







My Life in Pictures

Tales of a Graphic Developer and Amateur Historian of #datavis

Michael Friendly 🥑 @datavisFriendly || <u>http://datavis.ca</u> 🏟 **York University** Uncharted Software, April 12, 2022



Introducing: me

I wear two hats, both reflected on my license plate:

Statistical graphics developer (categorical & multivariate data analysis)



Yours to discover!



Black

Red

Blond







mosaic plots for frequency tables

HE plots for MANOVA

Discrete Data

Books: Theory \rightarrow Practice

Tukey's maxim (Tukey, 1959):

The practical power of any statistical method = Statistical power × Probability anyone will use it





https://www.datavis.ca/books/vcd/



https://bit.ly/3L7uPOC



Software: Some R packages

vcdExtra

- Categorical data
 - vcd & vcdExtra
- Linear & multivariate models
 - car: extend graphical methods (John Fox)
 - heplots: HE plots & related methods
 - candisc: Analyze/view MLMs in low-D space

Largely data

- Lahman: everything baseball
- HistData: history of statistics & data vis
- TrumpLies: Toronto Star database











Graphical Methods for Complex Problems

- Categorical Data Analysis: Fourfold displays, mosaic plots
- Multivariate Visualization ×

Gender Bias at UC Berkeley?

Science, 1975, 187: 398--403

Sex Bias in Graduate Admissions: Data from Berkeley

Measuring bias is harder than is usually assumed, and the evidence is sometimes contrary to expectation.

P. J. Bickel, E. A. Hammel, J. W. O'Connell

Determining whether discrimination because of sex or ethnic identity is being practiced against persons seeking passage from one social status or locus to another is an important problem in our society today. It is legally impordeceision to admit or to deny admission. The question we wish to pursue is whether the decision to admit or to deny was influenced by the sex of the applicant. We cannot know with any certainty the influences on the evaluators in the

by using a As already pitfalls ah but we ir one of the We mu sumptions of the da approach. given disc plicants dc intelligence ise, or ot mately per students. I that make meaningfu any differ plicants by differences ise as scho ly one co example, b hissed act

2 × 2 Frequency Tables: Fourfold displays

Table: Admissions to Berkeley graduate programs

	Admitted	Rejected	Total	% Admit	Odds(Admit)
Males	1198	1493	2691	44.52	0.802
Females	557	1278	1835	30.35	0.437
Total	1755	2771	4526	38.78	0.633

odds ratio (θ) = 1.84

Males nearly <mark>twice</mark> as likely to be admitted

- Is this a "significant" association?
- Is it evidence for gender bias?
- How to measure strength of association?
- How to visualize?

Fourfold display:

- quarter circles, area ~ frequency
- ratio of areas: odds ratio (θ)
- confidence bands: overlap iff $\theta \approx 1$



$2 \times 2 \times k$ Stratified tables

The data arose from 6 graduate departments

No difference between males & females, except in Dept A where women more likely to be admitted!

Design:

- small multiples
- encode direction by color
- encode signif. by shading



r × c Tables: Mosaic plots

Table: Hair-color eye-color data

Eye	Hair Color							
Color	Black	Brown	Red	Blond	Total			
Brown	68	119	26	7	220			
Blue	20	84	17	94	215			
Hazel	15	54	14	10	93			
Green	5	29	14	16	64			
Total	108	286	71	127	592			

Students in a large statistics class were categorized by hair color and eye color



Are hair color and eye color associated? How to visualize? How to understand the pattern of association?

Mosaic plots

Area proportional display of frequencies in n-way table Shaded according to deviation from independence



Divide unit square ~ V1 marginal frequencies Subdivide each ~ V2|V1 conditional frequencies

Shade ~ residual (d_{ij}) positive: O > E negative: O < E

$$d_{ij} = \frac{(O_{ij} - E_{ij})}{\sqrt{E_{ij}}} \qquad \chi^2 = \sum d_{ij}^2$$

Mosaic plots & other methods



Opposite corner pattern of shading:

- dark hair associated with dark eyes
- (red hair, hazel eyes) unusual

Correspondence analysis:

- like PCA for frequency data.
- The association is 90% 1-D



Mosaic matrices

Scatterplot matrix analog for categorical data

All pairwise views

The answer: Simpson's Paradox

- Depts A, B were easiest
- Applicants to A, B mostly male
- ∴ Males more likely to be admitted overall

Race & Crime

Toronto Star investigation of racial disparities in treatment by Toronto Police Services

FOI request $\rightarrow \frac{1}{2}$ M arrests, 1997 - 2002

Evidence for racial profiling?

