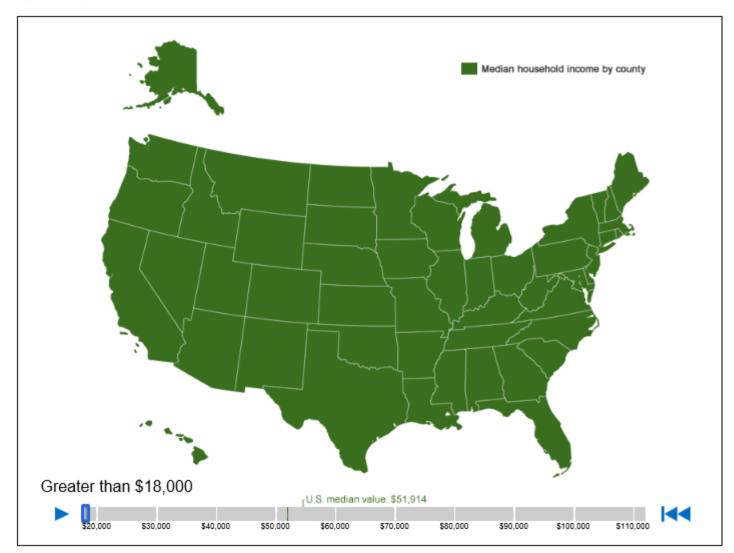
## Who is data visualization for?

## **Data Visualization: Perils and Promises** A suggestions for the use of Data Viz in education

Eric Newburger U S Census Bureau



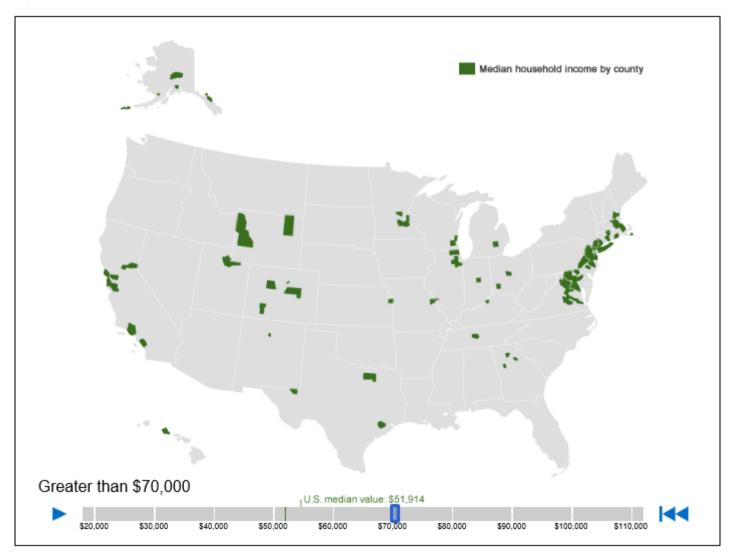
## Islands of High Income September 20, 2012





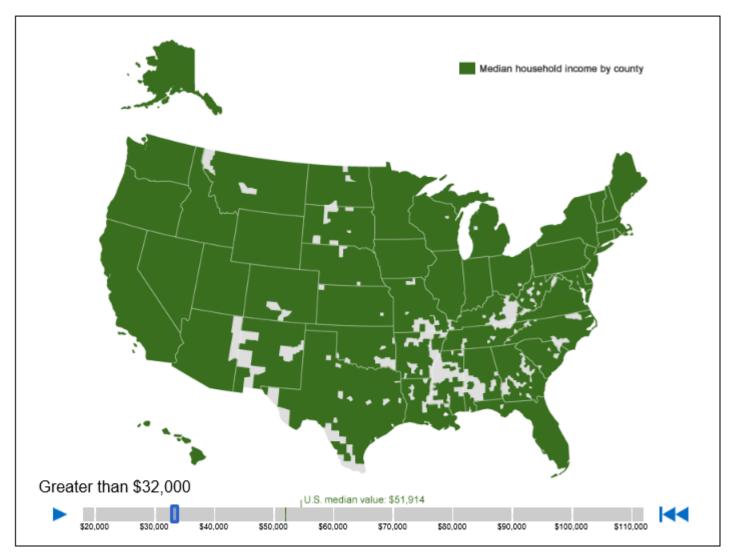
#### Islands of High Income

September 20, 2012





### Islands of High Income September 20, 2012





# The Census Bureau's **Data Visualization Mission:**

## To **increase the ratio of graphics to text** in Census Bureau publications, both online and in print;

# To **open our datasets and analyses** to a broader public.





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MAIN SEARCH WHAT Your Selections "Your Selections' is empty	Your source for population, housing, economic, and geographic information
Search using the options below:	
Topics (age, income, year, dataset,)	Quick Start
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Race and Ethnic Groups (race, ancestry, tribe)	for GO
Industry Codes (NAICS industry,)	Or use the options on the left to begin your search



## STATISTICAL ATLAS

OF THE

### ANTIRD BUVIER

BASED ON THE RESULTS OF THE

### NINTH CENSUS 1870

WITH CONTRIBUTIONS FROM MANY EMINENT MEN OF SCIENCE AND SEVERAL DEPARTMENTS OF THE GOVERNMENT.

COMPILED UNDER AUTHORITY OF CONGRESS

BY

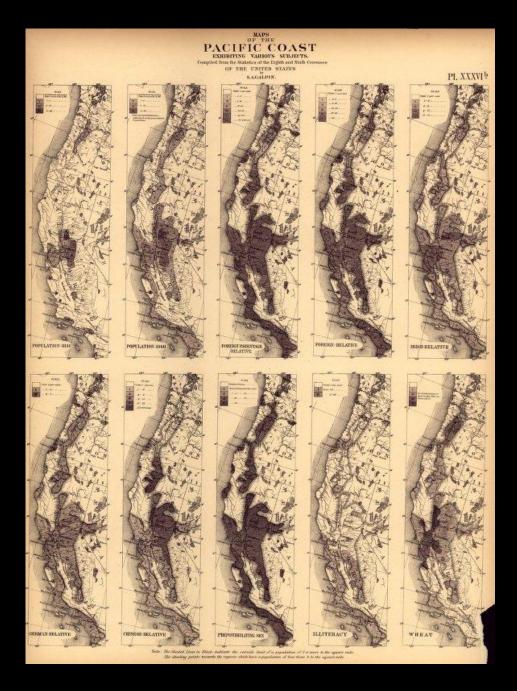
#### FRANCIS A. WALKER, M.A.

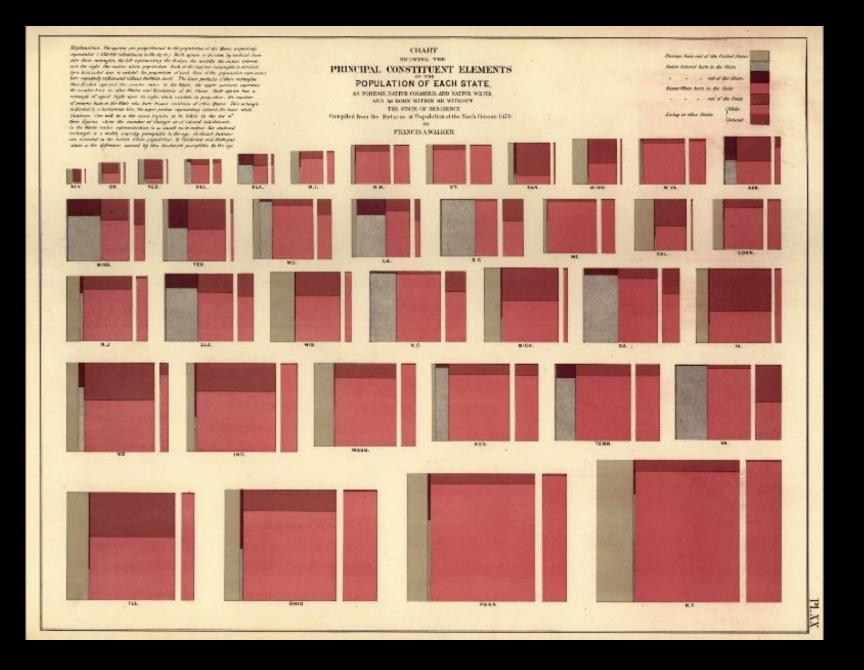
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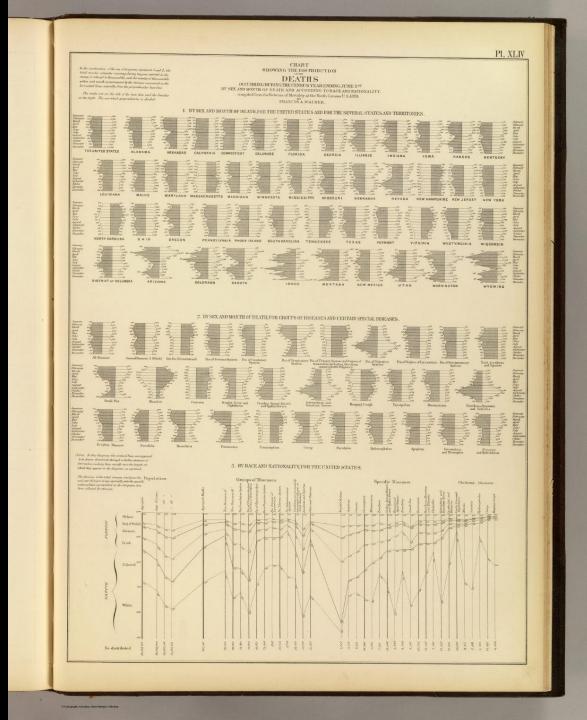
PROFESSOR OF POLITICAL ECONOMY AND HISTORY, SHEFFIELD SCIENTIFIC SCHOOL OF YALE COLLEGE.

