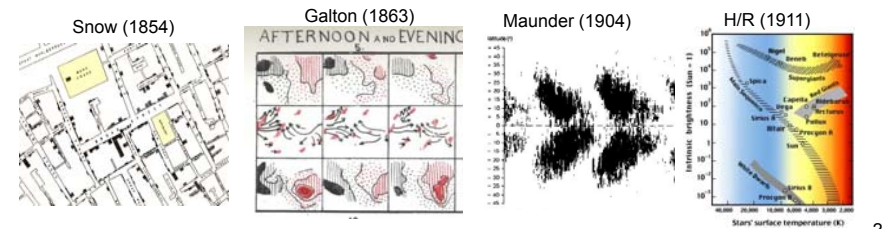


Big Data and Big Questions: Vignettes and lessons from the history of data visualization

Michael Friendly
York University
Workshop on Visualization for Big Data
Fields Institute, Feb. 2015

Big meta Q: Visualization-based discoveries ??

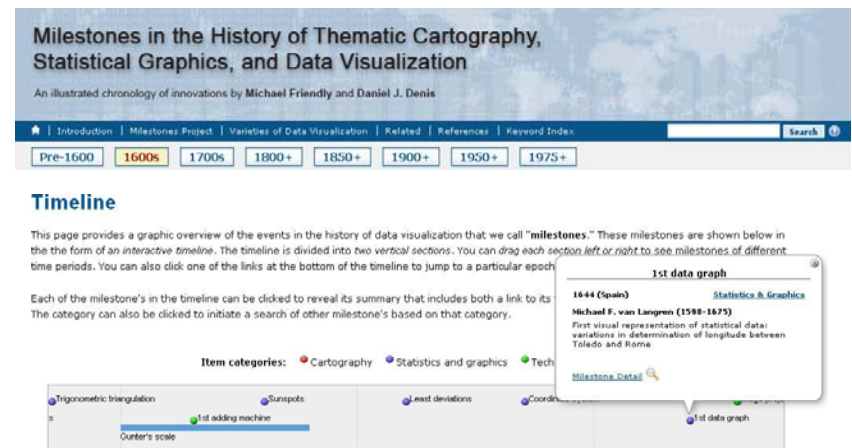
- When have graphics led to discoveries that might not have been achieved otherwise?
 - Snow (1854): cholera as a water-borne disease
 - Galton (1883): anti-cyclonic weather patterns
 - E.W. Maunder (1904): 11-year sunspot cycle
 - Hertzsprung/Russell (1911): spectral classes of stars



Big meta Q: Visualization-based discoveries ??

- In the history of graphs, what features and data led to such discoveries?
 - What visual ideas/representations were available?
 - What was needed to see/understand something new?
- As we go forward, are there any lessons?
 - What are the Big Questions for today?
 - How can data visualization help?

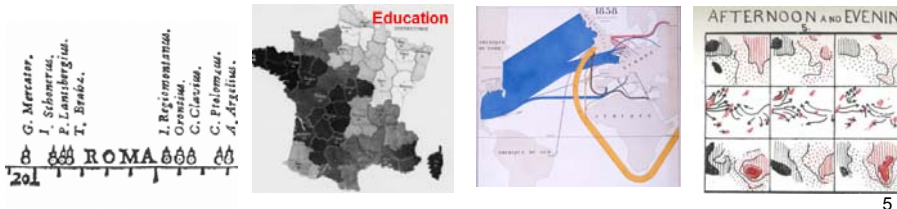
Context: Milestones Project



Web site: <http://datavis.ca/milestones>

Vignettes: 4 heros in the history of data visualization

- The 1st statistical graph: M.F. van Langren and the “secret” of longitude
- “Moral statistics”: A.M. Guerry and the rise of modern social science
- Visual tools for state planning: C.J. Minard and the *Albums de Statistique Graphique* in the “Golden Age”
- Mapping data: Galton’s discoveries & visual insight



5

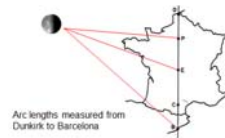
Underlying themes

- Escaping flatland: 1D → 2D → nD
- The rise of visual thinking and explanation
- Mapping the invisible
- Data → Theory → Practice
- Graphical excellence
- Appreciating the rich history of DataVis in what we do today

6

1. Big questions of the 17th century

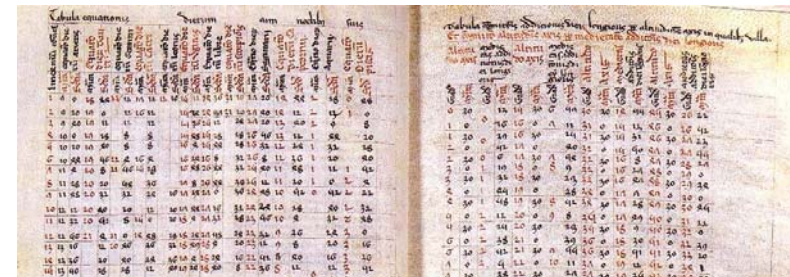
- Geophysical measurement: distance, time and space
- Astronomy
 - Shape of the earth
 - Orbits of planets, comets
 - → analytic geometry, errors of measurement, least squares
- Navigation & territorial expansion
 - Map-making and surveying
 - Navigation at sea: latitude (easy) and longitude (hard)



7

Big data of the 17th century

- Astronomical and geodetic tables
 - Ptolemy’s *Geography* (~150 AD): lat/long catalog of known earth
 - Positions of planets, moon, etc. observed from given locations
 - Alfonsine Tables (~1260), Rudolphine tables (Kepler, 1627)
 - Tycho Brahe’s star/planet tables



Alfonsine tables, Toledo, ca.1260

8

Early “firsts” in data visualization

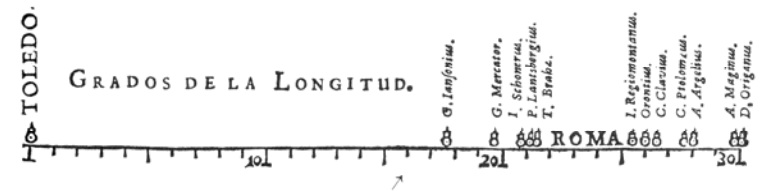
- Map projections, latitude, longitude – Claudius Ptolemy, c. 150 AD
- First modern atlas – *Teatrum Orbis Terrarum*, Abraham Ortelius, 1570
- First world map showing isogons – Guillaume Le Nautonier, 1640
- First visual representation of statistical data – M. F. van Langren, 1644