Only look at discretionary charges:

Simple marijuana possession Non-moving auto infractions

THE SATURDAY STAR



AN INVESTIGATION INTO RACE AND CRIME



SUING POLICE: Jason Burke, falsely accused of dealing drugs during Caribana two years ago, says he was a victim of racial profiling.

Singled out Star analysis of police crime data shows justice is different for blacks and whites

Telling numbers

Released at scene

Police records show that a black person in Toronto arrested on a single drug possession charge was less likely to be released at the scene... % of each racial group and twice as likely 61.8× to be held for a ball hearing, compared to a white person on he same charge

Blacks arrested by Toronto po-lice are treated more harshly than whites, a Toronto Star analysis of crime data shows

Black people, charged with simple drug possession, are taken to police stations more often than whites facing the same charge. blacks are held overnight, for a which an individual was arrested, police. bail hearing, at twice the rate of or ticketed, for an offence dating Chief Julian Fantino disputed

shows a disproportionate number es. The Star obtained that data riolations that only surface follow- request, marking the first time acing a traffic stop. This difference, cess to these numbers was grantav civil libertarians, community ed to anvone outside the police

Managing Editor's notebook, A2

leaders and criminologists, sugthis data in terms of race, but The gests police use racial profiling in Star has no such restriction. The deciding whom to pull over. findings provide hard evidence of The evidence is contained in a what blacks have long suspected massive police database recording — race matters in Canadian socimassive police database recording Once at the station, accused more than 480,000 incidents in ety especially when dealing with

or ticketed, for an offence dating back to 1996. It included almost the findings, saying the colour of a The Toronto crime data also 800,000 criminal and other charg- person's skin has nothing to do with how they're treated by his ofof black motorists are ticketed for through a freedom of information ficers. "We don't treat people different-

Police are forbidden, by their

overning board, from analyzing

community

Please see Toronto, A12

Barclay L2 Births B7

Chrétien

expected

to keep

cabinet

minister

Ethics report has 'wiggle room' to

save MacAulay BY TIM HARPER

AND LES WHITTINGTON OTTAWABUREAU OTTAWA - Jean Chrétien receives a report from his ethics counsellor today that is expected to give him enough "wiggle room" to keep his solicitor-general, Lawrence MacAulay, in the federal cabinet,

Ethics counsellor Howard Wilson completed his report and delivered it to the Prime Minister's Office last night where it was received by Chrétien's chief of staff, Percy

It was then to be relayed to Chrétien by secure fax to Bei-rut, where the Prime Minister

is attending a summit of French-speaking nations. It was 1:30 a.m. in Beirut when

the fax arrived so Chrétien

would likely be reading it this

Senior sources said last night that unless there is a surprise in Wilson's report, the Prince Edward Island minister will remain, Chrétien will return to Ottawa and weather the inevi-

table storm of opposition and media protest and forge ahead

with an ethics package by mid-

Wilson has been investigat

ing whether MacAulay broke ethics guidelines for cabinet

ministers in the awarding of a

contract and extension worth

\$100.000 to Everett Roche, a

Charlottetown political friend

Chrétien will not fire MacAu-

lay unless he is given incontro-vertible evidence of wrongdo-

ing for two key reasons, sourc

INSIDE

🖝 Please see MacAulay, A8

Ellie Tesher L2

James Trawers H2

of the solicitor-general's

Downe.

morning.

week.

Racial profiling: Analysis graph

- Police actions on a charge of simple possession of marijuana
 - release with a summons (Form9) vs. hold for bail (Show cause)
 - Evidence for racial bias?
- First graph: mosaic display
 - area ~ frequency
 - shading: ~ residual
 - Obs > Expected in blue
 - Obs < Expected in red



Racial profiling: The process

How to communicate these results most effectively?

• What is the message? What features are directly comprehensible to the audience?



Graphic designer's _ early attempts

York University professor Michael Friendly's expert statistical analysis provided confirmation for the Toronto Star's series on racial profiling by city police.

