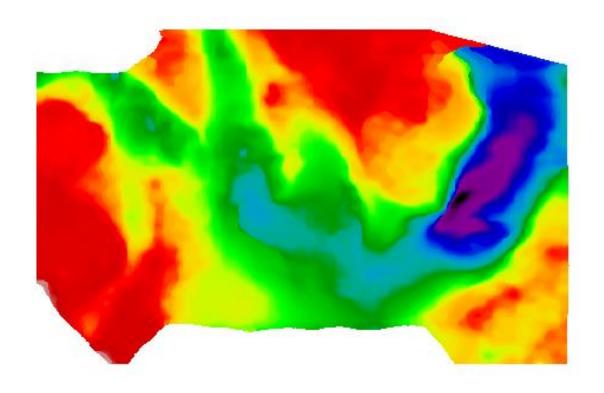
#### Pre-attentive Attributes

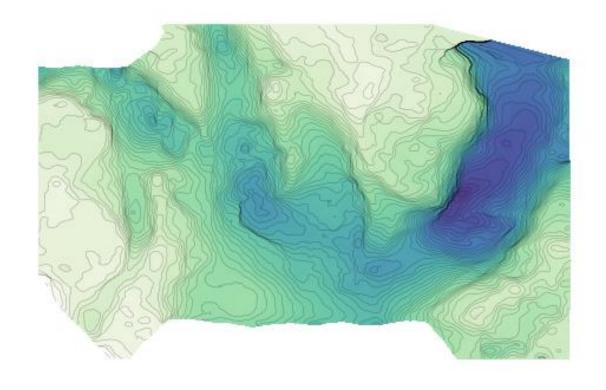


https://help.tableau.com/current/blueprint/en-us/bp\_why\_visual\_analytics.htm



### Choose Appropriate Colors & Colormaps





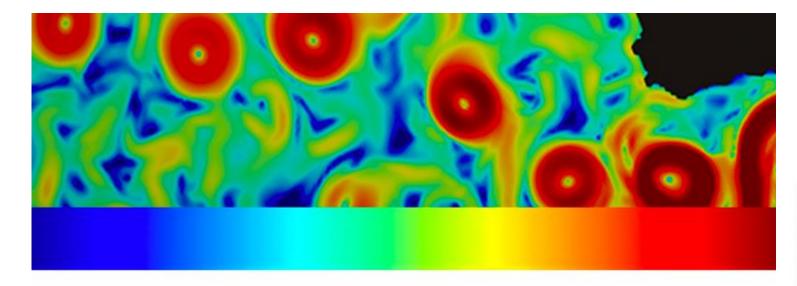
https://agilescientific.com/blog/2017/12/14/no-more-rainbows





## New Research: Color Scaling

- Feature identification
  - Pinpointing outliers
  - Determining relationships
- Exploration
- Communication





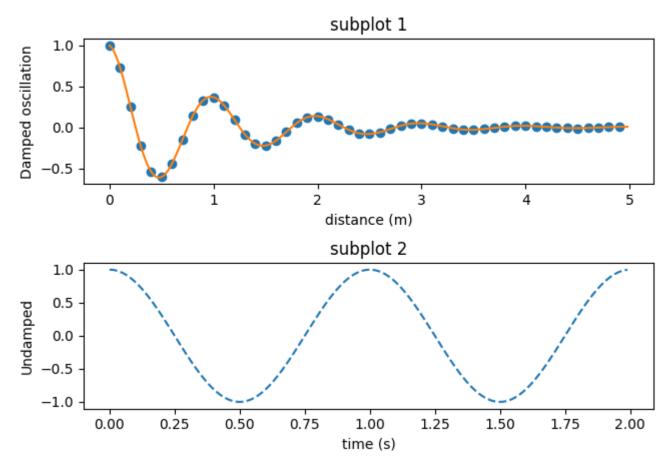
https://eos.org/features/visualizing-science-how-color-determines-what-we-see



### **Key Chart Elements**

- Chart Title(s)
- X & Y Labels
- X & Y Tickmarks
  - Often automatic
- Grid lines
- Line/Marker color
- Line/Marker style, width
- Legend
- Subplots

#### This is a somewhat long figure title



https://matplotlib.org/gallery/subplots\_axes\_and\_figures/figure\_title.html#sphx-glr-gallery-subplots-axes-and-figures-figure-title-py



### Mini-Project Expectations

- Work in your group of 3
- Choose one or more NDBC stations
  - You can try either "stmet" or "ocean" station types
- Find some events (e.g. storm), processes (e.g. daily, seasonal, long-term) or other comparisons (e.g. geographic) that interest you
- Create figures to tell a story of what you found
  - If helpful, search the web or literature for more background
- Explain your analysis and conclusions
- Create a ~10 min presentation where each of you can contribute





### Mid-workshop Group Report

Here are a few topics your group should think about for our report out on Monday to the full team. Feel free to use this slide as a template.

- Group members (name?)
- What is your question? Is it testable or more descriptive?
- What dataset(s) will you use?
- What analysis will you do?
- What is your expectation of what you hope to find after analyzing the data?
- Other things to discuss, but not needed for the report:
  - What are the tasks for each group member?
  - What challenges do you have you may need help with?

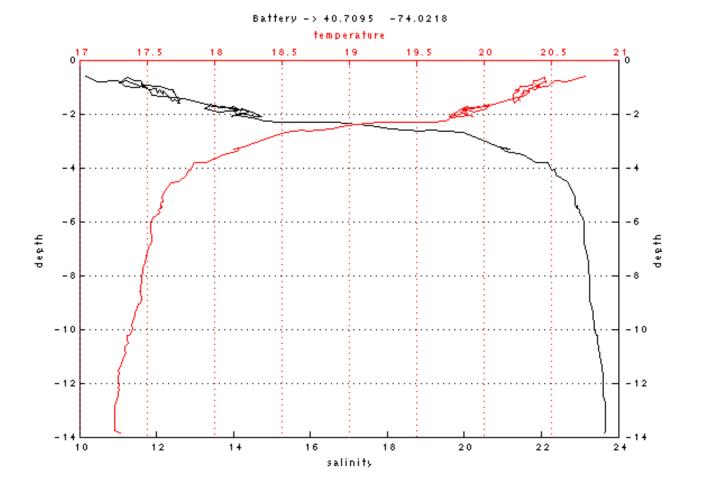






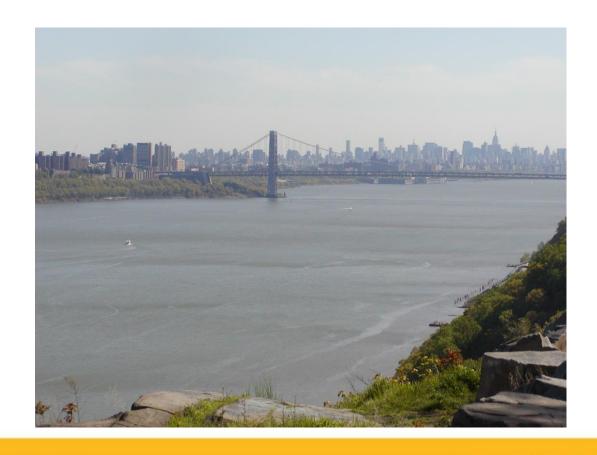
### Conductivity Temperature Depth (CTD) Profiles







### **NY Harbor Estuary**





### CDOM is conservative which allows for water mass discrimination