9

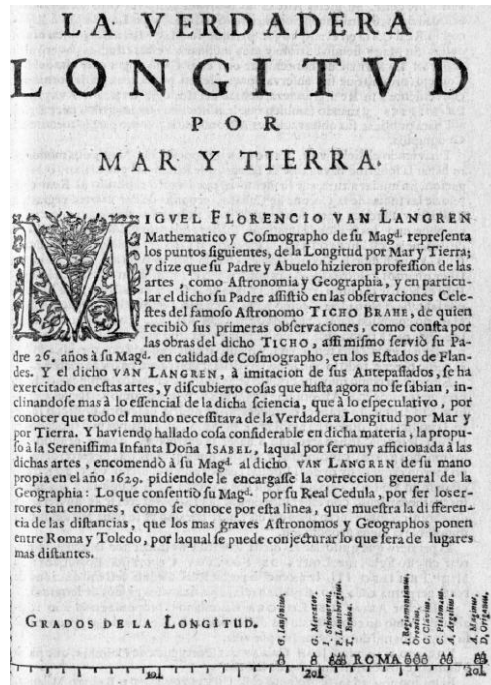
Early “firsts” in data visualization

- Map projections, latitude, longitude – Claudius Ptolemy, c. 150 AD
- First modern atlas – *Teatrum Orbis Terrarum*, Abraham Ortelius, 1570
- First world map showing isogons – Guillaume Le Nautonier, 1640
- First visual representation of *statistical data* – M. F. van Langren, 1644



M. F. van Langren (1644). *La Verdadera Longitud por Mar y Tierra*. Antwerp (n.p.)

10



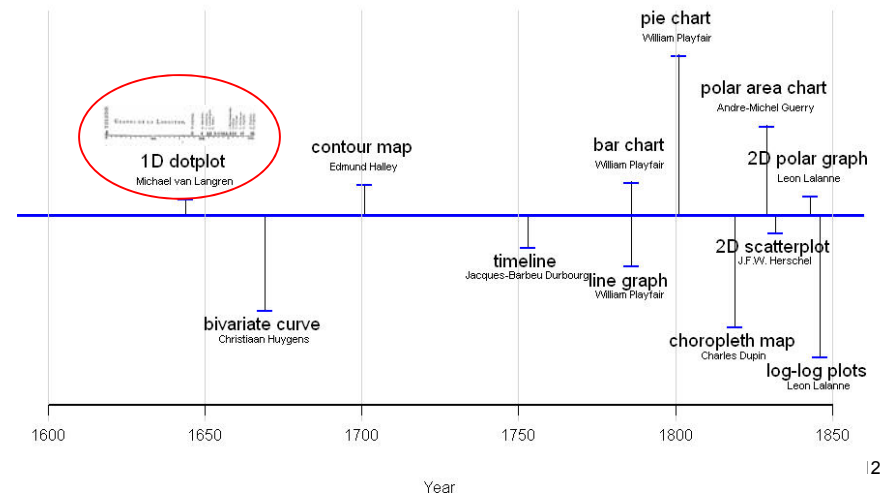
The Truth about Longitude for Sea and Land (1644)
Sent to King Phillip of Spain

- The best astronomers have made their measurements
- You can plainly see the large errors in estimates of distance from Toledo to Rome
- I know the **secret** of longitude, and will tell you if you grant me a Patent.

11

Early history of statistical graphs

Timeline of Invention of Basic Forms for Statistical Graphs



12

The problem of longitude

- Latitude- easy to determine by inclination of sun, moon, stars above/below equator
- Longitude:
 - No fixed 0 reference; distance varies with latitude
 - Only known fact: $360^\circ = 24\text{hrs} \rightarrow 15^\circ / \text{hr}$
 - \rightarrow Need to know Δtime precisely, for given location
- Solution classes:
 - 2 clocks: $\Delta\text{time} = \text{time}_{\text{Here}} - \text{time}_{\text{There}}$
 - Astronomic: $\Delta\text{time} = \text{time}_{\text{Here}} - \text{time}_{\text{There}}$

13

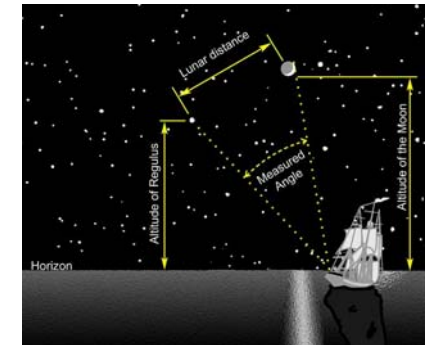
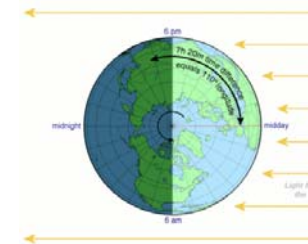
Longitude: Lunar distance method

Measure the angle between moon and some other body

Lookup in almanac time at which that distance would be observed in Greenwich: $\text{time}_{\text{There}}$

Determine $\text{time}_{\text{Here}}$ (sextant)

Longitude = $15^\circ \times \Delta\text{time}$

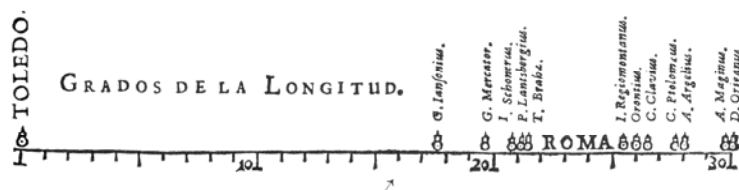


14

Why the first graph got it right

"Every picture tells a story" – Rod Stewart

- What was van Langren's communication goal?
- What else could he have done?
- Why did the idea of a graph occur to him?



