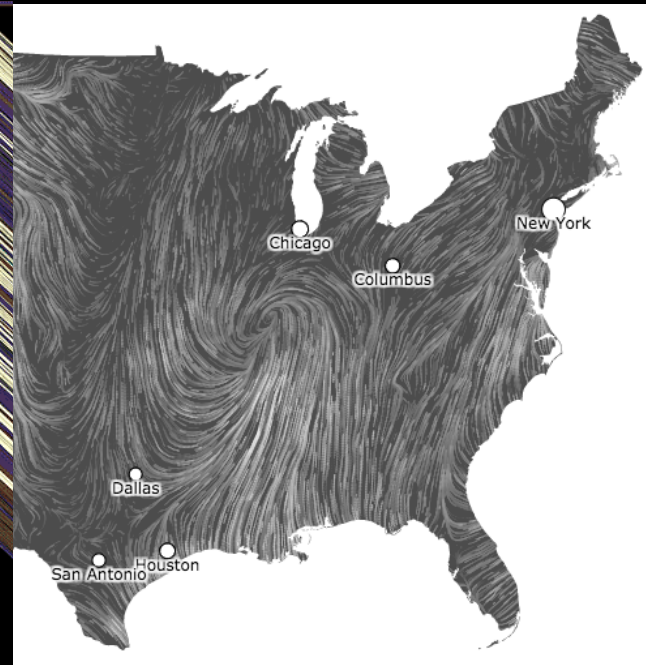
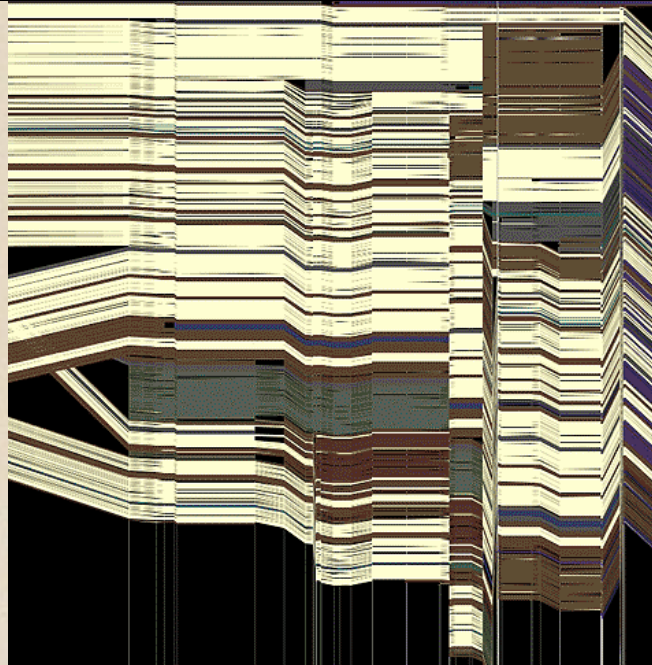
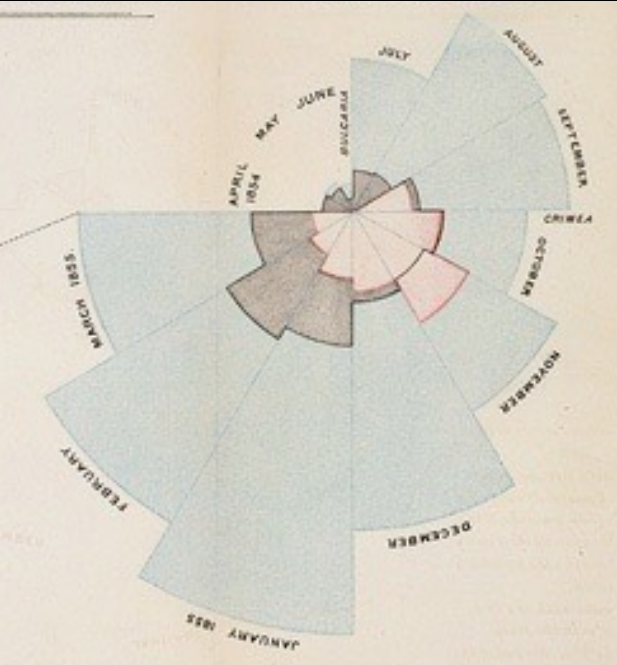