JULIUS BIEN, LITH.

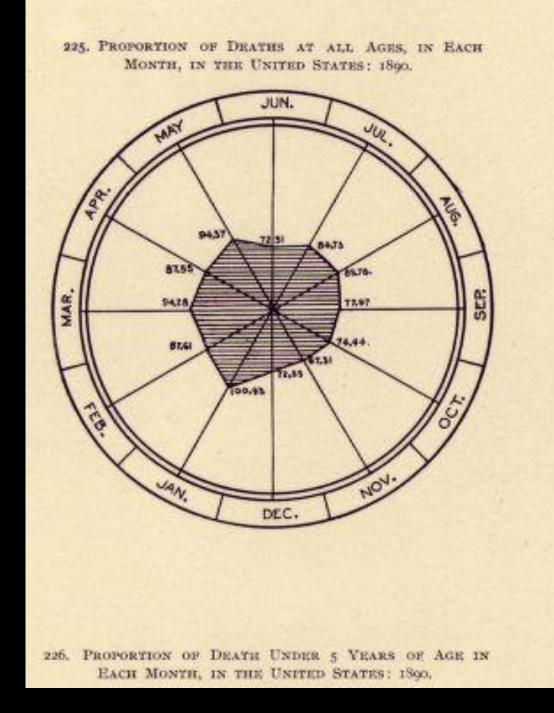
1874.

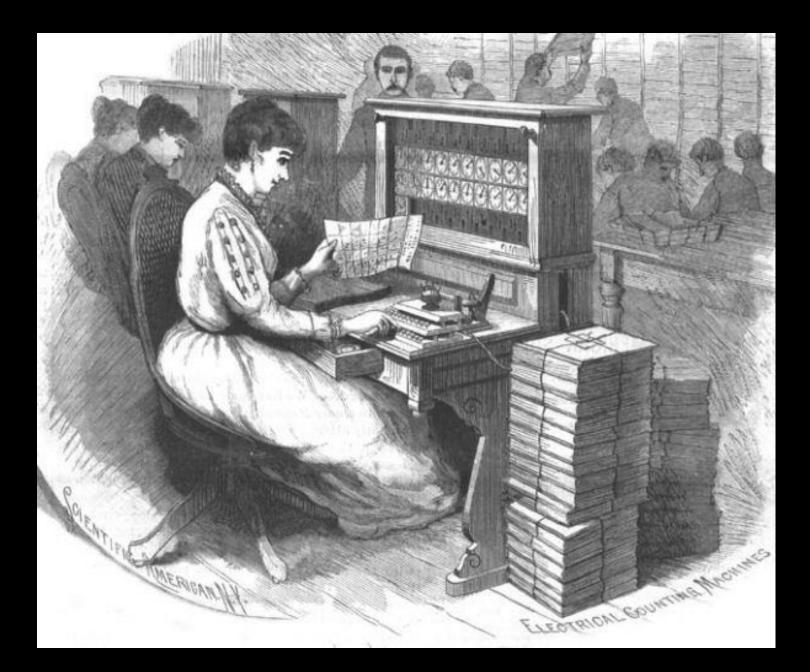






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#### Table 743. Establishments, Employees, and Payroll by Employment-Size Class and Industry: 2000 to 2006

[Establishments and employees in thousands (7,070.0 represents 7,070,000); payroll in billions of dollars. See headnote, Table 742. Data for 2000 based on the North American Industry Classification System (NAICS), 1997; 2005 and 2006 data based on NAICS 2002. See text, this section]

				2006					
Industry	NAICS code	<b>2000</b> , total	<b>2005</b> , total	Total	Under 20 employ- ees	20 to 99 employ- ees	100 to 499 employ- ees	500 to 999 employ- ees	1,000 or more employ- ees
Establishments, total <sup>1</sup>	(X)	7,070.0	7,499.7		6,533.4	885.8	162.8	12.1	7.1
Forestry, fishing & hunting, & ag support services. Mining Utilities Construction Manufacturing Wholesale trade Retail trade Transportation and warehousing Information Finance and insurance Real estate and rental and leasing Professional, scientific, and technical	113–115 21 22 23 31–33 42 44–45 48–49 51 52 53	26.1 23.7 17.3 709.6 354.5 446.2 1,113.6 190.0 133.6 423.7 300.2	24.1 24.7 17.3 333.5 429.8 1,123.2 211.2 141.3 476.8 370.7	23.6 26.2 17.2 802.3 331.1 430.0 1,120.3 215.1 141.9 494.3 382.1	22.1 21.1 12.1 729.2 226.2 366.4 960.6 179.2 114.9 446.4 365.4	1.3 4.2 3.8 64.1 75.6 55.1 132.1 28.6 20.9 39.5 14.8	0.2 0.8 1.1 25.8 7.9 27.0 6.3 5.3 6.9 1.8	(Z) 0.1 0.5 2.4 0.6 0.6 0.6 1.0 0.1	(Z) (Z) 0.2 1.1 0.2 (Z) 0.3 0.3 0.5 (Z)
services	54	722.7	826.1	846.5	780.5	55.8	9.1	0.7	0.4
Management of companies and enterprises	55	47.4	47.6	48.3	31.9	11.0	4.3	0.6	0.4
Admin'support waste mgt/remediation services. Educational services. Health care and social assistance Arts, entertainment, and recreation Accommodation and food services. Other services <sup>2</sup> Unclassified establishments	56 61 62 71 72 81 99	351.5 68.0 658.6 103.8 542.4 723.3 99.0	369.5 80.5 746.6 121.8 603.4 740.0 24.0	378.3 82.6 762.5 123.0 612.3 736.4 27.0	314.7 62.9 646.1 103.5 436.6 686.7 26.9	45.5 15.8 91.4 16.4 164.2 45.7 0.1	15.9 3.2 21.3 2.8 10.8 3.9	1.4 0.4 1.7 0.2 0.4 0.2	0.9 0.4 1.9 0.1 0.2 0.1
Employees, total <sup>1</sup> Forestry, fishing & hunting, & ag support	(X)	114,065	116,317	119,917	29,429	35,504	30,616	8,248	16,120
Mining Utilities Construction Manufacturing Wholesale trade Transportation and warehousing Information Finance and insurance Real estate and rental and leasing. Professional, scientific, and technical	113–115 21 22 23 31–33 42 44–45 44–45 48–49 51 52 53	184 456 655 6,573 16,474 6,112 14,841 3,790 3,546 5,963 1,942	169 497 633 6,781 13,667 5,969 15,339 4,168 3,403 6,432 2,144	166 554 614 7,339 13,632 6,031 15,768 4,306 3,396 6,647 2,217	(NA) 100 65 2,749 1,313 1,764 5,144 732 514 1,957 1,195	(NA) 168 2,487 3,324 2,156 5,319 1,187 886 1,524 559	28 161 225 1,532 5,149 1,467 4,846 1,206 1,206 1,044 1,391 324	(NA) 57 298 1,629 329 419 405 666 82	(NA) 69 72 273 2,216 315 90 762 547 1,109 57
services	54	6,816	7,689	8,054	2,667	2,171	1,739	476	1,003
Management of companies and enterprises.	55	2,874	2,856	2,916	174	495	922	446	879
Admin'support waste mgt/remediation services. Educational services Health care and social assistance Arts, entertainment, and recreation Accommodation and food services. Other services <sup>2</sup> . Unclassified establishments	56 61 62 71 72 81 99	9,138 2,532 14,109 1,741 9,881 5,293 144	9,280 2,879 16,025 1,936 11,026 5,391 31	10,004 2,980 16,451 1,974 11,381 5,459 30	1,233 304 3,402 2,702 2,916 (NA)	1,999 667 3,670 686 6,323 1,665 (NA)	3,161 611 3,954 525 1,673 657	981 279 1,222 141 (NA) (NA)	2,629 1,118 4,204 228 (NA) (NA)
Appual payroll total 1	(X)	3,879	4,483	4,792	1,021	1,260	1,264	401	848
Porestry, fishing & hunting, & ag support services. Mining Utilities Construction Manufacturing Wholesale trade Retail trade Transportation and warehousing Information Finance and insurance Real estate and rental and leasing. Professional, scientific, and technical	113–115 21 22 23 31–33 42 44–45 48–49 51 52 53	5 22 41 240 644 270 303 126 209 347 59	5 31 46 293 601 309 348 154 203 447 82	5 37 48 322 620 323 368 166 213 481 88	(D) 6 4 103 48 85 113 27 28 102 42	(D) 10 11 114 133 110 127 44 50 112 24	1 12 18 77 224 80 115 46 68 115 15	(D) 4 8 14 79 23 9 16 26 49 4	(D) 5 7 14 136 25 3 3 3 40 104 3
services Management of companies and	54	362	456	497	136	140	123	34	64
enterprises. Admirsupport waste mgt/remediation services. Educational services. Health care and social assistance . Arts, entertainment, and recreation Accommodation and food services. Other services <sup>2</sup> Unclassified establishments. – Represents zero. D Data withhe	55 56 61 62 71 72 81 99	211 210 62 431 43 126 110 4	243 255 83 590 53 156 127 1	266 283 88 627 57 167 134 1 4 Not ava	17 43 7 138 14 39 66 (D)	42 62 17 125 14 81 (D) X Not ap	83 80 19 119 28 20 -	41 24 7 49 5 (D) (D) (D)	83 74 39 195 6 (D) (D) (D) (D)