15

What else could he have done?

- What would occur to men of his time to convey a message to the King?
- ... he could have used a *table* have sorted by *year* to establish *priority* (or show change).

Sorted by Priority

| Year | Name | Longitude | Where |
|------|------------------|-----------|----------|
| 150 | Ptolomeus, C. | 27.7 | Egypt |
| 1463 | Regiomontanus, | 25.4 | Germany |
| 1530 | Lantsbergius, P. | 21.1 | Belgium |
| 1536 | Schonerus, I. | 20.8 | Germany |
| 1542 | Ortonius | 26.0 | France |
| 1567 | Mercator, G. | 19.6 | Flanders |
| 1567 | Clavius, C. | 26.5 | Germany |
| 1578 | Brahe, T. | 21.5 | Denmark |
| 1582 | Maginus, A. | 29.8 | Italy |
| 1601 | Organus, D. | 30.1 | Germany |
| 1605 | Iansonius, G. | 17.7 | Flanders |
| 1610 | Argelius, A. | 28.0 | Italy |

Answers: Who did it *when*?

16

- ... he could have sorted by *longitude*, to show the *range*.

Answers: How much did they *vary*?

Sorted by Longitude

| Longitude | Name | Year | Where |
|-----------|------------------|------|----------|
| 17.7 | G. Ianonius | 1605 | Flanders |
| 19.6 | G. Mercator | 1567 | Flanders |
| 20.8 | I. Schonerus | 1536 | Germany |
| 21.1 | P. Lantsbergius | 1530 | Belgium |
| 21.5 | T. Brahe | 1578 | Denmark |
| 25.4 | I. Regiomontanus | 1463 | Germany |
| 26.0 | Orontius | 1542 | France |
| 26.5 | C. Clavius | 1567 | Germany |
| 27.7 | C. Ptolomeus | 150 | Egypt |
| 28.0 | A. Argelius | 1610 | Italy |
| 29.8 | A. Maginus | 1582 | Italy |
| 30.1 | D. Organus | 1601 | Germany |

Sorted by Authority

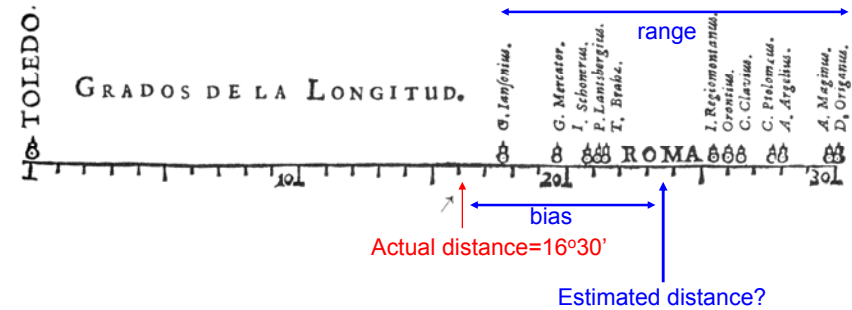
| Name | Longitude | Year | Where |
|-------------------|-----------|------|----------|
| Argelius, A. | 28.0 | 1610 | Italy |
| Brahe, T. | 21.5 | 1578 | Denmark |
| Clavius, C. | 26.5 | 1567 | Germany |
| Ianonius, G. | 17.7 | 1605 | Flanders |
| Lantsbergius, P. | 21.1 | 1530 | Belgium |
| Maginus, A. | 29.8 | 1582 | Italy |
| Mercator, G. | 19.6 | 1567 | Flanders |
| Organus, D. | 30.1 | 1601 | Germany |
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| Ptolomeus, C. | 27.7 | 150 | Egypt |
| Regiomontanus, I. | 25.4 | 1463 | Germany |
| Schonerus, I. | 20.8 | 1536 | Germany |

- ... he could have sorted by *name*, to show *authority*.

Answers: What did **XXX** say?

Only a graph shows...

- central location
- wide variability
- bias
- clustering, detached observations
- name labels– avoiding overplotting



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Only a graph shows...

We can see what van Langren was trying to show in relation to a modern map

- Scales aligned to position Rome at the correct location (unknown to him)
- Main goal: *show wide variability*
- Added benefit: **we** can see that all estimates were positively biased
- What's not to like?



Further details: Friendly et al. (2010), The First (Known) Statistical Graph: Michael Florent van Langren and the "Secret" of Longitude. *The American Statistician*, 64, 185-191

19

The "secret:" Longitude & selenography

- Van Langren jealously guarded his secret – an improvement in the lunar method
- By 1628, he had the idea to use *rotation* of the moon– rather than mere *position* in the sky
 - Sunrise/sunset on peaks/craters: continuous set of reference events
- Required:
 - Accurate lunar maps with named features
 - Ephemeris tables, giving onset of sunrise and sunset for those features in the lunar cycle

20



By 1645, he produced the 1st comprehensive lunar map

- 325 named locations (illustrious men, saints, his patrons— Phillip, Isabella)
- Never completed the manual and tables showing exactly how the method could be used
- Today, he is better remembered for his lunar map than for the 1st statistical graph
- Nearly all of his nomenclature was later replaced, except for the self-named *Langrenus Crater*

21

2. Big questions of the early 1800s

- Issues for European states
 - Demography: taxes, raising an army (Süssmilch, 1741)
 - “Statistik”: Numbers of the state (Achenwall, 1748)
 - Social problems: crime, suicide, literacy, etc.
- Anthropometry: the measure of Man
 - Distributions of human characteristics
 - Birth, mortality, lifespan
- Beginnings of statistical theory and application
 - Normal distⁿ (de Moivre, 1733)
 - *L’homme moyen* (Quetelet, 1835)

22

Big data of the early 1800s: “An avalanche of social numbers”

- J.-B.J. Fourier: *Recherches statistique sur la ville de Paris* (1821-1829)
 - Massive tabulations: births, deaths (by cause), admission to insane asylums (age, sex, affliction)
- Ministry of Justice: *Compte generale* (1825--)
 - First **national** compilation of criminal justice data
 - **All** charges & dispositions, quarterly, 86 departments
- Other sources:
 - Bureau de Longitudes (illegitimate births)
 - Parent-Duchatelet (prostitution); Min. of War (desertions)
 - Suicide notes in Paris collected and analyzed for motives
- Social issues could now be addressed with **DATA**

23

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



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Social context of crime in 1820s France

- Crime a serious concern:
 - Explosive growth in Paris
 - Widespread unemployment,
 - Emergence of “dangerous classes”
- Liberal (“philanthrope”) view
 - Increase education
 - Better prison conditions, diet (bread **and** soup)
 - Religious instruction
- Conservative view
 - Build more prisons
 - Harsher treatment of recidivists
- Now, there was finally some DATA!