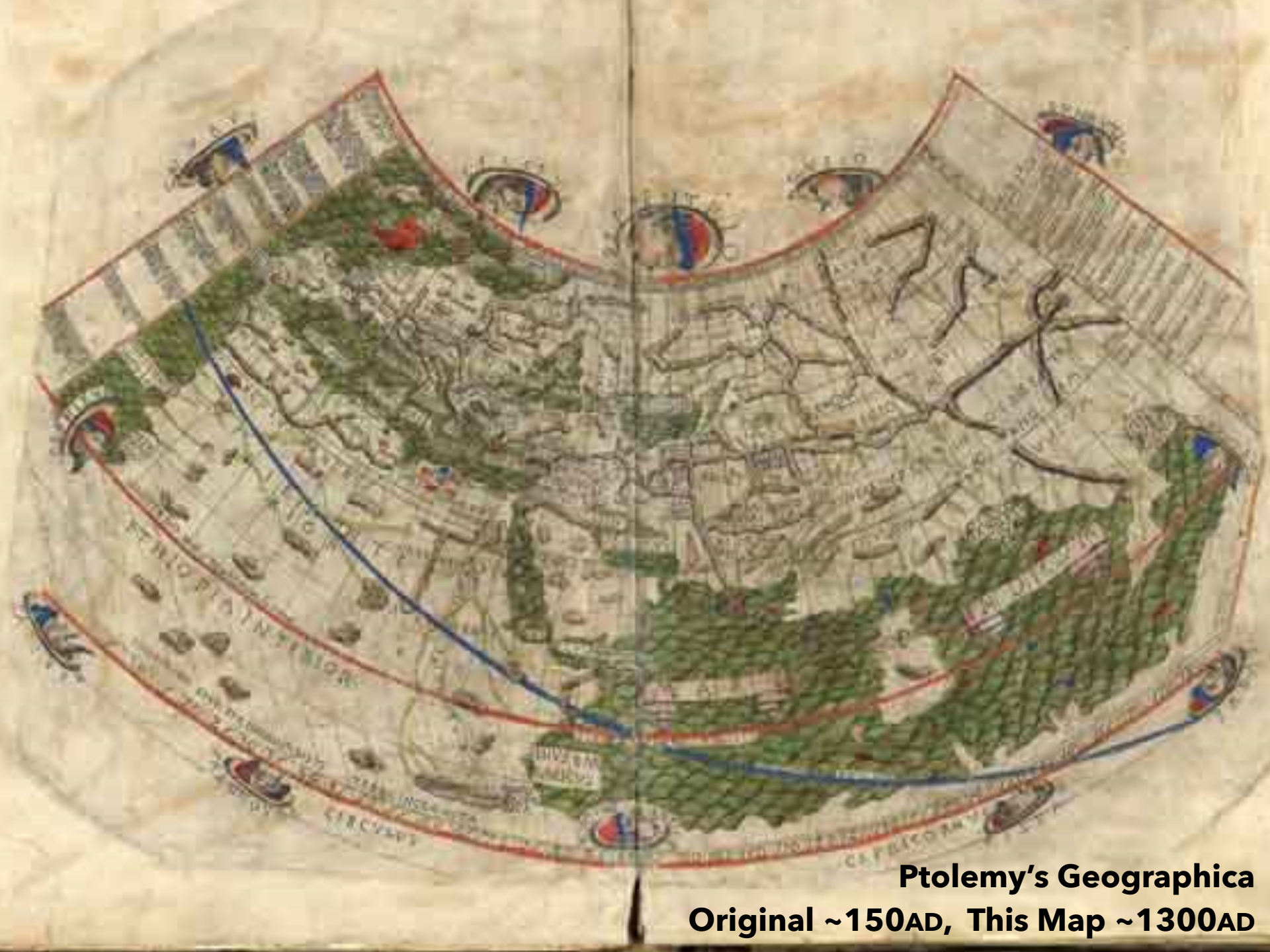
CSE 442 - Data Visualization

# Mapping & Cartography



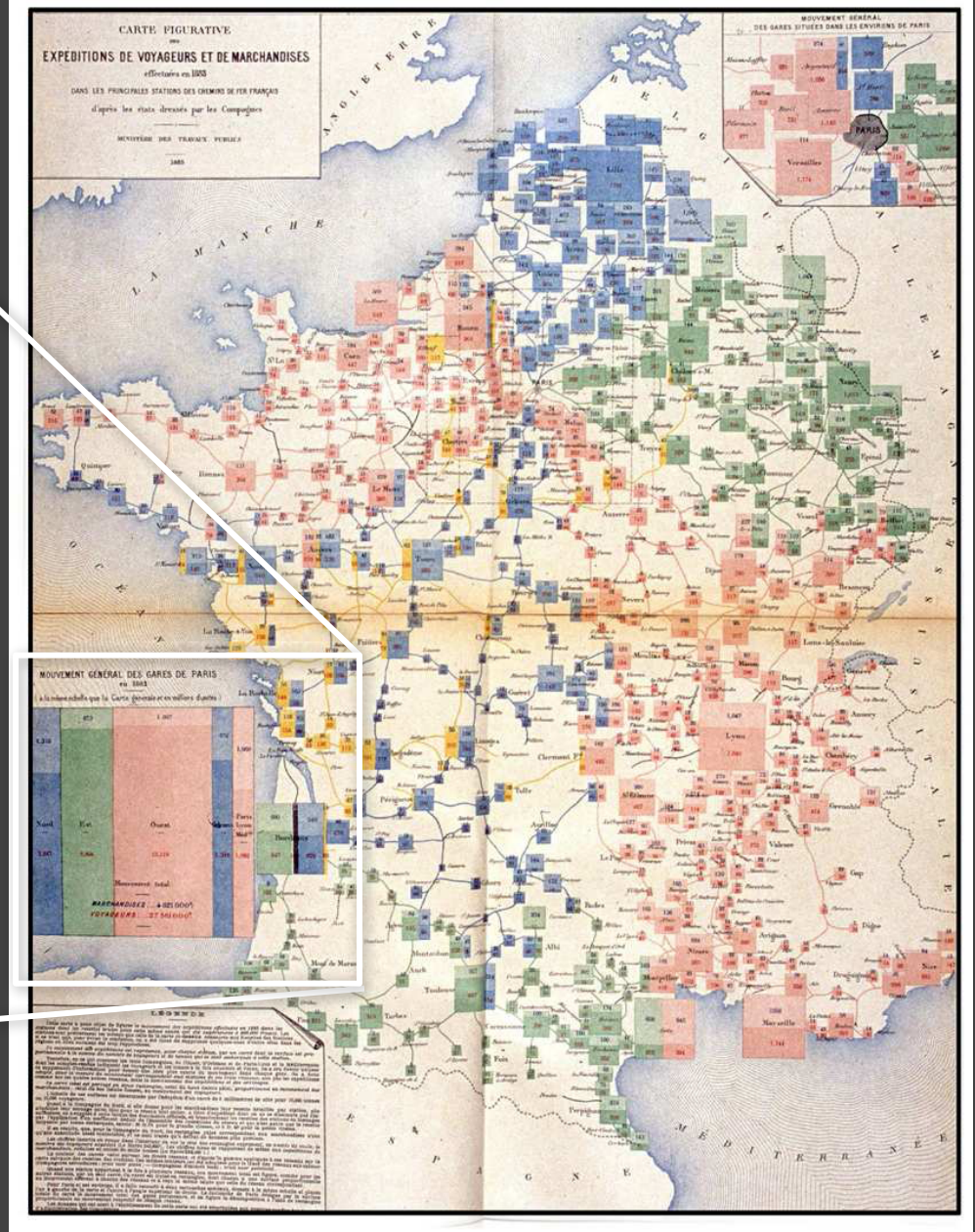
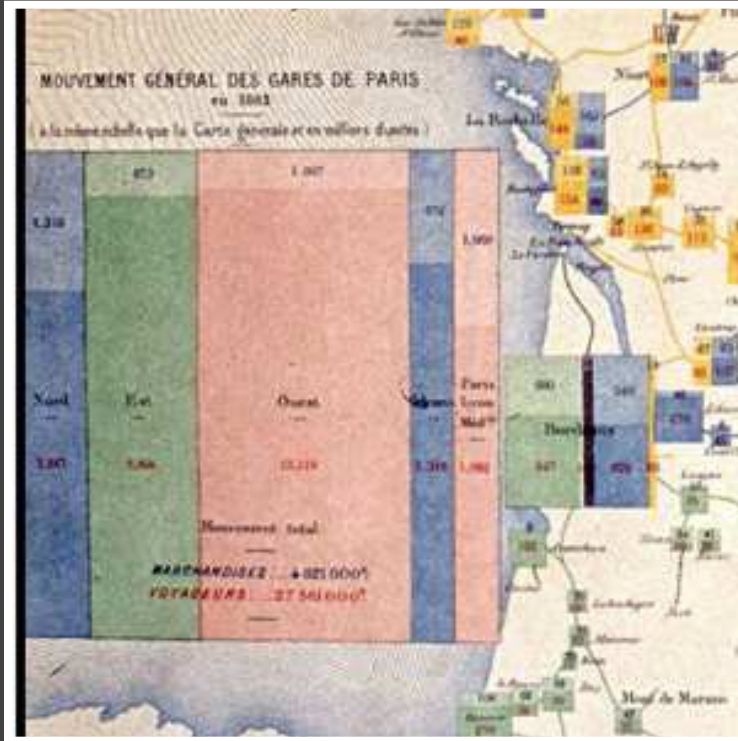
Jeffrey Heer University of Washington

(with significant material from Michal Migurski)



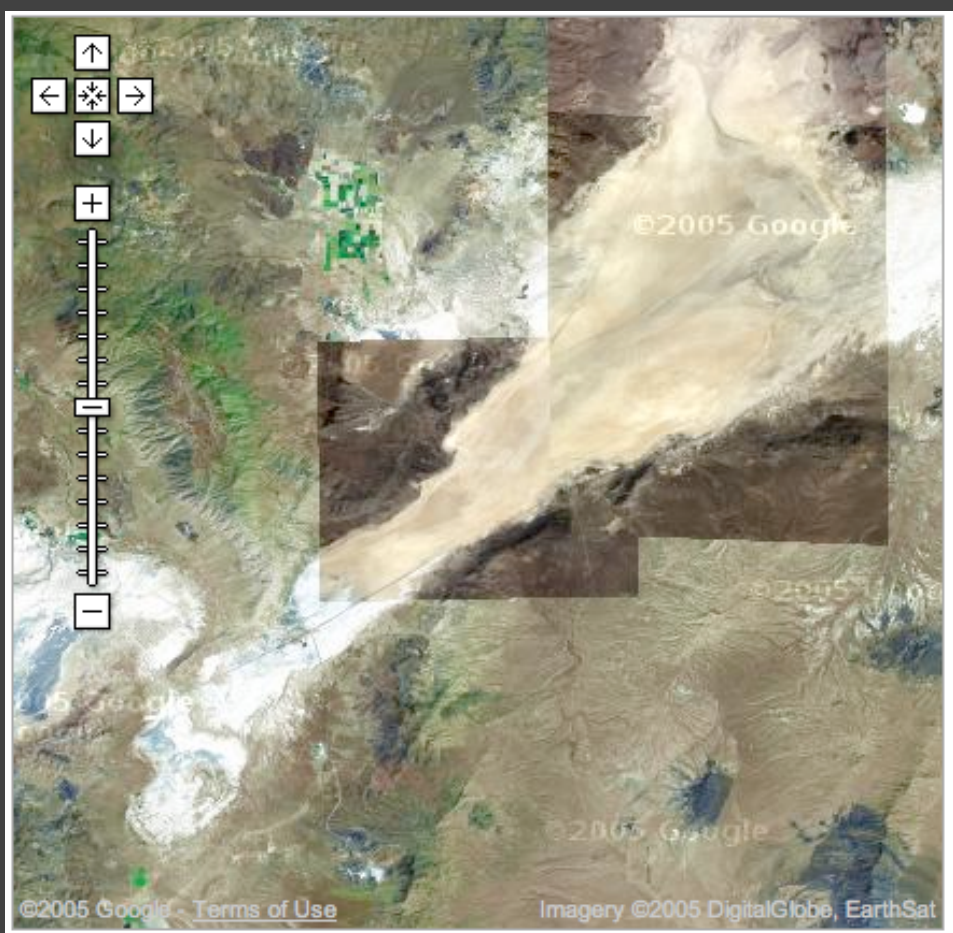
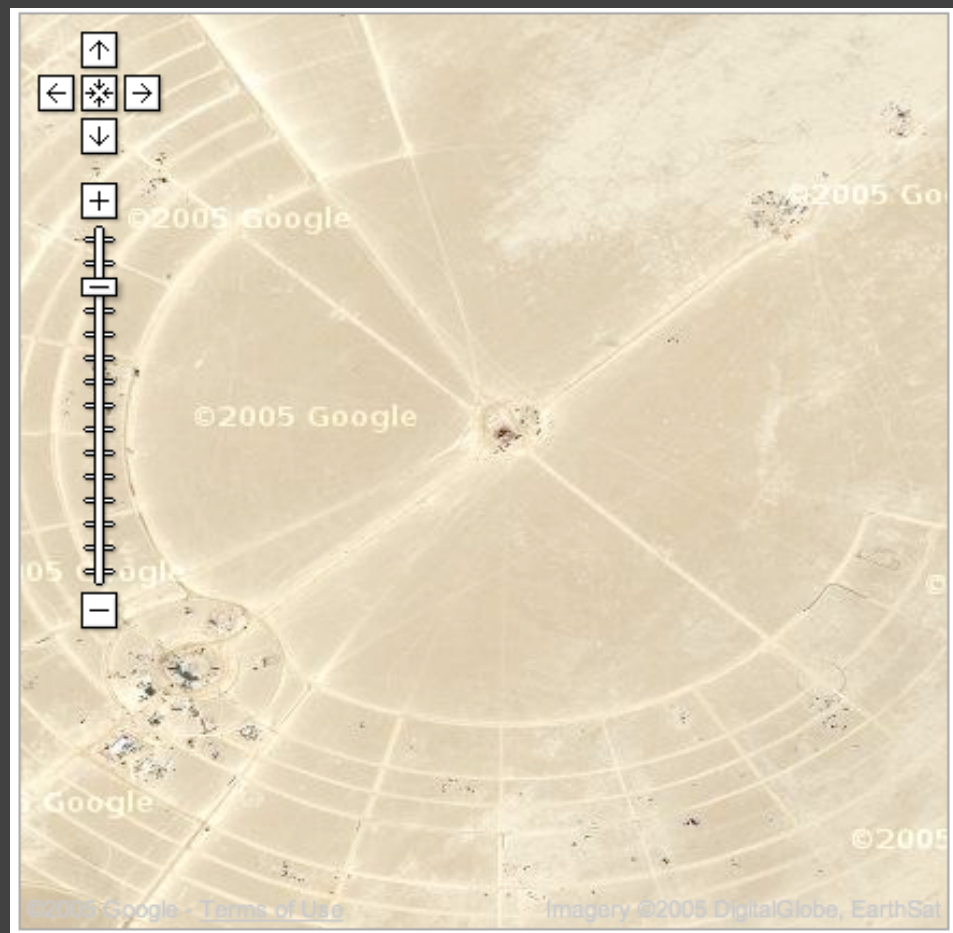
**Ptolemy's Geographica**  
**Original ~150AD, This Map ~1300AD**