— Represents zero. D Data withheld to avoid disclosure. NA Not available. X Not applicable. Z Less than 50 establishments. <sup>1</sup> Totals for 2000 include auxiliaries, Beginning 2005, cases previously classified under NAICS code 95 (auxiliaries) are coded in the operating NAICS sector of the establishment. <sup>2</sup> Except public administration.

Source: U.S. Census Bureau, "County Business Patterns"; <a href="http://www.census.gov/econ/cbp/s.">http://www.census.gov/econ/cbp/s.</a>

## FactFinder



H WH/

WHAT WE PROVIDE

USING FACTFINDER

#### **Your Selections**

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#### Search using the options below:



## Your source for population, housing, economic, and geographic information

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Enter search term(s) a	nd click 'GO'
topic or table name	for GO
⊙ topics O race/ances	stry O industries
Or use the options on t	the left to begin your search

POPULATION CHANGE

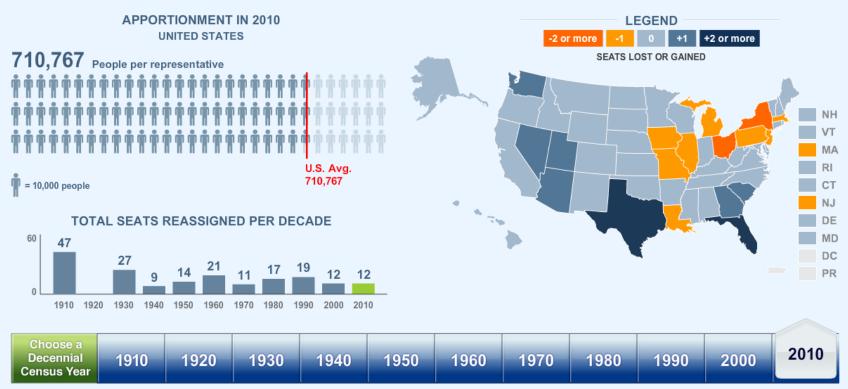
POPULATION DENSITY

APPORTIONMENT



#### **Population Apportionment**

Apportionment is the process of dividing the 435 memberships, or seats, in the House of Representatives among the 50 states based on the population figures collected during the decennial census.



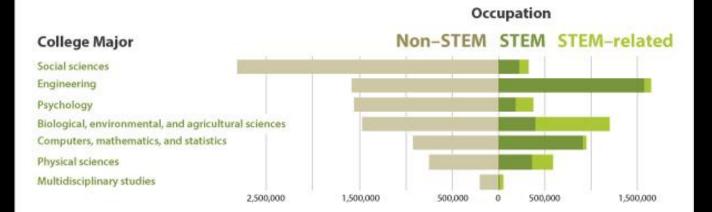
See footnotes below

## STEM So So Im

Science, Technology, Engineering, and Mathematics (STEM)

#### Degree vs. Employment:

Some science and engineering graduates go into STEM fields, many don't



Source: U.S. Census Bureau, 2011 American Community Survey



U.S. Department of Commerce Economics and Statistics Administration U.S. CENSUS BUREAU



#### HOW DO WE KNOW?

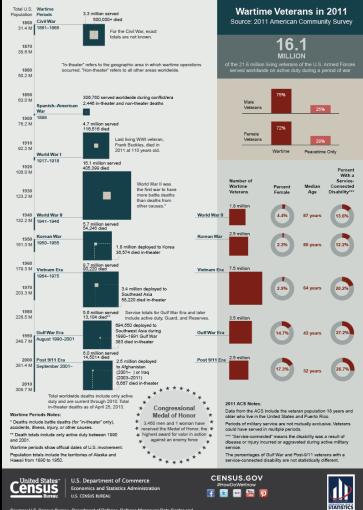
#### MEMORIAL DAY

Honoring America's Wartime Veterans

Memorial Day, originally called Decoration Day, is a day of remembrance for those who died in service to their country. The holday was officially proclaimed in 1868 to honor Union and Confederate soldiers and was expanded after World War I to honor those who died in all wars. Today, Memoral Day honors over one million men and women who have died in military service since Ho civil War.

This infographic compiles statistics from the U.S. Census Bureau and Department of Defense to honor our men and

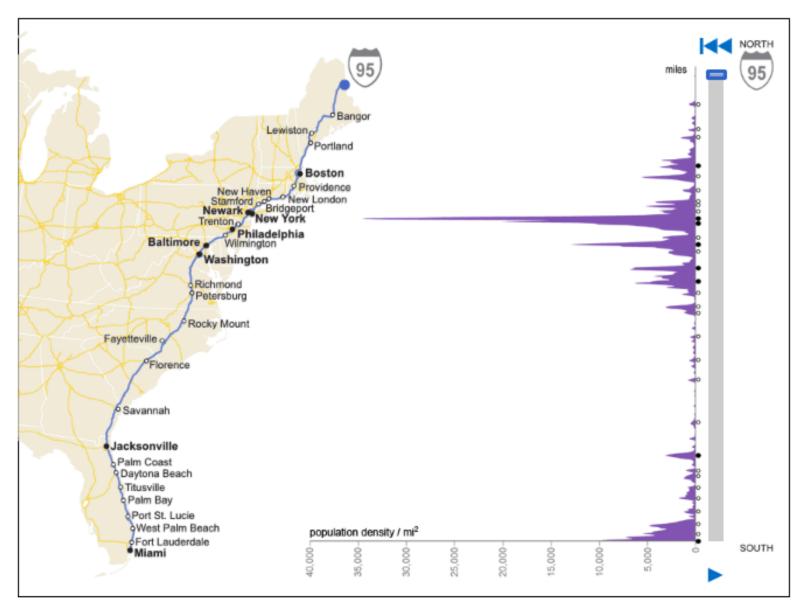
women who have served in the U.S. Armed Forces. The U.S. Census Bureau gathers detailed information on living veterans from the American Community Survey (ACS). Federal, state, and community leaders, private businesses, nonprofits, and community organizations use ACS statistics to determine the programs, services, and infrastructure that serve the needs of our veterans. The Department of Defense, Defense Manpower Data Center provides statistics on the number of people who served and ded in each of our nation's wars.