25

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 systematically** 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 | 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 | 31 | 32 | 30 | 31 | 32 | 31 |
| Crime | Committed in summer (%) | | | | | |
| Indecent assault | . | 36 | 36 | 35 | 38 | 36 |
| Assault & battery | . | 28 | 27 | 27 | 27 | 28 |

26

The discovery of “social facts”

Social laws à la physical laws

Do crime and other moral variables represent:

- ▶ structural, lawful **characteristics of society**, or are they
- ▶ simply indicants of **individual behaviour**?

Guerry argued:

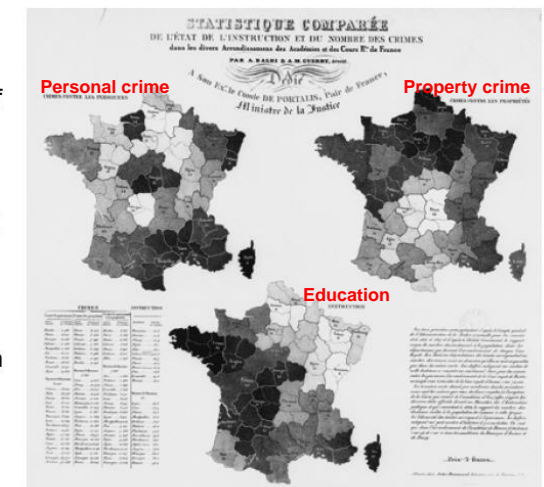
Each year sees the same number of crimes of the same degree reproduced in the same regions. (Guerry, 1833, p.10)

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

27

1829: *Statistique comparée de l'état de l'instruction...*

- ▶ First shaded thematic maps of **crime** data
- ▶ First **comparative** maps of social data
- ▶ ↳ 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!



28

1833: *Essai sur la statistique morale de la France*

- ▶ Divided the 86 departments into 5 regions
- ▶ Supplemented data from the *Compte général* with:
 - ▶ Suicides in Paris, 1794–1832
 - ▶ Prostitutes in Paris (Parent-Duchâtelet)
 - ▶ Wealth (taxes per inhabitant)
 - ▶ Distribution of clergy
 - ▶ ...
- ▶ First study to use crime data to 'test' hypotheses
- ▶ Attracted widespread interest in Europe



Guerry's 1833 map of literacy in France

29

1833: Semi-graphic tables

How does type of crime vary with age?

- ▶ → Used **ranked tables** of crime/1000 connected by colored lines
- ▶ First instance of modern **parallel coordinates plot**



Figure: Relative ranking of crimes at different ages

30

1833: Semi-graphic tables

Crimes against persons

- ▶ **Indecent assault on adults** (*viol sur des adultes*) decreases with age
- ▶ **Indecent assault on children** increases with age (top for 70+)
- ▶ **Paricide** rises to max at age 60–70



Figure: Ranking of crimes against persons at different ages

31

1864: *Statistique morale de l'Angleterre comparée...*

Dayenul

- ▶ Proposes to replace simple "moral statistics" (tables) with "**analytical statistics**"
 - ▶ calculation, graphic display
 - ▶ → **general**, abstract results
- ▶ 17 large color plates (56 × 39 cm):
 - ▶ data for France (1825–1855), England (1834–1855)
 - ▶ crimes against persons and property decomposed in various ways
 - ▶ first attempt to delineate **multivariate relations** among moral variables
- ▶ Voluminous data:
 - ▶ 85,564 suicide records (1836–1860), classified by motive
 - ▶ 226,224 accused of personal crime
 - ▶ numbers, in a line → 1170 meters!



Further details: Friendly, M. (2007). A.-M. Guerry's *Moral Statistics of France*: Challenges for Multivariable Spatial Analysis. *Statistical Science*, 22, 368-399

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Statistique analytique: General causes of crime

Plate XVII: M. Guerry's magnum opus

Goal:

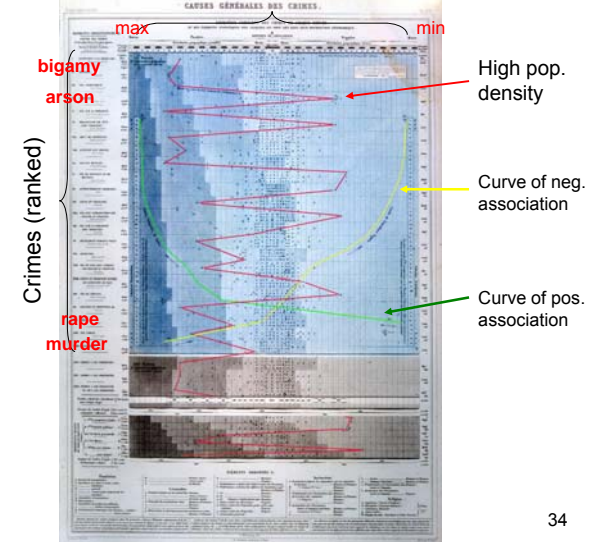
- Show multivariate factors associated with distribution of crime
- Before invention of correlation