Rail Passengers and Freight from Paris 1884





Google Maps 2005



# Casualties of War

FACES | ANALYSIS | **THEIR STORIES**

E-MAIL | FEEDBACK

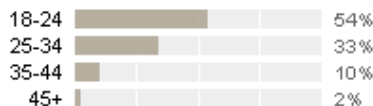
Use the slider below to investigate the demographics and military status of U.S. service members who died during the war in Iraq.

**MARCH 16, 2003** JULY 5, 2008 (277 WEEKS)

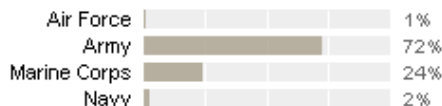
Show all | Initial invasion | First invasion of Falluja | Second invasion of Falluja | Since troop buildup began

4,097 deaths

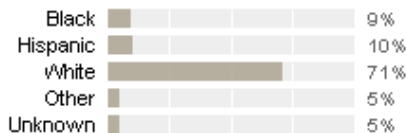
### Age



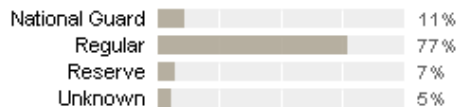
### Branch of Military



### Race



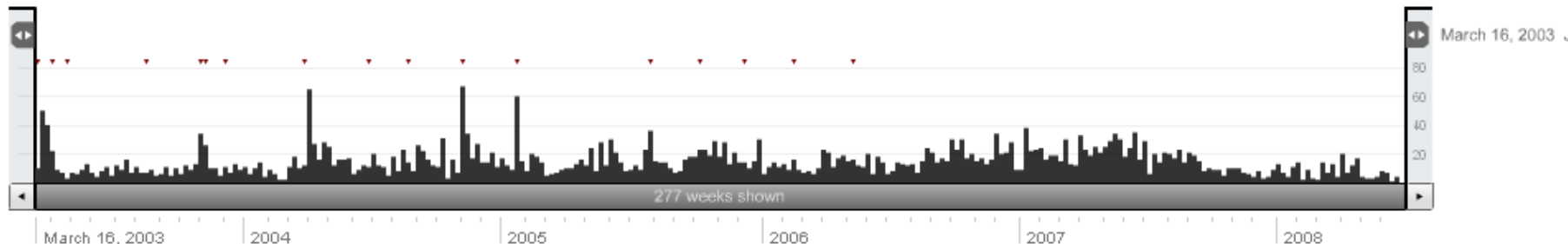
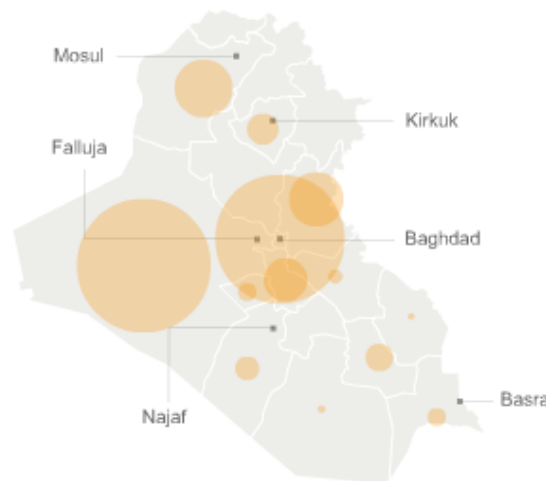
### Type of Duty



### Location of death

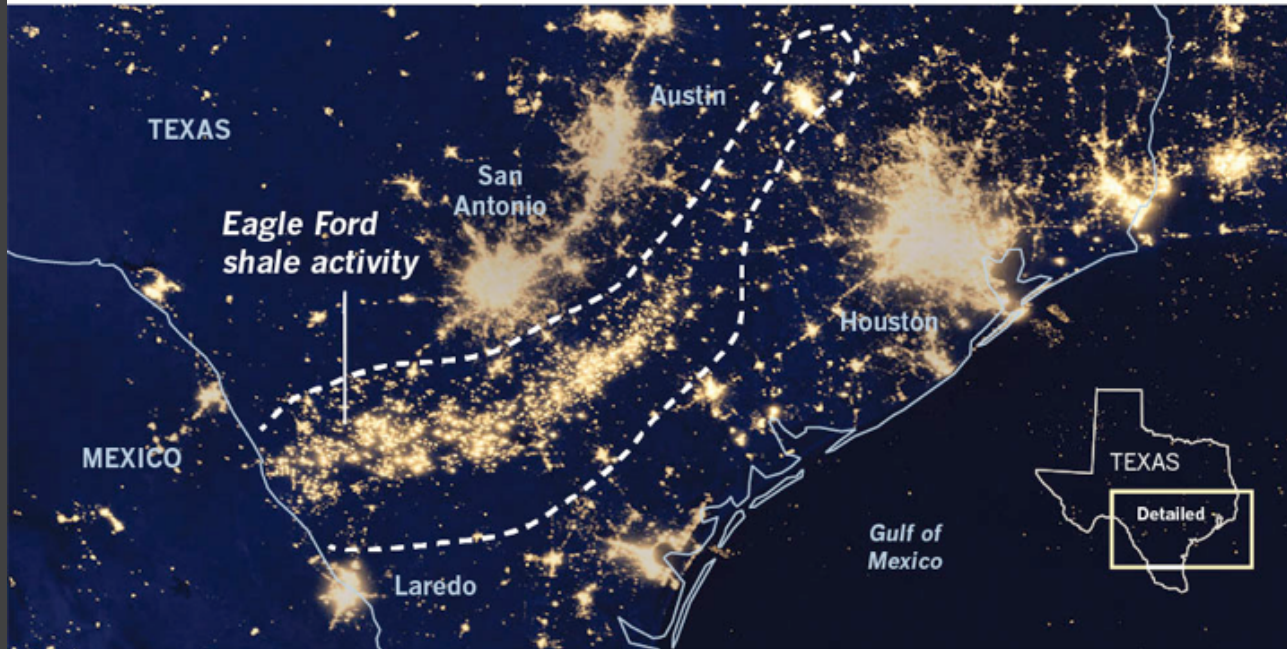
Circles sized according to percentage of deaths in each Iraqi province.