Sources: U.S. Census Bureau, Department of Defense, Defense Manpower Data Center and Defense Casuality Analysis System; Department of Veterans Affairs, Office of Public Affairs. For more information, visit www.census.gov/how/infographics/sources.html.

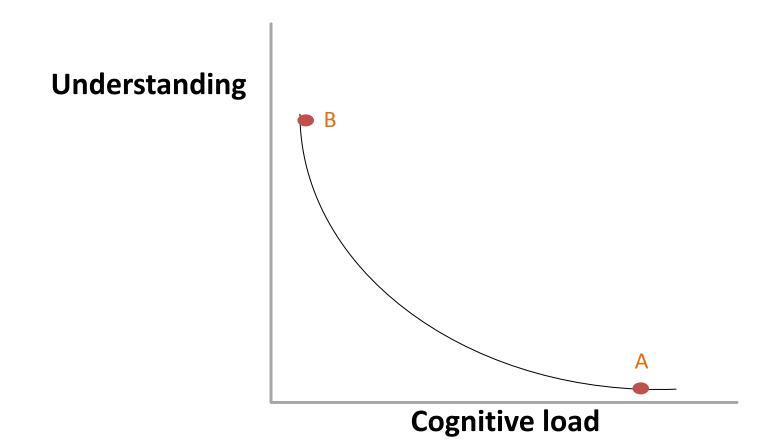
#### I-95 Population Density Profile, 2010

July 26, 2012





### Newburger's hypothesis of Data Visualization





U.S. Department of Commerce Economics and Statistics Administration U.S. CENSUS BUREAU

Light Pre-attentive understanding Natural visual metaphors lcons Single words or numbers Words or numbers in ordered groups Sentences Paragraphs Jargon **Equations** Clutter **Broken expectations** Stuff that outright fools your eyes Heavy

Cognitive loading Scale

U.S. Department of Commerce Economics and Statistics Administration U.S. CENSUS BUREAU





#### Description: Tags: hurricanes



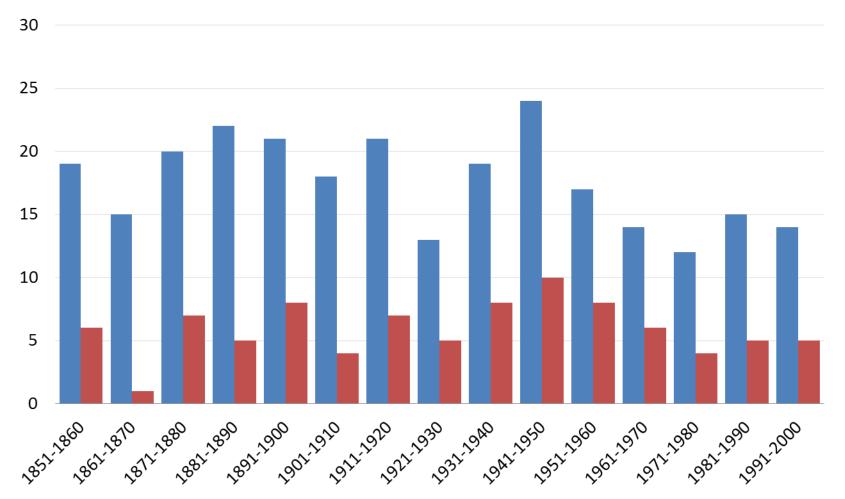
Data file: U.S. Hurricanes from 1851-2010

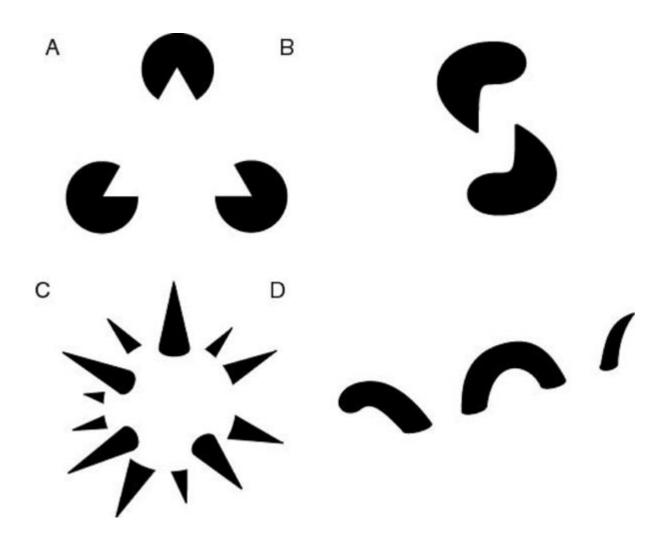
Data source: HURDAT data via Skillshare course Information Design

¥

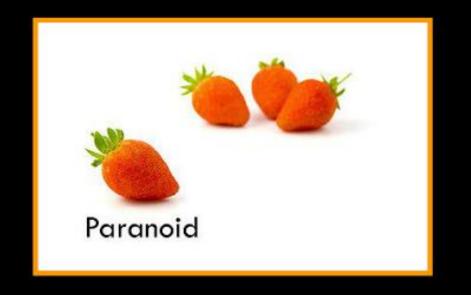
### Hurricane Strikes per Decade, 1851 to 2000