Entries: Codes for factors

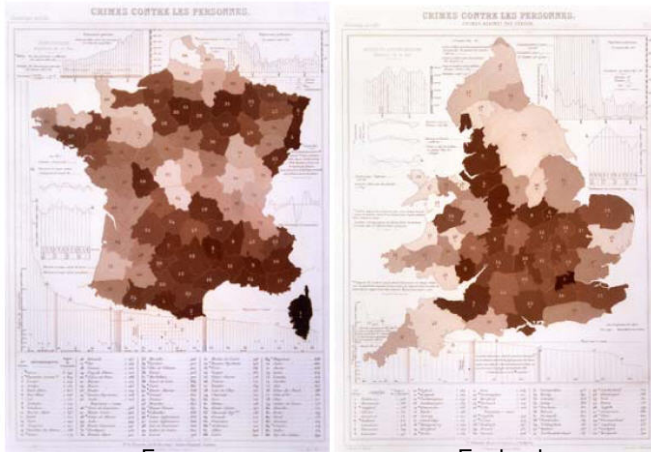
- Pop: (% Irish, domestic, ...)
- Criminality: (male, young, ...)
- Religion (Anglicans, dissenters, ...)

| | | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|
| | | g | h | o | v | z | ε | λ | δ |
| x | r | e | β | a | n | m | i | l | |
| | | a | e | j | k | q | p | θ | h |
| | | r | γ | d | f | α | η | ε | h |
| | | | | | | | | | o |
| | | | | | | | | | m |

English counties (ranked on each)



1864: Statistique morale de l'Angleterre comparée... Comparing France and England

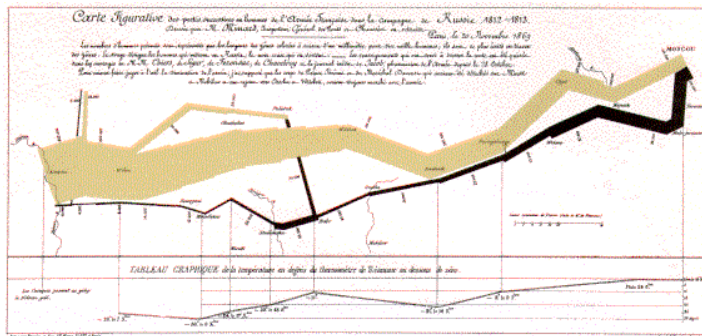


France

England

Crimes against persons

3. The graphic vision of C. J. Minard



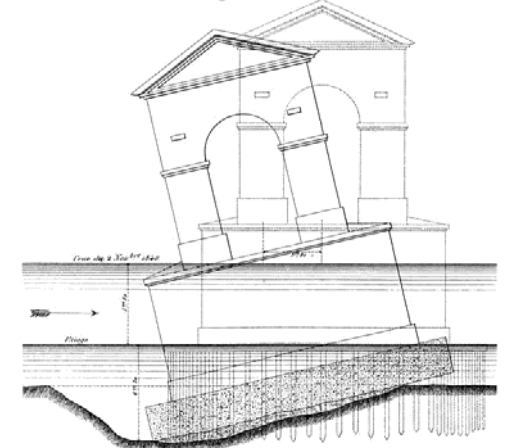
- Marey (1878): "defies the pen of the historian in its brutal eloquence"
- Tufte (1983): "the best statistical graphic ever produced"

Visual thinking, visual explanation

1840: Why did the bridge at Bourg-St. Andéol collapse?

Minard's report consisted essentially of this self-explaining diagram.

Pont de Bourg-S^t.Andéol sur le Rhône.



Big questions of the mid 1800s

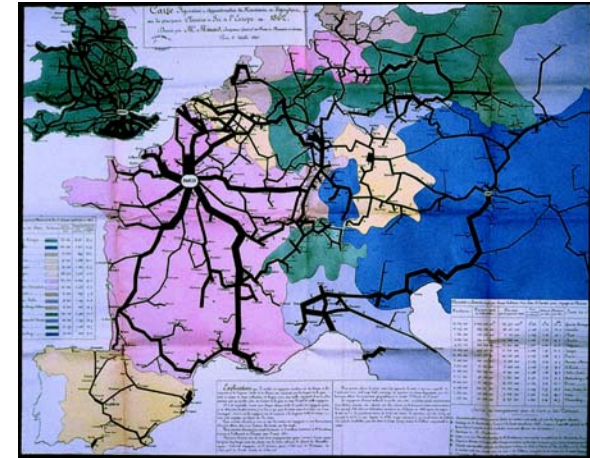
- 1830—1860: emergence of modern French state, dawn of globalization
- Trade, commerce, transportation:
 - Where to build railroads, canals?
 - How to compete with imports/exports?
 - Visualizing changes over time, differences over space
 - → Flow maps and other graphical innovations
- These questions led to the “Golden Age” of statistical graphics.

See: Friendly, M. (2008). The Golden Age of Statistical Graphics, *Statistical Science*, 23, 502-535

37

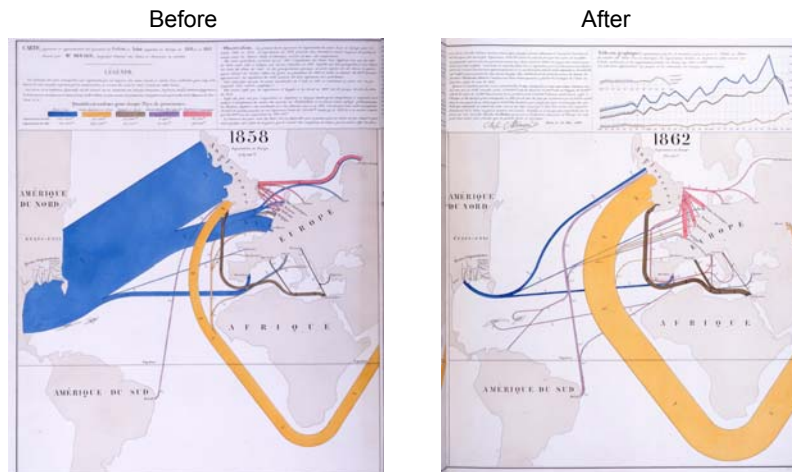
Flow maps as visual tools

Transport of passengers on the principal railroads in Europe in 1862



38

Effect of US civil war on cotton trade



39

Statistical atlases: Data → practice, national identity & graphical excellence

- 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.*
- Goals
 - Visualize progress in commerce, industry, transport
 - Provide a graphic portrait of a nation
 - Consolidate a national identity