Man behind the numbers

Racial profiling: Presentation graphic

Together, we created this (nearly) self-explaining infographic





A whirlwind tour of the history of Data Visualization

- The Milestones Project
- Moral statistics: the birth of modern social science
- Galton: the birth of modern statistical methods
- Graphical excellence: Album de Statistique Graphique



Why study history of #datavis?

Those who don't know history are doomed to plagiarize it.

Recursive mosaic: Distribution of passengers and goods from the Paris railways to the rest of France [*Album*, 1884, pl. 11]





The Milestones Project

https://datavis.ca/milestones/

Milestones in the History of Thematic Cartography, Statistical Graphics, and Data Visualization	
An illustrated chronology of innovations by Michael Friendly and Daniel J. Denis	
🏫 Introduction Milestones Project Varieties of Data Visualization Related References Keyword Index	Search (2)
Pre-1600 1600s 1700s 1800+ 1850+ 1900+ 1950+ 1975+	

Timeline

This page provides a graphic overview of the events in the history of data visualization that we call "**milestones**." These milestones are shown below in the the form of *an interactive timeline*. The timeline is divided into *two vertical sections*. You can *drag each sec<u>tion left or right</u>* to see milestones of different time periods. You can also click one of the links at the bottom of the timeline to jump to a particular epoch

	he timeline can be clicked to reveal i licked to initiate a search of other mi		646.200 DE200 DE200 CD	1644 (Spain) Michael F. van Langren (First visual representatio variations in determinati Toledo and Rome	on of statistical data:
	Item categories: 🔍 🔍 Cartog	raphy ^O Statistics and graphics	Tech	<u>Milestone Detail</u> 🔍	
Trigonometric triangulation	Sunspots	Least deviations	_Coordin₀		a1st data graph
s Gunter's sc					

The web site: <u>http://datavis.ca/milestones</u> has an interactive timeline, allowing different kinds of search

Milestones database



Milestones Tour: Epochs



Statistical historiography

Historical information, suitably organized can be treated as data, and analyzed. This plot shows a smoothed frequency distribution of 248 milestones items over time, in relation to the named time periods.



Milestones: Content Overview

Every picture has a story – Rod Stewart



Pre 17th C.: Early maps & diagrams

c. 550 BC: The first world map? (Anaximander of Miletus)



1350: Bar graph of theoretical function N. Oresme, France





1305: Mechanical diagram of knowledge- Ramon Llull, Spain





the World

1375: Catalan Atlas, an exquisitely beautiful visual cosmography, perpetual calendar, and thematic representation of the known world- Abraham Cresques, Spain

BC AD		17th C	18th C	19th Century	20th Century	27
10	00 1	600 17	/00 18	00 19	900 20	00



1375: Catalan Atlas, an exquisitely beautiful visual cosmography, perpetual calendar, and thematic representation of the known world- Abraham Cresques, Majorca, Spain [BNF: ESP 30]

Western world



Eastern world (Marco Polo)



Perpetual calendar



1600-1699: Measurement and Theory

: Visual representations used to chart the changes in sunspots over time-Christopher Scheiner





: First visual representation of statistical data-M.F. van Langren, Spain

: First graph of a continuous distribution function (Gaunt's life table)– Christiaan Huygens.



: First use of areas of rectangles to display probabilities of independent binary events-Edmund Halley, England

						,	0		
BC	AD		17th C	18th C	19th Century		20th Century		20
	10	00 10	600 17	/00 18	300 11	900		2000	20



Sunspots: Galileo

1608: telescope (Hans Lippershey, NL)

1610: Galileo (Sidereus Nuncius)



1611: Galileo records **movement** of sunspots over time (*Three letters on sunspots*, 1613)

Visual ideas:

- Animated graphic
- "Small multiples"
- •Allows comparison
- •Self-explaining diagram



1700-1799: New graphic forms

1701: Isobar map, lines of equal magnetic declination – Edmund Halley





1765: Historical time line (life spans of famous people) Joseph Priestley



1786: Bar chart, line graphs of economic data-William Playfair



BC	AD		17th C	18th C	\geq	19th Century	20th Century	31
	10	00 10	600 17	700	1800	19	00 2	000

: Visualization of the history of civilizations & empires over ~3000 years --Joseph Priestley





1800-1849: Beginning of modern data graphics

1801: Pie chart, circle graph invented- William Playfair



1826: First modern statistical map (illiteracy in France)- Charles Dupin



1843: Wind-rose (polar coordinates)- L. Lalanne



1826: The 1st choropleth map, showing the distribution of literacy in France – Baron Charles Dupin





Social variables became:

- visual
- subject to scientific discussion

1850-1900: Golden Age

- By the last half of the 19th century the conditions for rapid growth of visualization had been established:
 - widespread data collection for planning, commerce, social theory
 - the beginnings of statistical theory and visual thinking
 - a wide range of graphic forms, reasonably well understood
 - technology:
 - lithography and color printing
 - automatic recording devices
 - calculation: machines & graphical calculators
- The result was a perfect storm-- among the most exquisite graphics ever produced.