All 1,2,3,4,5 Major 3,4,5





## Just because you're paranoid doesn't mean they aren't after you.

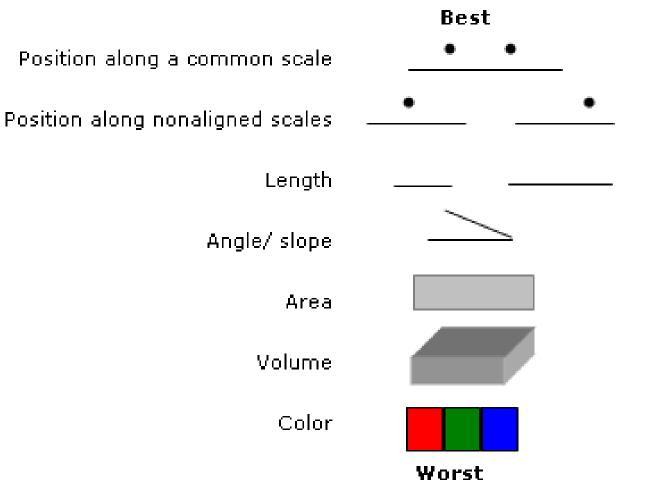


#### www.all-about-psychology.com



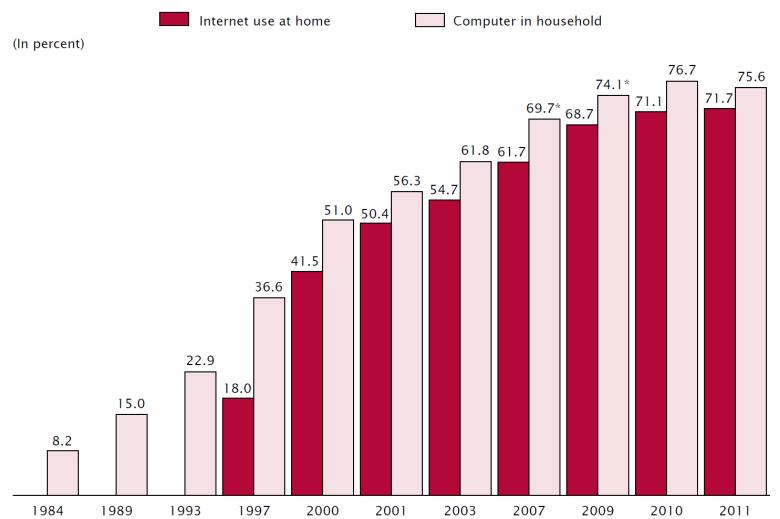


#### Cleveland's (1984) Graphical Feature Interpretation Hierarchy



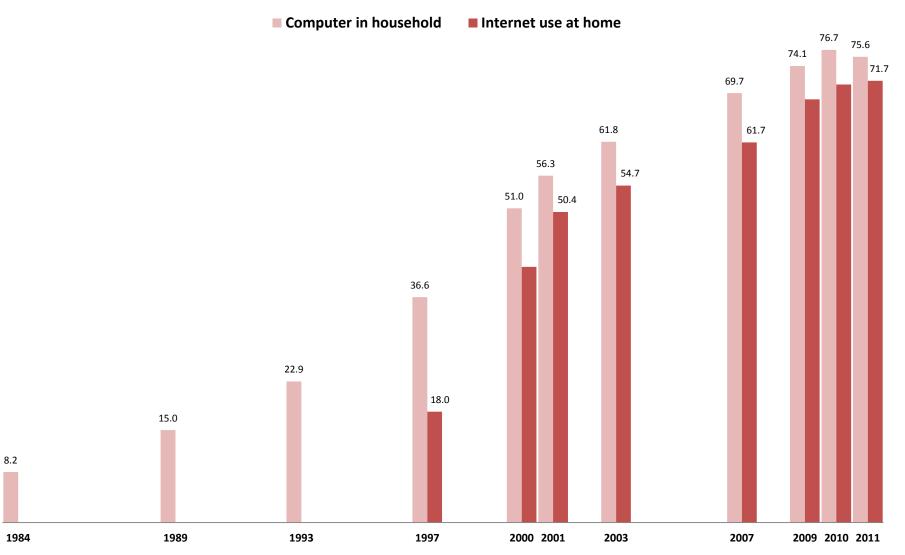
Based on graphic (Figure 2) in Presentation Graphics (white paper) by Leland Wilkinson, SPSS, Inc and Northwestern Uiv.

#### Figure 1. Household Computer and Internet Use: 1984-2011



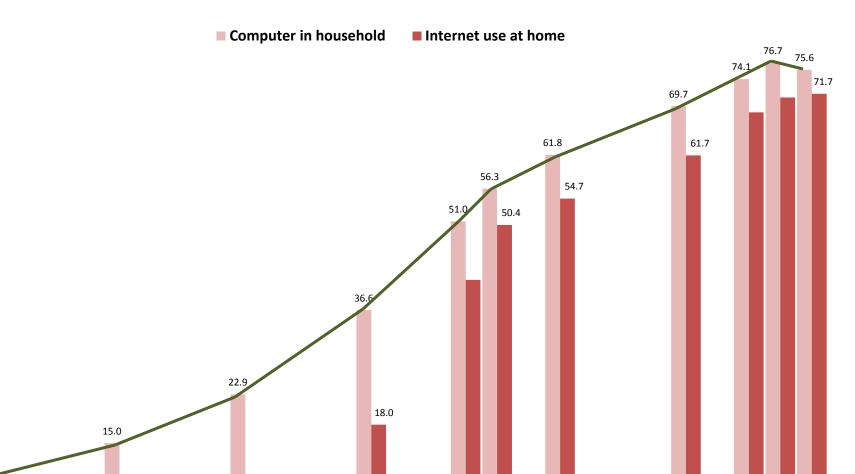
\*Note: In 2007 and 2009 the Census Bureau did not ask about computer ownership. The estimates presented here for 2007 and 2009 reflect estimates made based on the ratio of computer ownership to Internet use in 2003 and 2010, respectively. Source: U.S. Census Bureau, Current Population Survey, selected years.

#### Figure 1: Household Computer and Internet Use: 1984-2011



Source: U.S. Census Bureau, Current Population Survey

#### Figure 1: Household Computer and Internet Use: 1984-2011



1997

2000 2001

2003

2007

2009 2010 2011

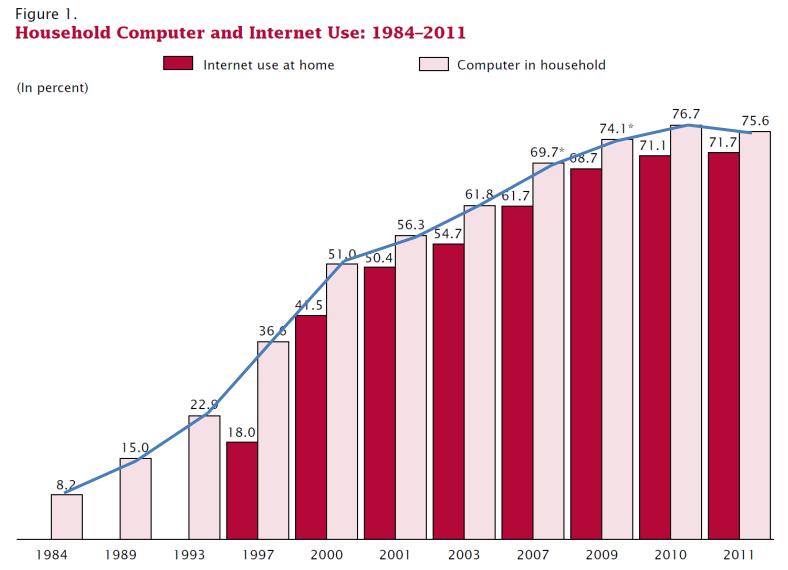
Source: U.S. Census Bureau, Current Population Survey

1989

1993

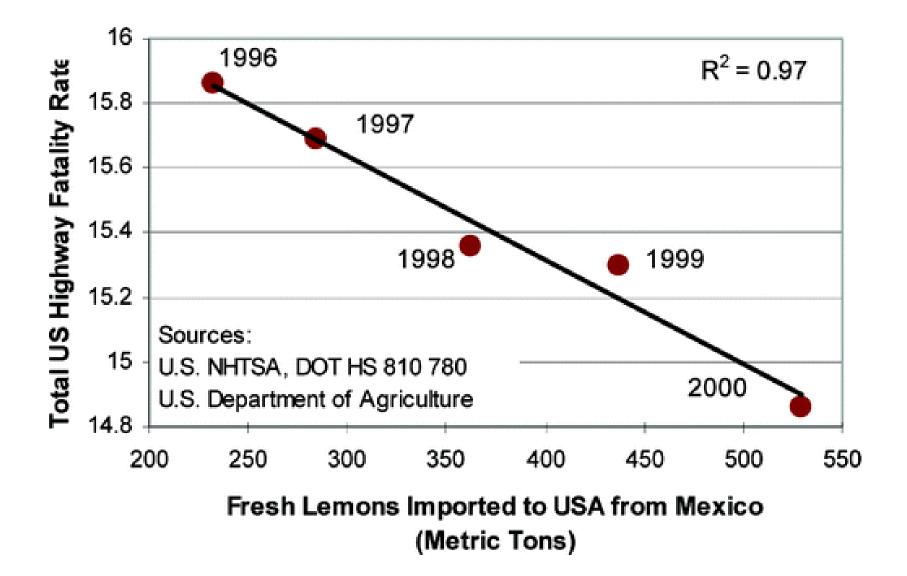
8.2

1984



\*Note: In 2007 and 2009 the Census Bureau did not ask about computer ownership. The estimates presented here for 2007 and 2009 reflect estimates made based on the ratio of computer ownership to Internet use in 2003 and 2010, respectively. Source: U.S. Census Bureau, Current Population Survey, selected years.