Show home



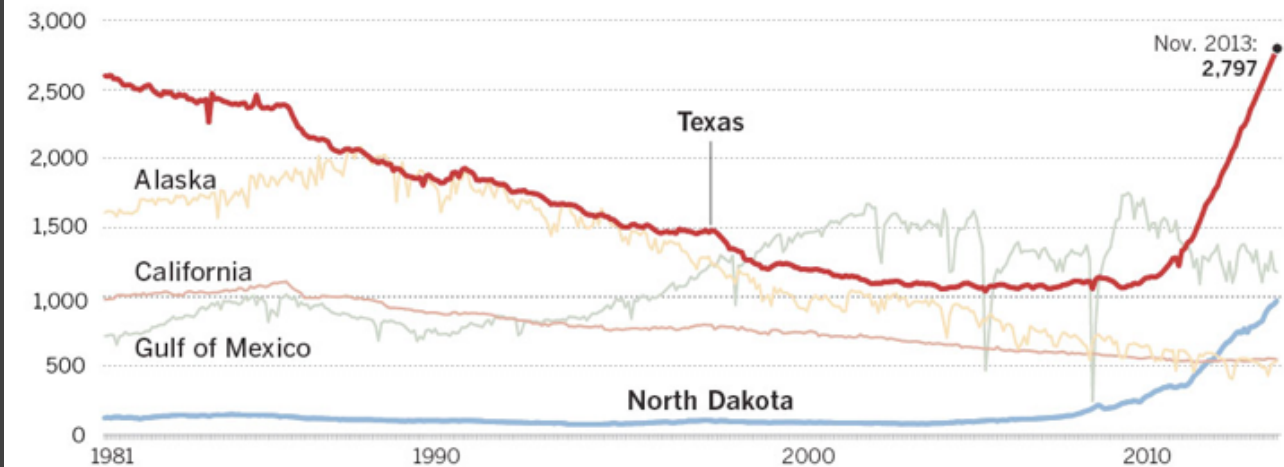
# Texas oil boom is visible from space

Lighting and natural gas flares from drilling on the 400-mile-long Eagle Ford shale formation can be seen from space in this image.



The new formation has helped make Texas the No. 1 oil-producing state in the nation.

**Oil production from different U.S. regions** (in thousands of barrels per day)



Source: Energy Information Administration

MATT MOODY Los Angeles Times

LA Times  
2014



### Ramadi: The Government Provides an Opening for ISIS ISIS Control

Tensions between this city's residents, who are mostly Sunni, and the central government had been brewing here for at least a year. Then in December, Iraq's prime minister, Nuri Kamal al-Maliki, ordered security forces to dismantle a protest camp — an outlet for disenchanting Sunnis angered at their treatment by the Shiite-dominated government. The action ignited days of violence and created the opening ISIS needed to seize parts of the city, the provincial capital.

Lake Tharthar

### Falluja: A Symbolic Fall ISIS Control

Just days after the raid on the camp in Ramadi, ISIS fighters destroyed the Police Headquarters and mayor's office here, planted their flag on government buildings and decreed the city to be theirs. Ten years earlier, American forces had captured this city from Qaeda-style insurgents at a considerable cost of American lives.