1850-1900: Golden Age



1855: Dot map of disease data (cholera)- John Snow

Broad St. pump

1879: Stereogram (3D population pyramid)- Luigi Perozzo



1884: Recursive multimosaic on a map-Emile Cheysson



1896: Area rectangles on a map to display two variables and their product- Jacques Bertillon



BC	AD		17th C	18th C	19th	Century		20th Century	
	10	00 1	600 17	00 18	00		1900		2000

Stories from the Golden Age (1850-1900)

Stories:

- A.-M. Guerry & the rise of social science
- Galton's graphical discoveries
- Statistical albums

Themes:

- Statistics: numbers of the state
- Escaping flatland: $2D \rightarrow 3D$
- Visualization → Theory (graphic discovery)
- Data \rightarrow Theory \rightarrow Practice
- Graphical excellence

A. M. Guerry and the rise of social science

Essai sur la statistique moral de la France

The launching pad of modern social science

- Presented to Academie des Sciences Français July 2, 1832
- First systematic analysis of comprehensive data on crime, suicide, and other social variables.
- Along with Quetelet (1831, 1835), established the study of "moral statistics"
 modern social science, criminology, sociology



Guerry, La Statistique Morale

- In France, widespread, national data collection on social issues began ~ 1810—1825
 - Iiteracy: % of army conscripts who could read and write
 - crime: Ministry of Justice launched the Compte Générale
 - every criminal charge recorded, with all details: age, sex, occupation, date, court outcome
 - mandated quarterly reports to Paris
- Suddenly, one could attempt to answer important questions using data rather than philosophy
 - Is greater literacy related to less crime?
 - Do more priests lead to less crime, suicide or prostitution?
- Moral statistics: the beginning of modern social science
 - Social data could lead to "social laws" à la "physical laws"
The discovery of "social facts"

Stability and Variation

Guerry's results were both compelling and startling:

- Rates of crime and suicide remained remarkably invariant over time, yet varied sytematically by region, sex of accused, type of crime, etc.
- In any given French city or department, almost the same number committed suicide, stole, gave birth out of wedlock, etc.

Year	1826	1827	1828	1829	1830	Avg			
Sex	All accused (%)								
Male	OMG! ~ constant $\rightarrow 79$	79	78	77	78	78			
Female	21	21	22	23	22	22			
Age	Accused of Theft (%)								
16–25	37	35	38	37	37	37			
25–25	OMG! ~ constant \rightarrow 31	32	30	31	32	31			
Crime	ne Committed in summer (%)								
Indecen	t assault .	36	36	35	38	36			
Assault & battery		28	27	27	27	28			

"We are forced to conclude that the facts of the moral order are subject, like those of the physical order to invariable laws." (Guerry, 1833, p14)

Guerry & Balbi (1829): Comparative statistics of crime & education

- First shaded thematic maps of crime data
- First comparative maps of social data
- is crime against persons seemed inversely related to crime against property!
- ► Instruction: → France obscure and France éclairée (Dupin, 1826)
- North of France highest in education, but also in property crime!



What is missing: (a) idea of plotting Y vs. X; (b) measures of co-relation

Guerry (1864): General causes of crime

Plate XVII: Guerry's magnum opus

Goal:

- Show multivariate factors associated with distribution of crimes of various type
- Before invention of correlation

Entries: Codes for factors

- Pop: (% Irish, domestics, ...)
- Criminality: (male, young, ...)
- Religion (Anglicans, dissenters, ...)

		g	0	0	v	5	3	λ	8	
x	f	c	ß	a	n	6	m	1	1	
		a	e	j	k	9	pB	μ	b	k
	r	7	d	l'a	η	ξ	h %	n	0	m

Guerry, A.-M. (1864). *Statistique morale de l'Angleterre comparée avec la statistique morale de la France*



Galton: Visual thinking & graphic discovery



Galton's contributions:

- Genetics (inheritance)
- Regression towards mean
- Forensics (fingerprints)
- Travel: Isochronic maps
- Weather maps
- Psychology: Mental imagery & word associations
- Standardized data forms & crowd-sourced collection

Portrait of Galton in his study by Susan Slyman

Galton's discovery of weather patterns-Perhaps the most notable *purely graphic* discovery ever!