#### **Mexican Lemons Save American Lives**



# Who is data visualization for in education?

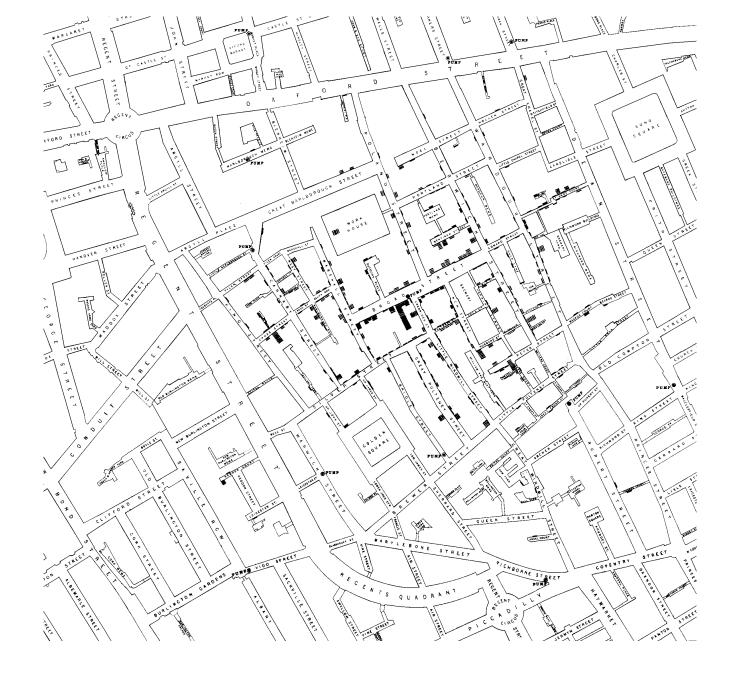




How big is it?

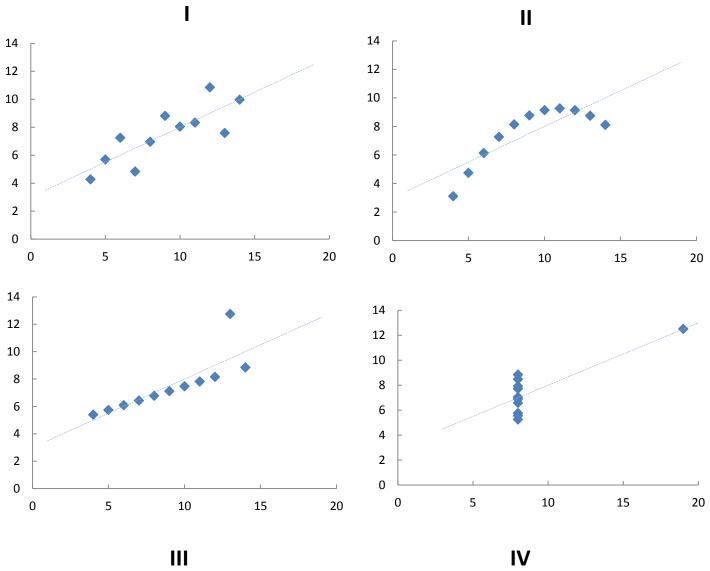
What difference does it make?

Are you sure that's not just dumb luck?

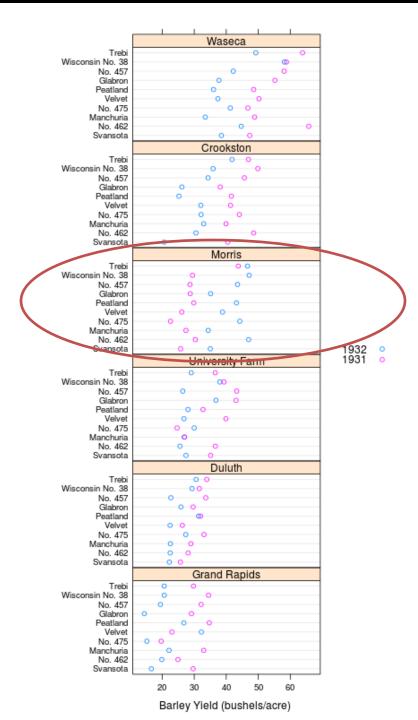


	Anscompe's quartet							
		I		II				IV
	X	У	X	У	X	у	x	У
	10	8.04	10	9.14	10	7.46	8	6.58
	8	6.95	8	8.14	8	6.77	8	5.76
	13	7.58	13	8.74	13	12.7	8	7.71
	9	8.81	9	8.77	9	7.11	8	8.84
	11	8.33	11	9.26	11	7.81	8	8.47
	14	9.96	14	8.1	14	8.84	8	7.04
	6	7.24	6	6.13	6	6.08	8	5.25
	4	4.26	4	3.1	4	5.39	19	12.5
	12	10.8	12	9.13	12	8.15	8	5.56
	7	4.82	7	7.26	7	6.42	8	7.91
	5	5.68	5	4.74	5	5.73	8	6.89
Mean	9,	7.50	9,	7.50	9,	7.50	9,	7.50
Variance	11,	4.1	11,	, 4.1	11,	4.1	11,	4.1
Correlation Linear regression	0.8 Y=0		0.8 9 +	816 	0.8	816	0.	816

Anscombe's quartet



IV





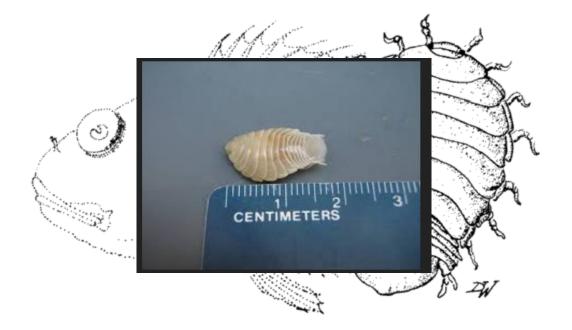
















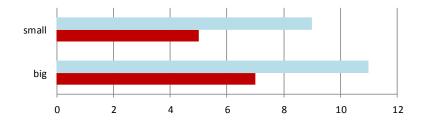
White perch				
	Total	infected	clear	
Total	32	12	20	
big	17	7	11	
small	15	5	9	

Pumpkinseed				
Total	infected	clear		
38	16	22		
18	12	6		
20	4	16		



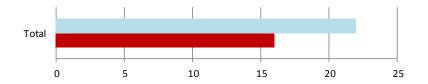
White perch				
	Total	infected	clear	
Total	32	12	20	
big	17	7	11	
small	15	5	9	

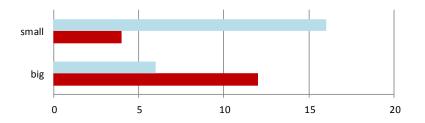


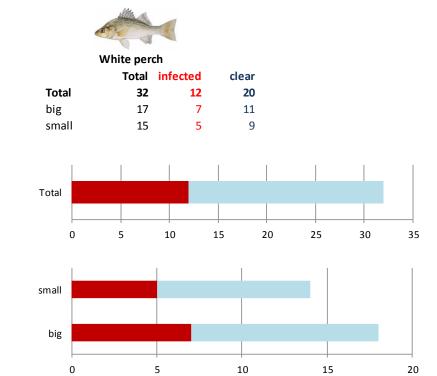




Ритркільееа				
Total	infected	clear		
38	16	22		
18	12	6		
20	4	16		

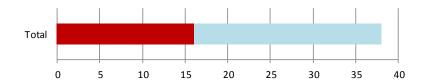


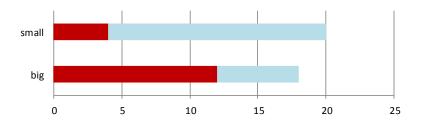


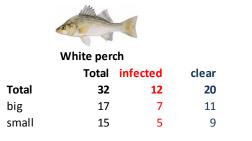


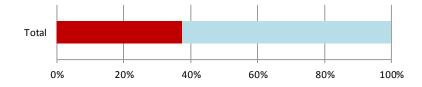


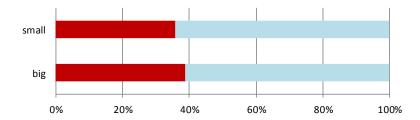
Pullipkiliseeu				
Total	infected	clear		
38	16	22		
18	12	6		
20	4	16		