See: Friendly, M. (2008). The Golden Age of Statistical Graphics, *Statistical Science*, 23, 502-535

40

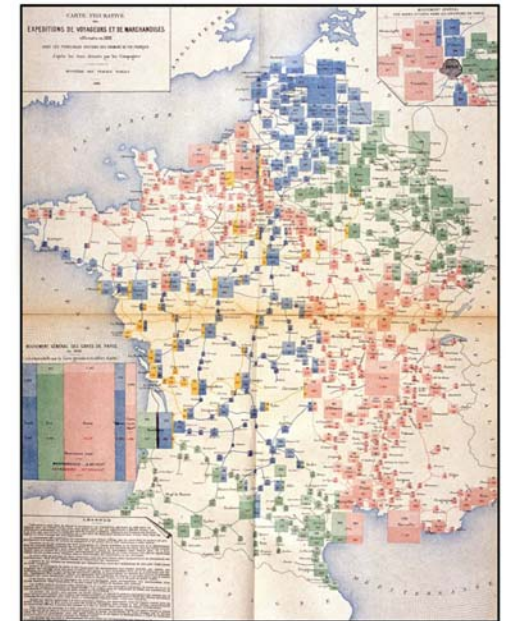
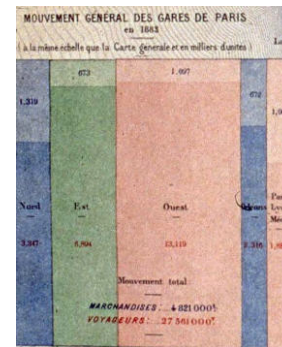
Album de statistique graphique

- 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
- Themes:
 - Recurrent: railroads, navigation, transport--- bread & butter topics
 - Occasional: agriculture, Paris, expositions, ...
- Pinnacle of the *Golden Age*: exquisite sampler of all known graphic forms!

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Recursive multi-mosaic map

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



4. Galton's visual discoveries- Bivariate normal correlation surface (1886)

Table 9.1 One of Galton's correlation tables

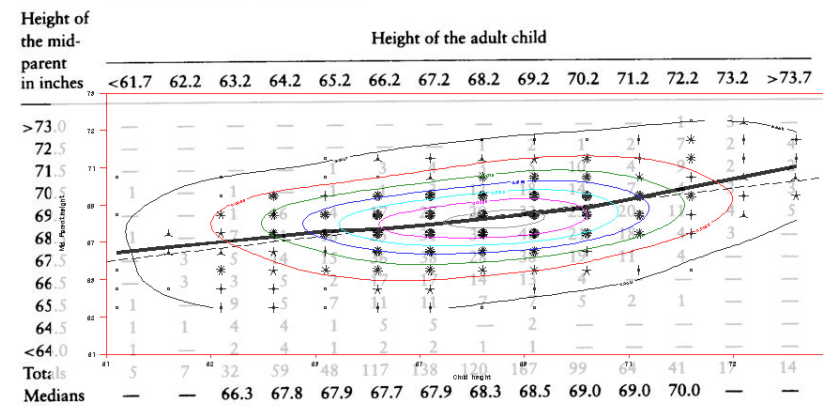
| Height of the mid-parent in inches | Height of the adult child | | | | | | | | | | | | | |
|------------------------------------|---------------------------|----------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-----------|-----------|
| | <61.7 | 62.2 | 63.2 | 64.2 | 65.2 | 66.2 | 67.2 | 68.2 | 69.2 | 70.2 | 71.2 | 72.2 | 73.2 | >73.7 |
| >73.0 | — | — | — | — | — | — | — | — | — | — | 1 | 3 | — | — |
| 72.5 | — | — | — | — | — | — | — | 1 | 2 | 1 | 2 | 7 | 2 | 4 |
| 71.5 | — | — | — | — | 1 | 3 | 4 | 3 | 5 | 10 | 4 | 9 | 2 | 2 |
| 70.5 | 1 | — | 1 | — | 1 | 1 | 3 | 12 | 18 | 14 | 7 | 4 | 3 | 3 |
| 69.5 | — | — | 1 | 16 | 4 | 17 | 27 | 20 | 33 | 25 | 20 | 11 | 4 | 5 |
| 68.5 | 1 | — | 7 | 11 | 16 | 25 | 31 | 34 | 48 | 21 | 18 | 4 | 3 | — |
| 67.5 | — | 3 | 5 | 14 | 15 | 36 | 38 | 28 | 38 | 19 | 11 | 4 | — | — |
| 66.5 | — | 3 | 3 | 5 | 2 | 17 | 17 | 14 | 13 | 4 | — | — | — | — |
| 65.5 | 1 | — | 9 | 5 | 7 | 11 | 11 | 7 | 7 | 5 | 2 | 1 | — | — |
| 64.5 | 1 | 1 | 4 | 4 | 1 | 5 | 5 | — | 2 | — | — | — | — | — |
| <64.0 | 1 | — | 2 | 4 | 1 | 2 | 2 | 1 | 1 | — | — | — | — | — |
| Totals | 5 | 7 | 32 | 59 | 48 | 117 | 138 | 120 | 167 | 99 | 64 | 41 | 17 | 14 |
| Medians | — | — | 66.3 | 67.8 | 67.9 | 67.7 | 67.9 | 68.3 | 68.5 | 69.0 | 69.0 | 70.0 | — | — |

Source: Galton (1886), p. 68.

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Visual smoothing → Insight

Table 9.1 One of Galton's correlation tables

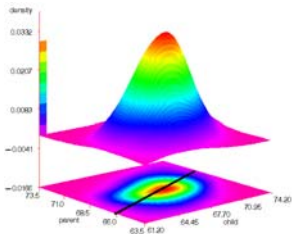


Source: Galton (1886), p. 68.