METEOROGRAPHICA,

OR

METHODS OF MAPPING THE WEATHER;

ILLUSTRATED BY UPWARDS OF 600 PRINTED AND LITHOGRAPHED DIAGRAMS

REFERRING TO

THE WEATHER OF A LARGE PART OF EUROPE,

During the Month of December 1861.

By FRANCIS GALTON, F.R.S.

(Galton, 1863)

Images here courtesy of Stephen Stigler. Thx!



Method: All weather stations across Europe asked to record data 3x/day for all of Dec., 1861

Data: recordings of barometric pressure, wind dir/speed, rain, temp., cloud: 3x/day, 50 weather stations in Europe.

Graphic analysis: 3x31=**93** maps, each with multivariate glyphs showing all variables

Visual ideas:

- Iconic symbols
- Multivariate glyphs (stamps!)







Visual abstraction → Patterns

What varies with what, over time and space?

- mini, abstract maps: vars x TOD
- iso-contours, shading to show equivalence
- arrows to show wind direction





The large picture \rightarrow Insight

Pattern:

Low pressure (black) in early Dec. \rightarrow CCW wind \checkmark

High pressure (red) in late Dec. \rightarrow CW wind

Graphic: 3x3x31 grid, mapping {pressure, wind/ rain, temperature} x {AM, 12, PM} x day {1:31}

(try this with your software!)



A series of weather maps from the Meteorographica.

Visual insight \rightarrow Theory

Visual insight from 93 (3x31) high-D graphs:

• Changes in wind dir w/ pressure over time

 → Winds revolve inwardly (CCW) in low pressure areas— as in a cyclone;

 → revolve outwardly (CW) in high pressure areas— "anticyclone"

Theory:

• Explained by Dove's 'Law of Gyration'

• Prediction: reversed pattern (CW/CCW) in southern hemisphere – confirmed!





Theory \rightarrow Practice

The first modern weather map, London Times, Apr. 1, 1875

Galton did for weathermen what Kepler did for Tycho Brahe. This is no small accomplishment. (Wainer 2005) WEATHER CHART, MARCH 31, 1875.



The dotted lines indicate the gradations of barometric pressure The variations of the temperature are marked by figures, the state of the sea and sky by descriptive words, and the direction of the wind by arrows—barbed and feathered according to its force. \odot denotes calm.



Statistical atlases: Data \rightarrow practice, national identity & graphical excellence

- Collection of gov't statistics on pop., trade, moral & political issues widespread in Europe & US, starting ~ 1820
- Statistical albums ~ 1870—1910
 - France: *Album de Statistique Graphique*: 1879-1899
 - USA: Census atlases: 1870/80/90
 - Germany: local albums (Berlin, Frankfurt, etc.)
 - Switzerland: *Atlas graphique de la Suisse:1897, 1914*
 - Others: Latvia, Romania, Bulgaria, etc.

Album de statistique graphique

- Published by the *Statistical Graphics Bureau*, Ministry of Public Works, Émile Cheysson, director
- 18 volumes: 1879-1899, 12—34 plates each, ~ 11"x15" pages
- Graphic forms:
 - Flow maps (simple, double, multi)
 - Pie maps, star, radial, polar time-series, proportional circles
 - Mosaic maps, anamorphic maps, planetary diagrams
 - Choropleth, bi-polar scales
 - Charts: line, bar, time-series
- Pinnacle of the Golden Age: exquisite sampler of all known graphic forms!













Recursive multi-mosaic map

Distribution of **passengers** and **goods** from the Paris railways to the rest of France [Album, 1884, pl. 11]

(The image that launched my interest in the history of data vis.)