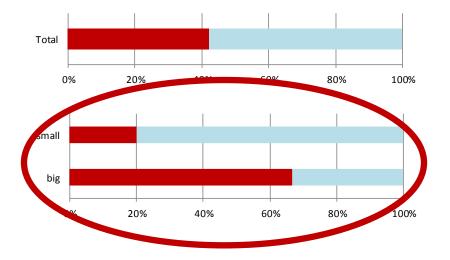








Total	infected	clear	
38	16	22	
18	12	6	
20	4	16	











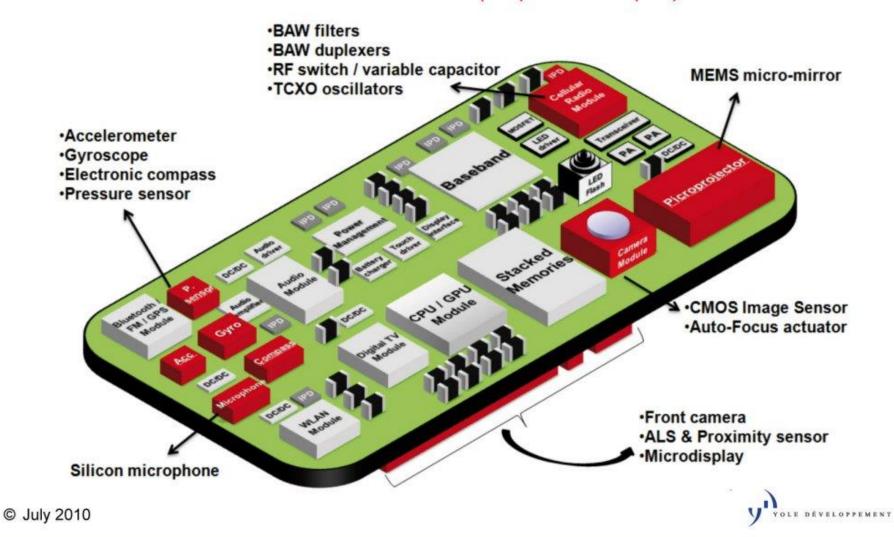


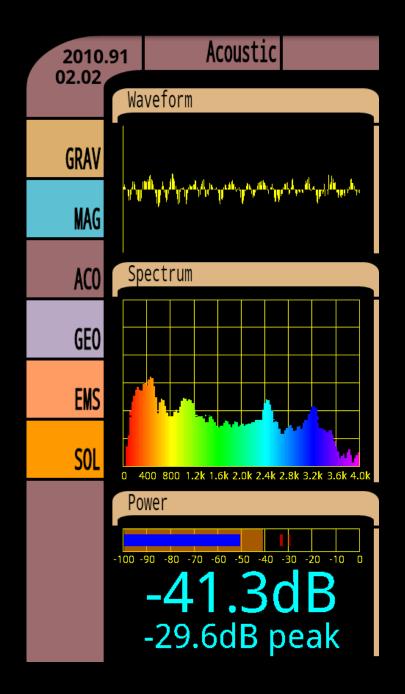


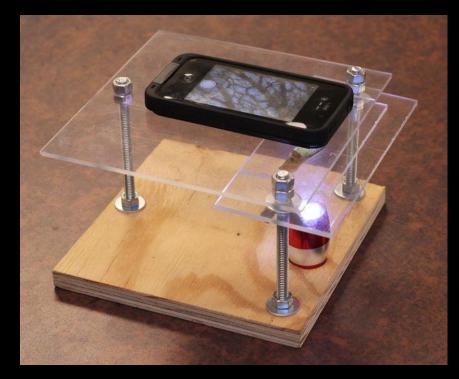
## MEMS & Sensors

#### Simplified view of a smart-phone board

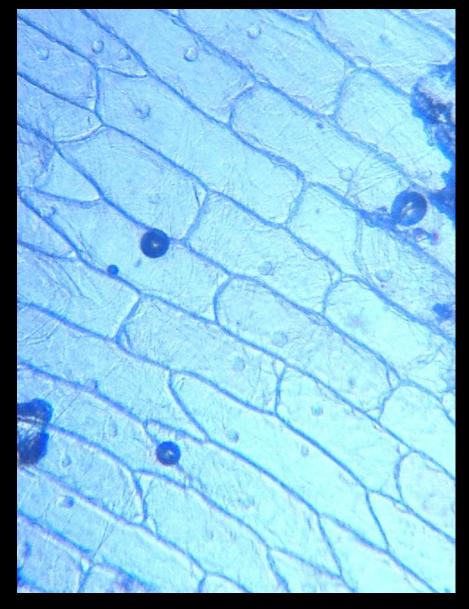
MEMS & Sensors in red (scope of this report)





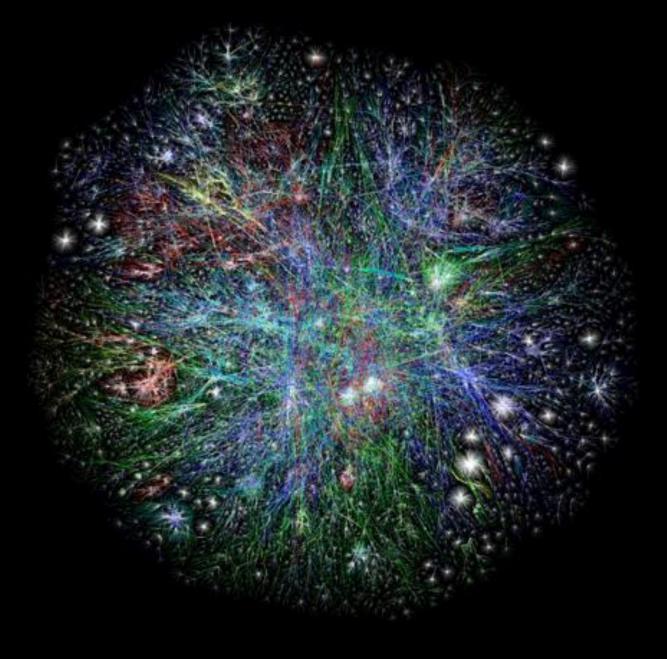












There are somewhere in the order of 4.2 billion unique Internet addresses (IPs), housed on 44 million servers.

--January 2010



Agriculture



Global Development



Business



Climate



Health

Cities

---- :::

Manufacturing



Education



Jobs & Skills



Consumer



Ocean

Counties

Energy

Public Safety





States



Finance

Science &

Research

Ethics

Geospatial



Weather



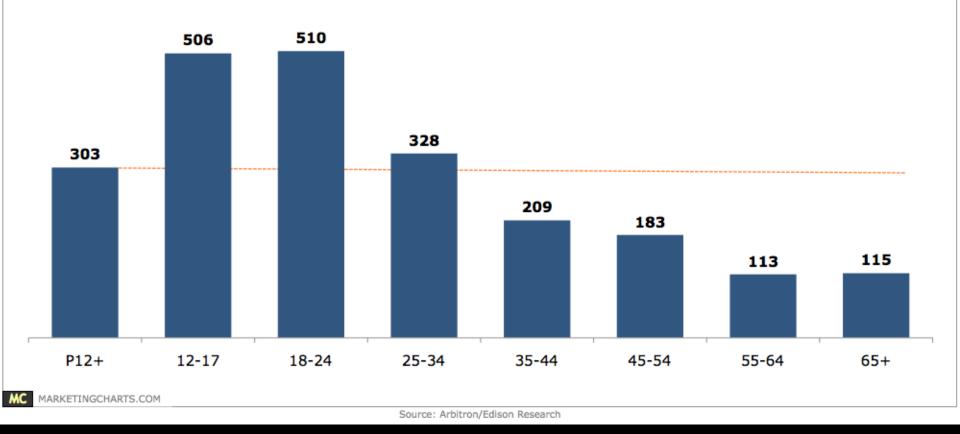
Law

http://www.data.gov/

#### Average Number of Facebook Friends, by Age Group

among Facebook users aged 12+, self-reported

April 2013



The first principle is that you must not fool yourself – and you are the easiest person to fool. -- Richard Feynman

That is, if we investigate further, we find that the statements of science are **not** of what is true and what is not true, but statements of what is known to **different degrees of certainty**:

"It is very much more likely that so and so is true than that it is not true"



# **The Scientific Process**

- Observation
- Hypothesis formation
- Experiment
- Publication of results
- Repetition of experiment by others
- Acceptance of theory

# **The Scientific Process**

"Hey, that's curious."