Lake Habbaniya

Balad



17 MILES TO BAGHDAD

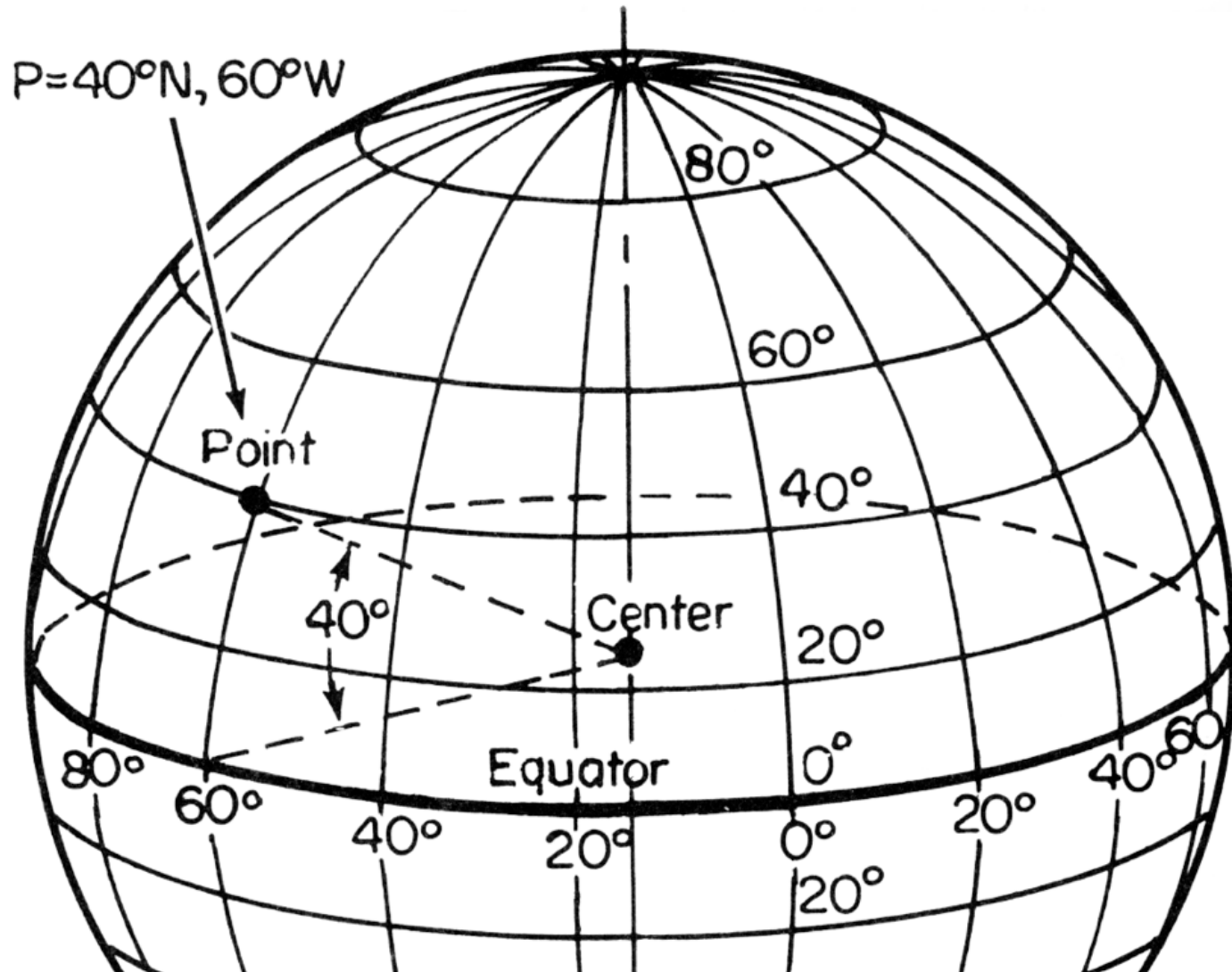
# Cartography

The Making of Maps



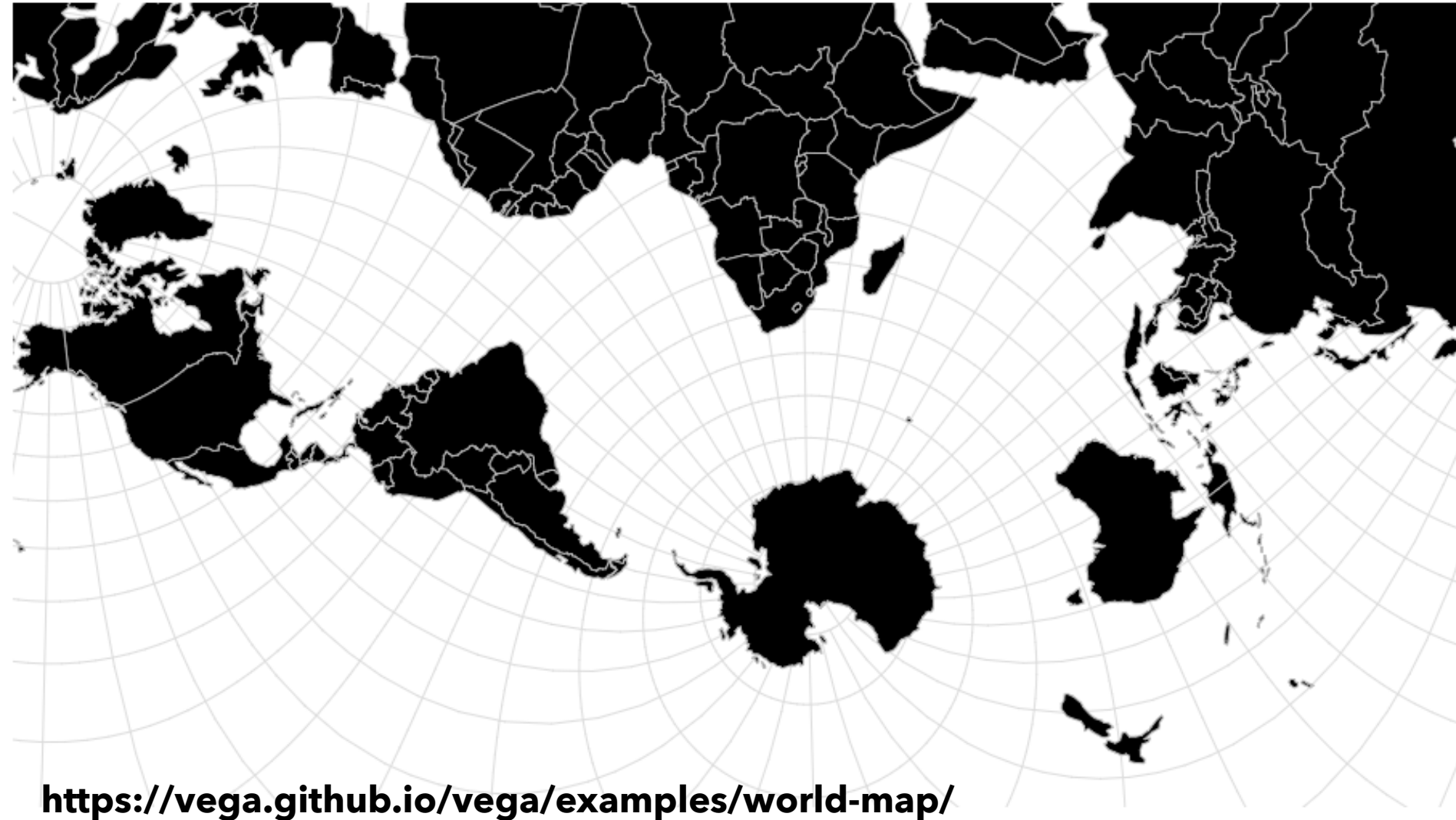
# Projections

# Latitude, Longitude

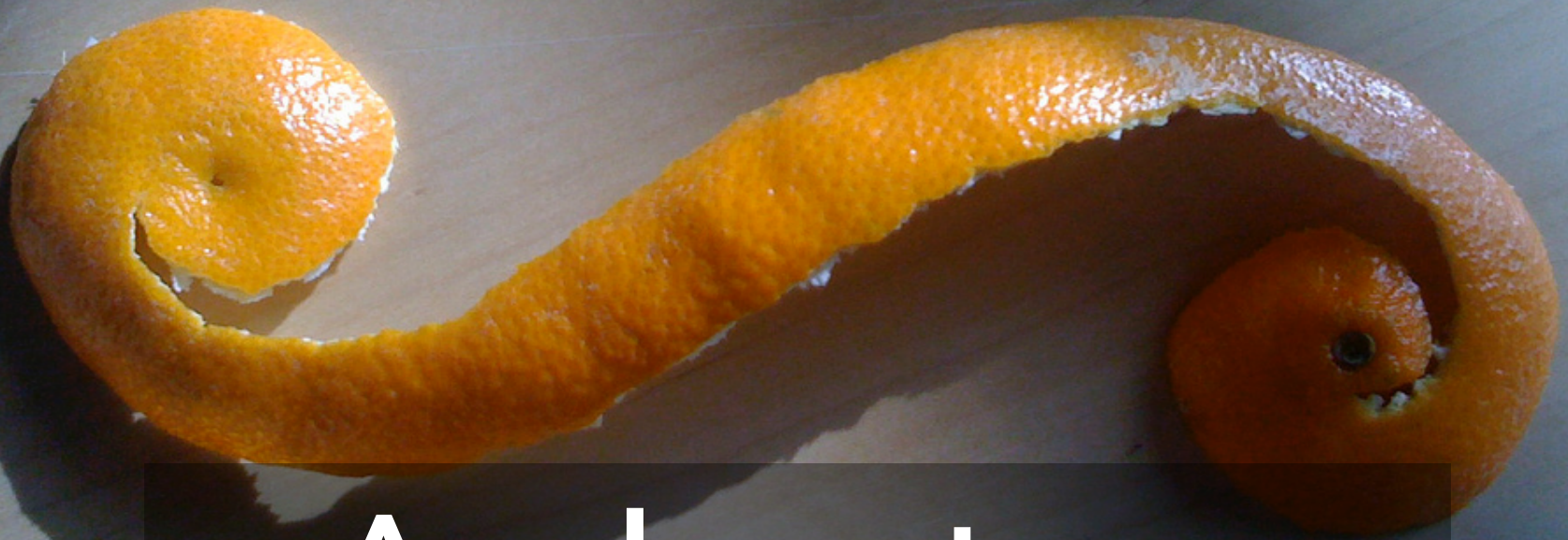




# Exploring Projections...



<https://vega.github.io/vega/examples/world-map/>



**A sphere tears  
when you flatten it**



**Three example  
ways to categorize  
projections...**

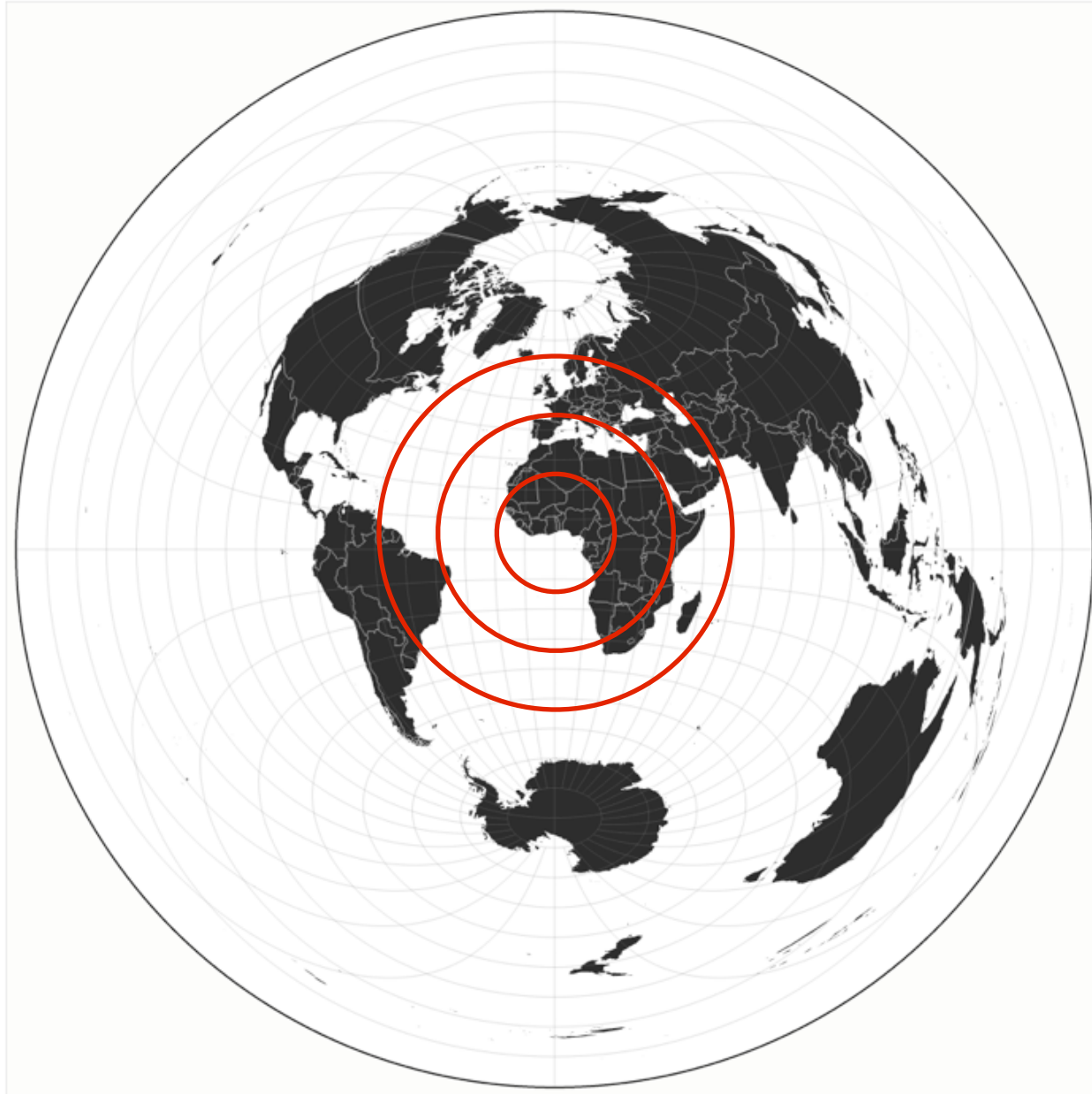


# Azimuthal

Preserve direction / distance from center



# Azimuthal Equidistant

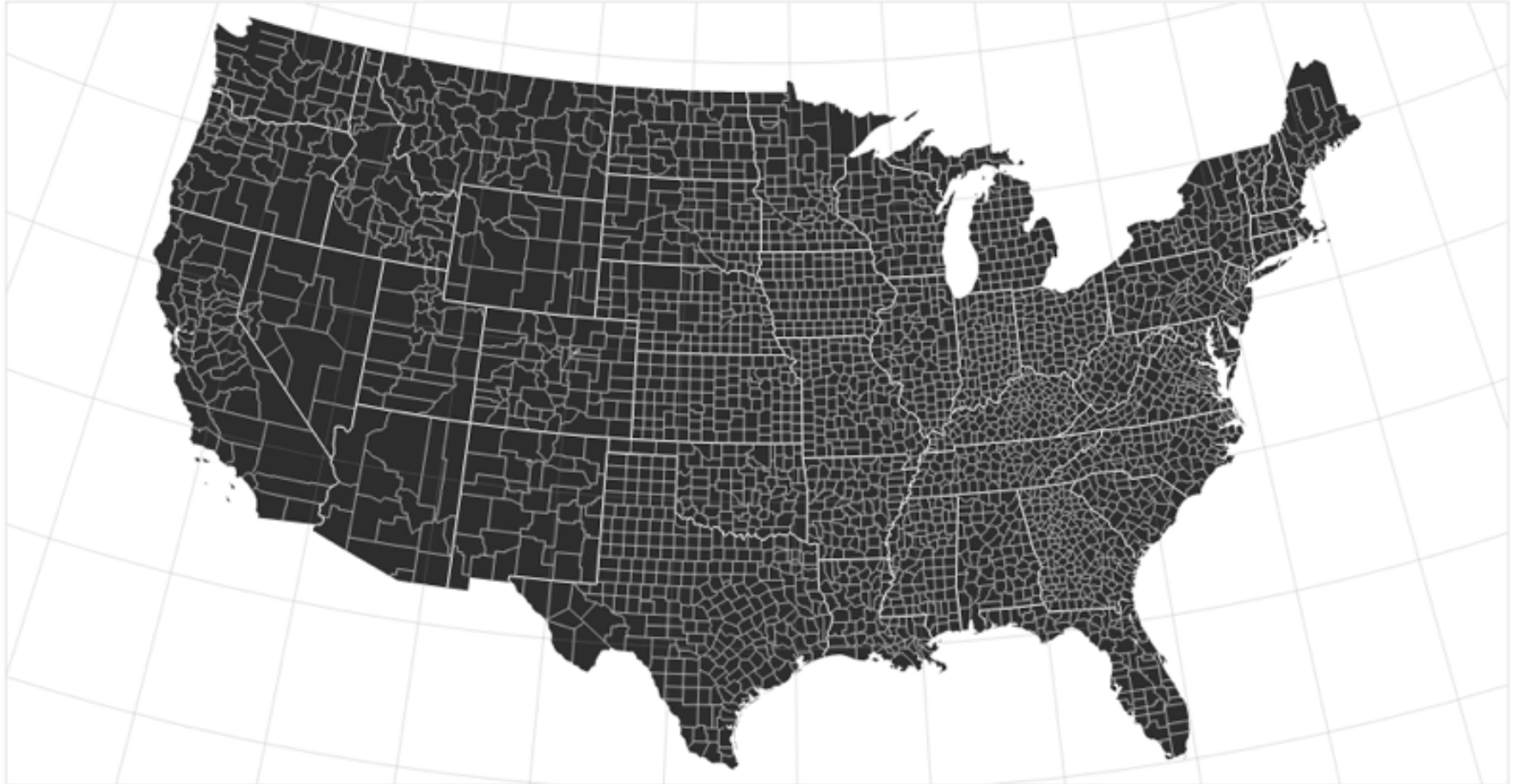


A world map with a dark gray background. Landmasses are outlined in black. A large area in the North Pacific, including Alaska, the Yukon, and parts of Canada, is highlighted in a light yellow color. A semi-transparent dark gray rectangular box is overlaid on the map, containing the text 'Equal-Area' and 'Preserve area'.

# Equal-Area

Preserve area

# Albers Equal-Area Conic



The [Albers equal-area conic projection](#) is available as [d3.geo.albers](#). See also the [interactive version](#).

[Open in a new window.](#)



A world map with a yellow background and black outlines for continents and country borders. A semi-transparent grey rectangular box is centered over the map, containing text. The text is white and includes a large title and a descriptive subtitle.