Anamorphic map

Shrinking France to show change in travel time over 200 years [Album, 1888, plate 8]

	1650.	1789.	1814.	1884.	1854.	1887.
alala.	1 1 34	601	404	+84	6.40	418.
Alle.	105	4.	404 34 34 55		4.50	3.50
lésères	110	60	34	**	17.00	5.00
erbach	171	93 108	55	** 38	10.50	8.4
tresbourg	918	108	70	47	10.40	
lelfort	180	98	7°	39	17.51	3.0
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ferseille	359	184	1	80	38.90	13.5
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e Havre.	1 97	50	1 31	1 17	5.15	4.10





Album de statistique graphique

Q: How did Paris benefit from various int'l expos? How to show this visually?

Polar area diagrams on Paris map

Gross receipts in theaters in Paris, 1878—1889, related to universal expositions [Album, 1889, plate 26]



Les Chevaliers des Albums

Antony Unwin





Gilles Palsky



RJ Andrews

Howard Wainer



David Rumsey

Antoine de Falguerolles

Michael Greenacre

Stephen Stigler

Ian Spence









ASG now online: David Rumsey

All 18 volumes, https://www.davidrumsey.com/luna/servlet/s/nl72bu



1886

National Atlas

V Related (28)



Ministere des Travaux P... Carte Figurative des Re... Carte Figurative des Ex... 1886 National Atlas V Related (28)



1886 National Atlas



Ministere des Travaux P... Carte Figurative du Ton... V Related (28)



Ministere des Travaux P... Nombre de Voyageurs Tra... 1886 National Atlas V Related (28)



Ministere des Travaux P... Mouvement Sur les Chemi... 1886 National Atlas V Related (28)



Ministere des Travaux P... Statistical Diagram: Ra... 1886 National Atlas V Related (28)



Ministere des Travaux P... Situation des Chemins d... 1886 National Atlas V Related (28)



Ministere des Travaux P... Resultats D'Exploitatio... 1886 National Atlas V Related (28)



Ministere des Travaux P... Tonnage des Voies Navig... 1886 National Atlas V Related (28)



Ministere des Travaux P... D'Epenses de Premier Et... 1006 National Atlas V Related (28)

Ministere des Travaux P...

Tonnage des Voies Navig...

1886

National Atlas

V Related (28)



Ministere des Travaux P... Carte Figurative du Ton... 1886 National Atlas V Related (28)



Ministere des Travaux P... Tonnage des Voies Navig... 1886 National Atlas V Related (28)



Ministere des Travaux P... Tonnage des Voies Navig... 1886 National Atlas V Related (28)







Graphic details

"God is in the details" – Ludwig Mies van der Rohe

Cheysson Regular

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Golden Lessons

- What are the lessons for the future?
- Phenomena, not numbers or simply pretty pictures
 - Playfair, Guerry, Minard, Galton, etc. all developed new graphic forms to show phenomena of deep interest:
 - balance of trade, rates of crime, patterns in weather data, ...
- 1st lesson: data visualization today should have a similar focus



Golden Lessons: Graphical Impact

- Impact: Early ideas
 - Playfair, Guerry: data should "speak to the eyes"
 - Minard, Lalanne: allow "calculation by the eyes"
 - Nightingale: graphs should speak to the heart and mind, influence public policy & practice
- Graphical impact (Tukey, 1990)
 - Interocularity: the message hits you between the eyes
 - Immediacy: it hits you fast
 - Inescapability: it is hard to avoid the message
- **2nd lesson**: strive for visual impact in graphs and tables
 - God is in the details

Golden Lessons: Expressive power

- Hand-made graphics were often beautiful but entailed much sweat and hard work.
- Today: software— ease of use vs. expressive power
- Theories of graphics → graphic "languages"
 - Bertin: Semiology of graphics
 - Wilkinson: *Grammar of Graphics*
 - Wickham: *ggplot2* R package
 - In all: the devil is in the details!
- **3**rd **lesson**: continue to reduce the distance between a graphic idea and appearance on screen or paper.



Conclusions

The only new thing... is the history you don't know – Harry Truman

- Data visualization has deep roots:
 - Cartography
 - Statistical theory
 - Data collection
 - Visual thinking
 - Technology

• The Golden Age:

- Qualitatively distinct, deserves recognition
- Works of unparalleled beauty & scope
- Statistical graphics had a *purpose*: tell a story, inform decision
- Provides lessons for today and tomorrow

All combine to give insightful views of data

Each area fed from, and nourished the others

Thank you!

Ask me anything

Further info:



https://datavis.ca



@datavisFriendly



Photo mosaic of history of datavis