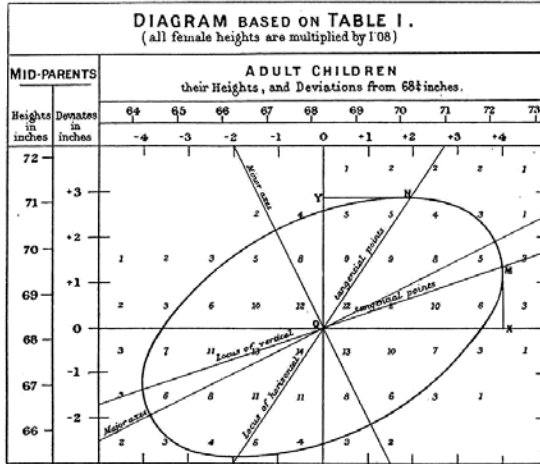
44

Visual insight → Theory

- Level curves are **ellipses**
- Regression lines are loci of conjugate **tangents**

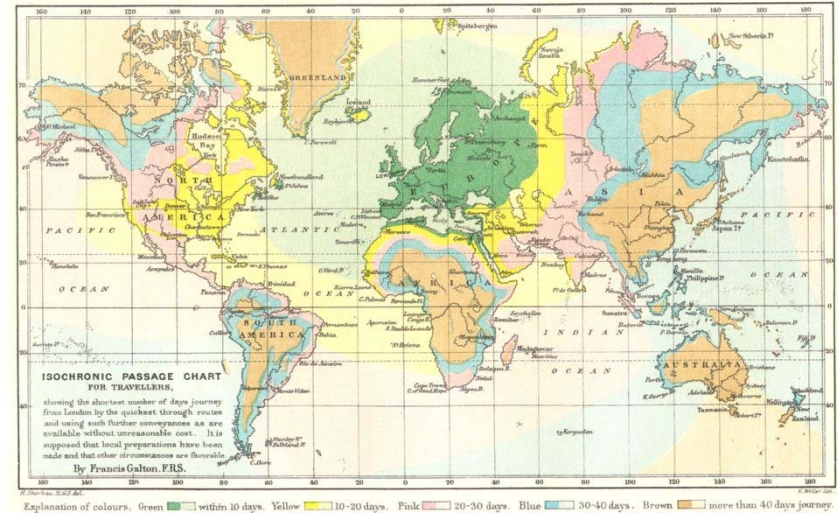


... that Galton should have evolved all this ... is to my mind one of the most noteworthy scientific discoveries arising from analysis of pure observation (Pearson 1920, p37)



Galton (1886, Pl X): Smoothed contours of heights of parents and children 45

Galton's big data : Isochronic chart (1881)



46

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

METEOROGRAPHICA,

METHODS OF MAPPING THE WEATHER;

ILLUSTRATED BY UPWARDS OF 600 PRINTED AND LITHOGRAPHED DIAGRAMS

REFERENCING 754

THE WEATHER OF A LARGE PART OF EUROPE,

During the Month of December 1861.

By FRANCIS GALTON, F.R.S.

(Galton, 1863)

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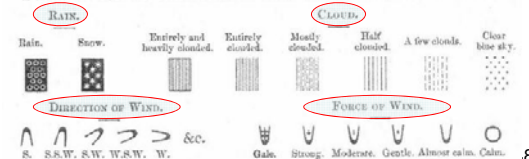
Method: All weather stations across Europe asked to record data 3x/day for all of Dec., 1861

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



EXPLANATION OF THE SYMBOLS USED IN THE WEATHER CHARTS.



- Visual ideas:
- Iconic symbols
- Multivariate glyphs (stamps!)

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Visual abstraction → Patterns

How to see patterns of geographical variation over time?

- Iconic symbols on a geographical grid
- “Small multiples:” separate graphs laid out for direct comparison



Symbols in Barometrical Charts.

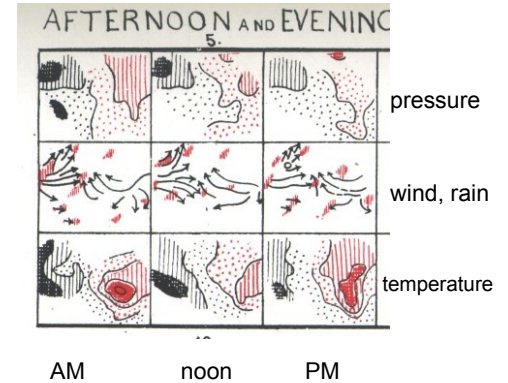
| | | | | |
|-------|------------------------|------------------------|------------------------|--------------------------|
| Black | Inches. 29.95 to 29.71 | Inches. 29.70 to 29.46 | Inches. 29.45 to 29.21 | Inches. 29.20 and below. |
| Red | ○ 29.96 to 30.20 | ○ 30.21 to 30.45 | ✱ 30.46 to 30.70 | ● 30.71 and above. |

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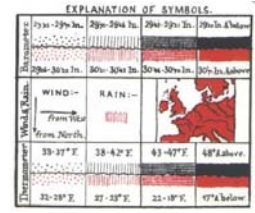
Visual abstraction → Patterns

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



Data for Dec 5, 1861

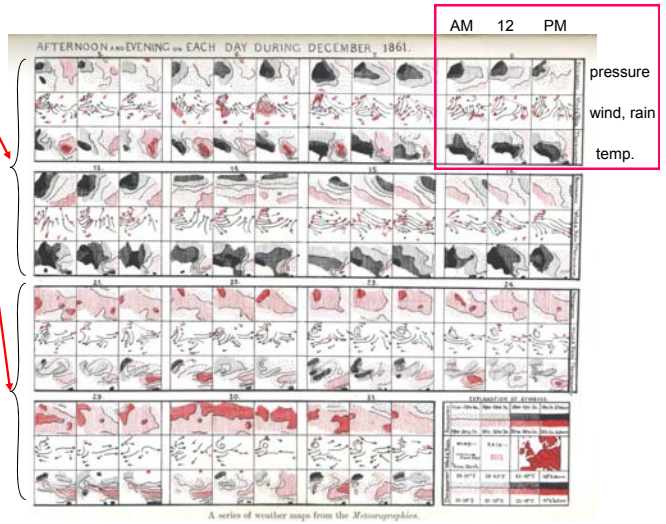


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The large picture → Insight

Pattern:
 Low pressure (black) in early Dec. → CCW wind
 High pressure (red) in late Dec. → CW wind

Graphic: 3x3x31 grid, mapping {pressure, wind/rain, temperature} x {AM, 12, PM} x day {1:31}
 (try this with your software!)