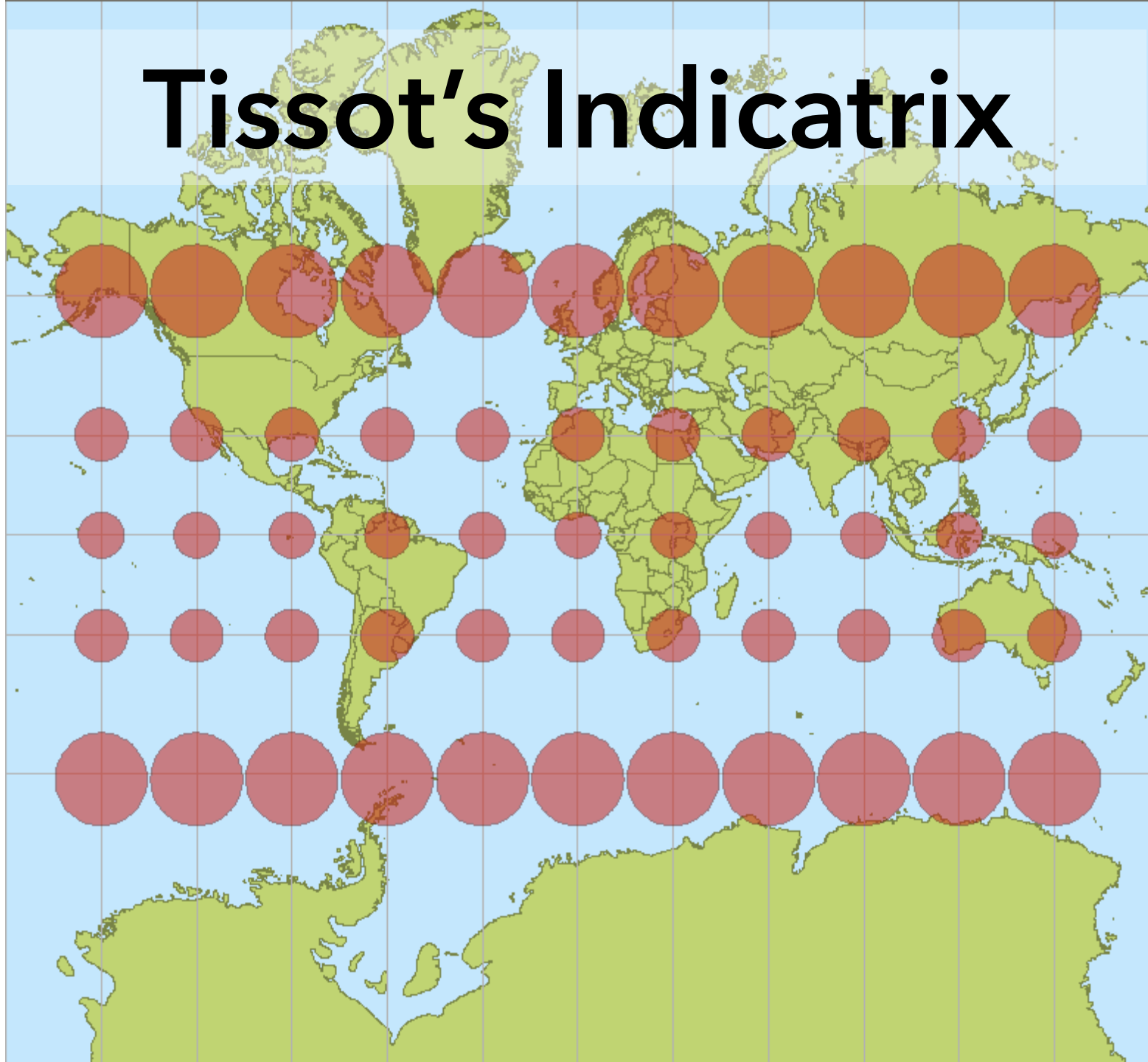
# Conformal

Preserve local angles ("shape")

# Spherical Mercator



# Tissot's Indicatrix







**Spherical Mercator  
is ubiquitous on  
the web—why?**

# Web Mercator

$$x = \frac{128}{\pi} 2^{\text{zoom level}} (\lambda + \pi) \text{ pixels}$$

$$y = \frac{128}{\pi} 2^{\text{zoom level}} \left( \pi - \ln \left[ \tan \left( \frac{\pi}{4} + \frac{\varphi}{2} \right) \right] \right) \text{ pixels}$$

World coordinates adjusted to map to 256 x 256 pixels.

**Latitude cut-offs** at 85.051129 degrees: the exact point at which the projection frames the world in a square.

# The Earth as a Square





# Peirce Quincuncial



The [Peirce quincuncial projection](#) is implemented as `d3.geo.peirceQuincuncial` in the [geo.projection D3 plugin](#). It is derived from the [Guyou projection](#).

[Open in a new window.](#)

A map of the Americas, including North and South America, is shown in yellow. A vertical orange rectangular box highlights the western coast of North America, from the Canadian border down to the Mexican border. The text "Projections usually have a home" is overlaid in white on a dark grey background at the bottom of the map.