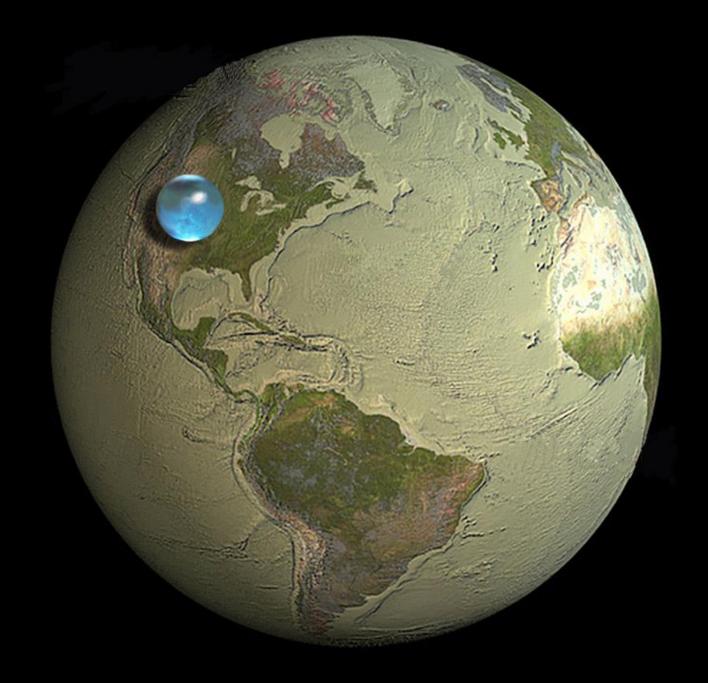
"Maybe XYZ is behind that?"

"If it is XYZ, then when I do ABC this other thing should happen."

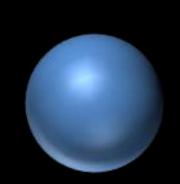
"Cool! Hey guys! Look what I found! Or have I missed something?"

"Nope. It works for us, too."

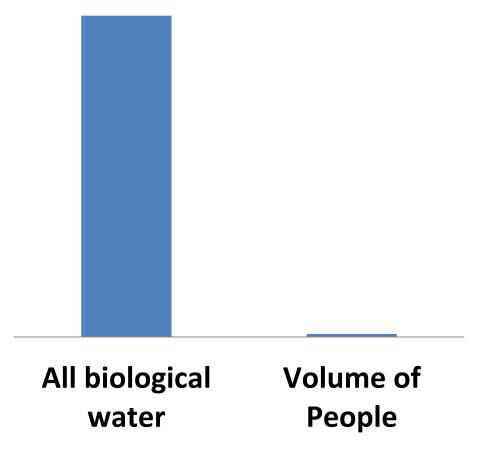
"So, does that mean XYZ is the rule then?"



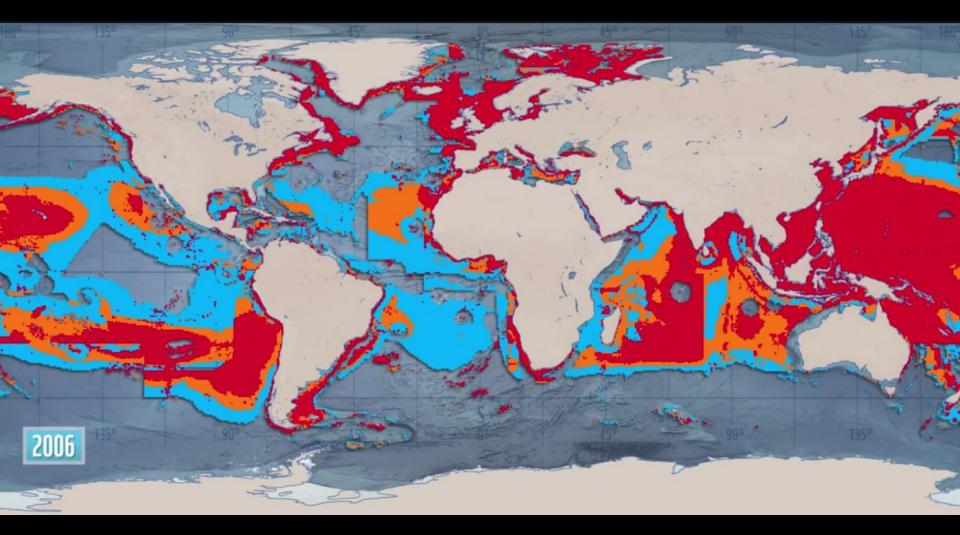




# Water onAll biologicalVolume ofEarthwaterPeople





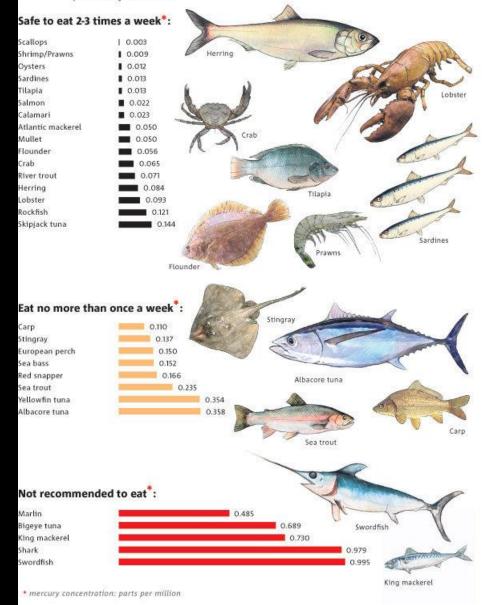


#### Mercury in fish and mollusks



Almost all seafood can accumulate mercury and methylmercury, highly toxic elements that can cause severe damage to the nervous system. The quantity of these substances varies widely depending on the type of animal. For example, long-living fish contain more mercury than mollusks.

It therefore makes sense to choose those seafoods with a minimal concentration of mercury, bearing in mind that children and pregnant or breastfeeding women are particularly vulnerable.



#### **But What Fish Can I Eat?**

Marlin

0.485

Despair not, fish lovers! Plenty of varieties of seafood are safe to eat, and many others can be enjoyed from time to time. For more precise guidance-especially for women who are or may soon become pregnant-consult an online mercury calculator such as the one at gotmercury.org. You might also want to check Croaker the fish advisory for your particular state at epa.gov/ost/fish. The figures below indicate mean mercury levels in parts per million. (white, 23-Pacific) 20-0.287 Low Herring Mackerel Trout 0.084 Salmon (wild) Flounder Halibut Pollock (N. Atlantic, chub) Sardines 0.022 Butterfish 0.071 0.056 0.241 0.050 Clams 0.013 0.058 0.009 017 0) Crab 0.065 Hake Whitefish Mullet 0.079 0.089 0.050 Plaice 0.056 Squid (calamari) **Tilapia** 0.013 Oysters Crawfish Mahimahi 0.190 0.012 0.033 Whiting Jacksmelt 0.081 Anchovies Croaker (Atlantic) 0.017 Catfish 0.065 Mackerel Sole Bass 0.025 (Spanish, Gulf) 0.454 Shad (American) Haddock (Atlantic) 0.056 (striped, sea, saltwater) 0.152 0.055 Moderate 31 Perch (freshwater) 0.150 Grouper 0.448 Lobster Tuna Buffalo fish 0.093 (canned High Perch (ocean) 0.121 Carp 0.110 chunk light) Cod (Alaskan) Tilefish Bluefish < · ) Tuna 0 (canned Very high albacore) 0.350 Sea bass Tuna Sablefish 0 (yellowfin) (Chilean) 0.354

Mackerel

Shark 0.979 Swordfish 0.995

(king)

Tuna

(bigeye, ahi)

0

Orange roughy 0.571 athematics, the research content of PRIM-9 was in the area of computer-human faces, drawing on tools from computer science. When the product of statistical research theorems published in journals, PRIM-9 was a program documented in a movie. *W. Tukey's Work on Interactive Graphics*. The Annals of Statistics, Vol. 30 No. 6. 2002.

### "The greatest value of a picture is when it forces us to notice what we never expected to see."



0

- John Tukey, 1977



John W. Tukey

EXPLORATORY DATA ANALYSIS