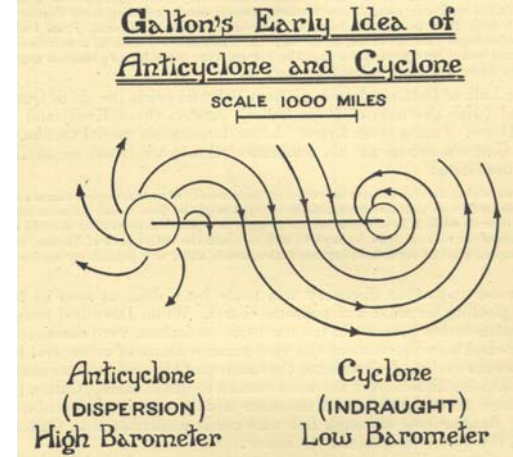


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Visual insight → Theory

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—“anti-cyclone”

Theory:
 • Explained by Dove’s ‘Law of Gyration’
 • Prediction: reversed pattern (CW/CCW) in southern hemisphere – confirmed!

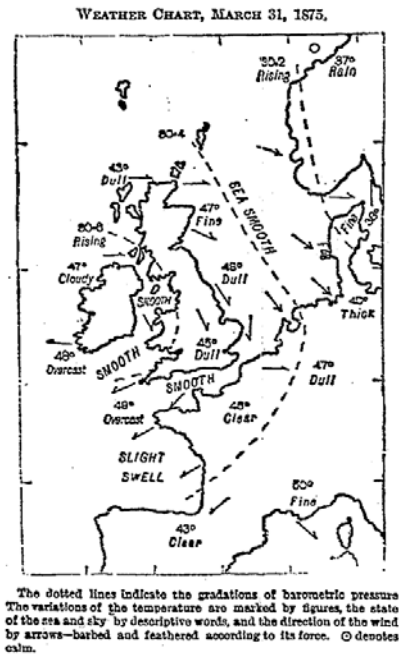


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Theory → Practice

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)



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Conclusions

- In the history of science, visualization often:
 - ...proved crucial in discovery
 - ... required simplification and summary of “big” data
 - ... provided simple explanations for complex phenomena
- Notable examples in this history illustrate ...
 - Importance of **visual thinking**
 - **Interocularity**: message hits you between the eyes
 - Role of **smoothing** in seeing patterns, gaining insight
 - Necessity to **escape flatland**:
 - Progress in display of increasingly rich and complex data
 - Data → Visual abstraction → Theory → Practice

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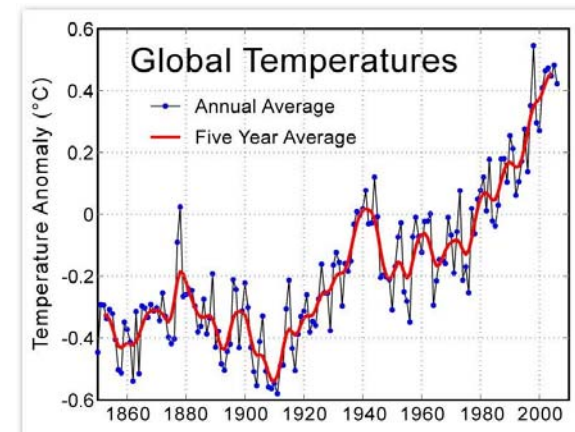
Looking forward: Big data and big questions

- What are the Big Questions for today?
- Global warming & climate change
 - Monitoring and predicting arctic ice, sea level rise
 - Extreme weather events
- Disease outbreaks
 - Ebola, avian flu
- Threat assessment, terrorism
- Genomics

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How can graphics help?

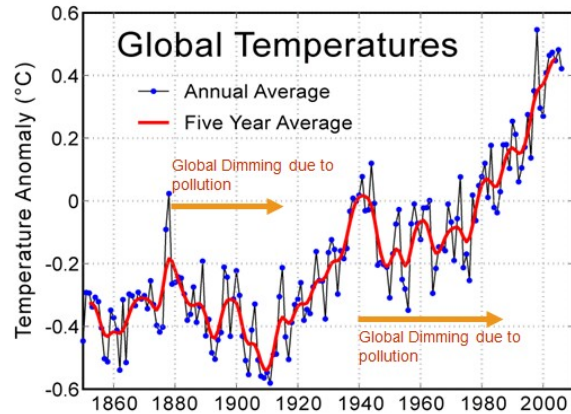
- Plot the data and smooth



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How can graphics help?

- Note departures from general pattern



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Interocularity

- Make the message hit you between the eyes



Source: <http://www.politically-incorrect-humor.com/2010/03/positive-proof-of-global-warming/>

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Validation?

- Test predictions from a fitted model

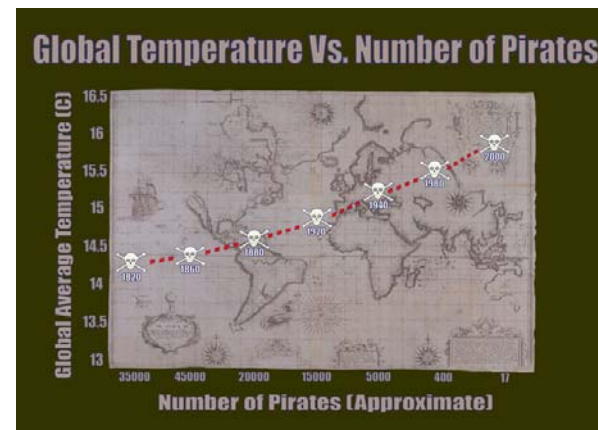


Source: <http://www.politically-incorrect-humor.com/2010/03/positive-proof-of-global-warming/>

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Causal & visual explanation

- Lack of pirates causes global warming!



Source: <http://www.forbes.com/sites/erikaandersen/2012/03/23/true-fact-the-lack-of-pirates-is-causing-global-warming/>

Theory → practice:

To stop global warming, become a pirate!

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