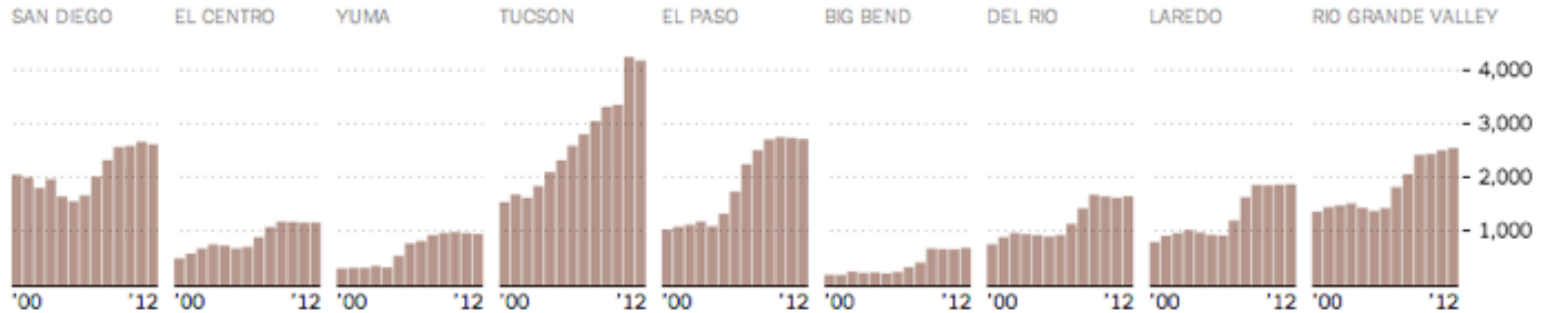
Projections usually  
have a home

# Increased Border Enforcement, With Varying Results



**There are now more agents along the 1,954 mile-long border than ever before...**

Border agents per sector.



Satellite Projection, NY Times



WHAT YOUR FAVORITE  
**MAP PROJECTION**  
SAYS ABOUT YOU

MERCATOR



YOU'RE NOT REALLY INTO MAPS.

VAN DER GRINTEN



YOU'RE NOT A COMPLICATED PERSON. YOU LOVE THE MERCATOR PROJECTION; YOU JUST WISH IT WEREN'T SQUARE. THE EARTH'S NOT A SQUARE, IT'S A CIRCLE. YOU LIKE CIRCLES. TODAY IS GONNA BE A GOOD DAY!

## PEIRCE QUINCUNCIAL



YOU THINK THAT WHEN WE LOOK AT A MAP, WHAT WE REALLY SEE IS OURSELVES. AFTER YOU FIRST SAW *INCEPTION*, YOU SAT SILENT IN THE THEATER FOR SIX HOURS. IT FREAKS YOU OUT TO REALIZE THAT EVERYONE AROUND YOU HAS A SKELETON INSIDE THEM. YOU *HAVE* REALLY LOOKED AT YOUR HANDS.



**There are interesting  
ways to tear spheres**

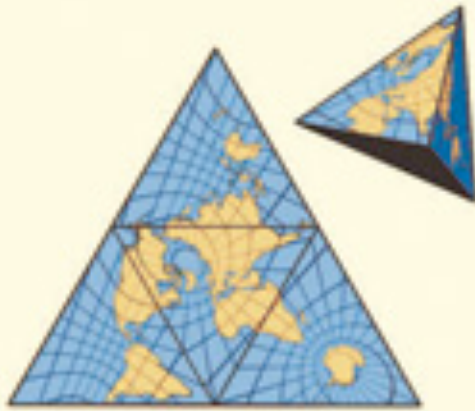


One notable interesting  
way to tear a sphere

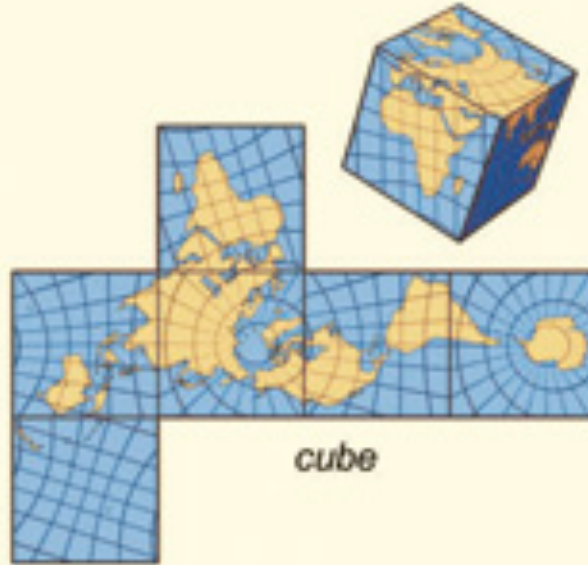




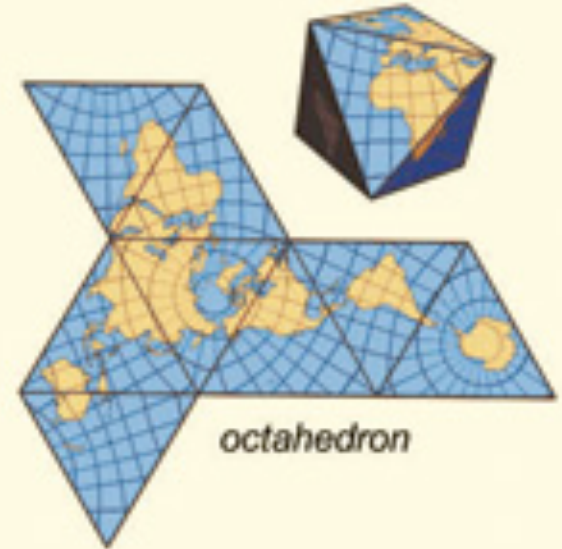




*tetrahedron*



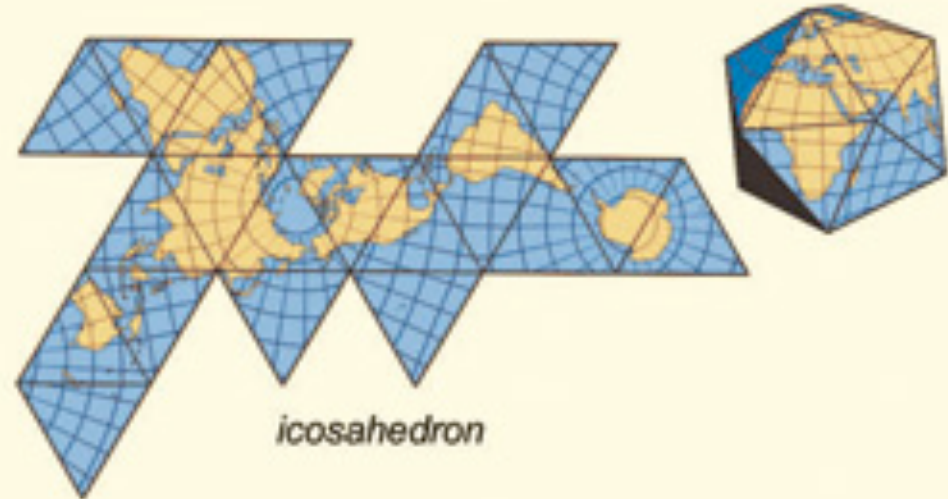
*cube*



*octahedron*



*dodecahedron*



*icosahedron*





## ADAPTIVE COMPOSITE MAP PROJECTIONS

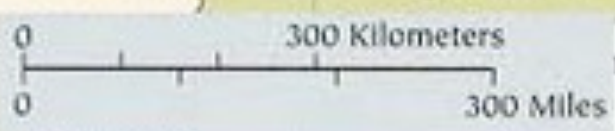
---

**Scale**



**This is not "scale"**

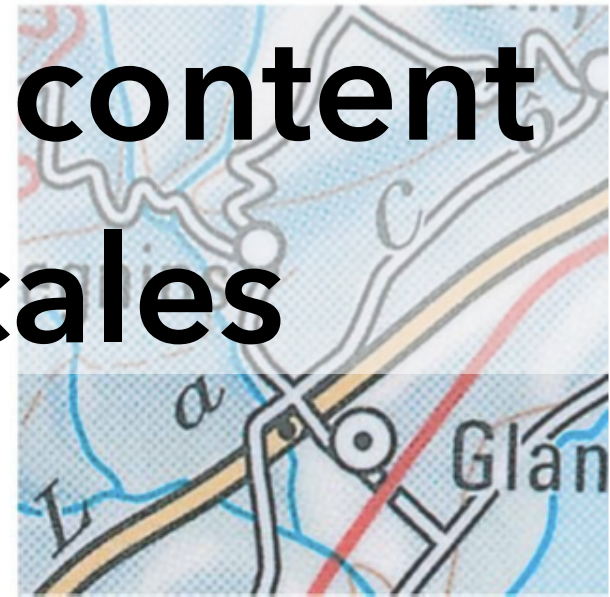
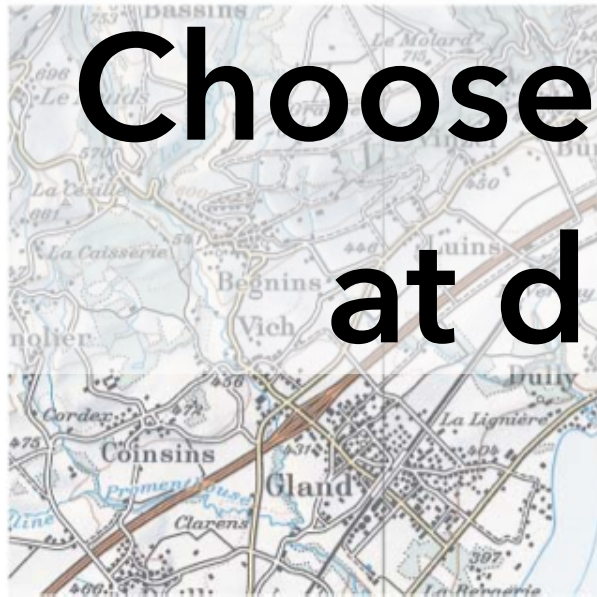
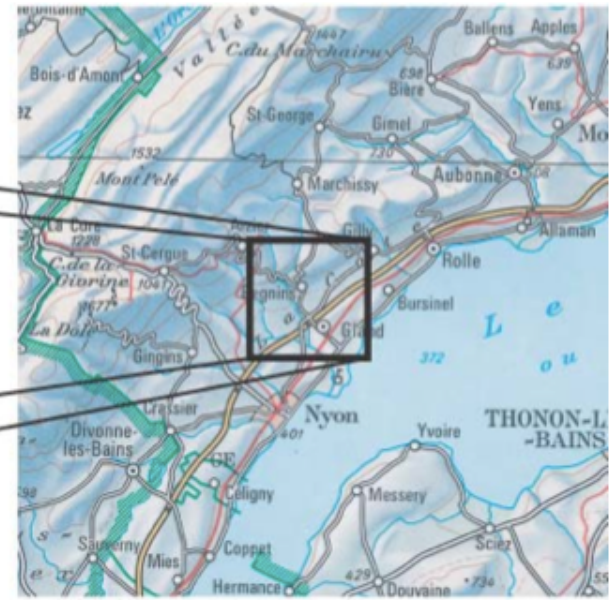
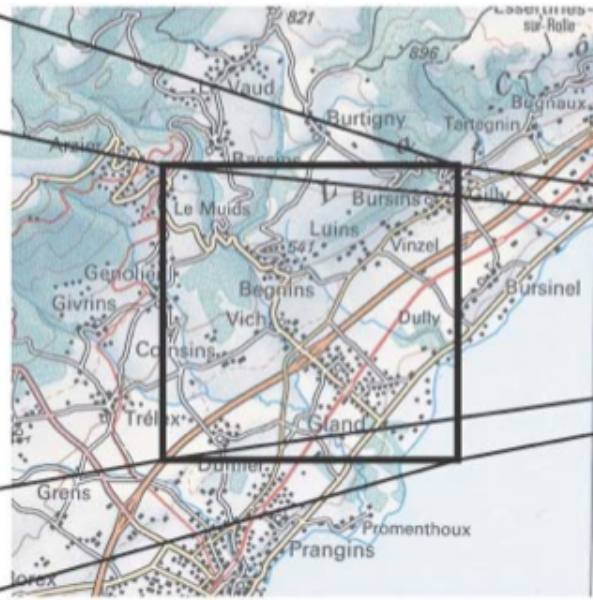
*Texas-Europe Size Comparison*



# Scale is an idea imported from print



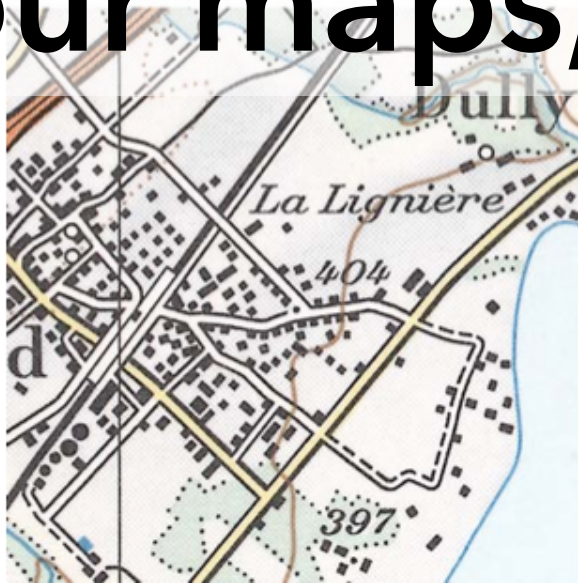




**Choose the right content  
at different scales**



Four maps, same area



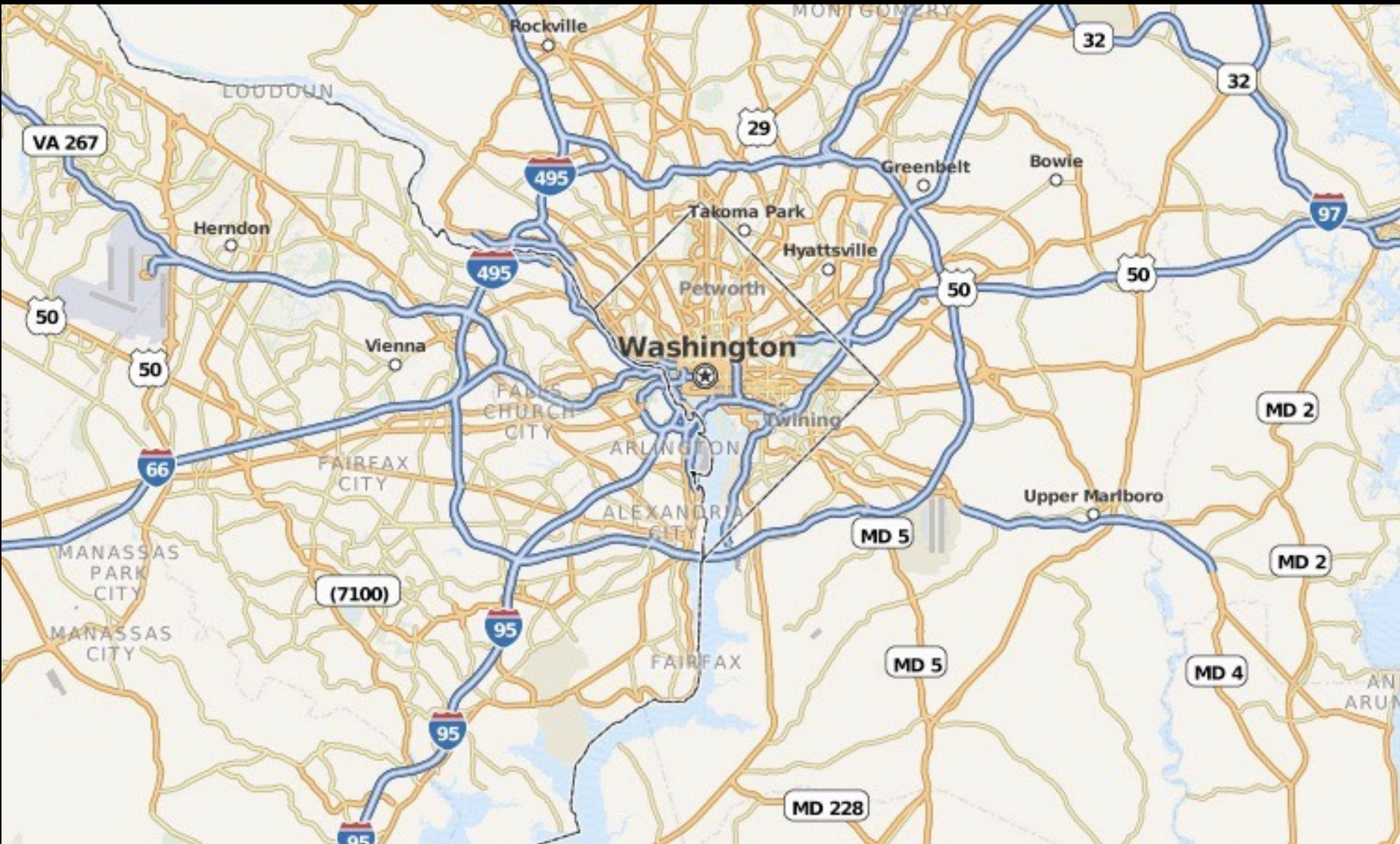
# What shows at different scales?



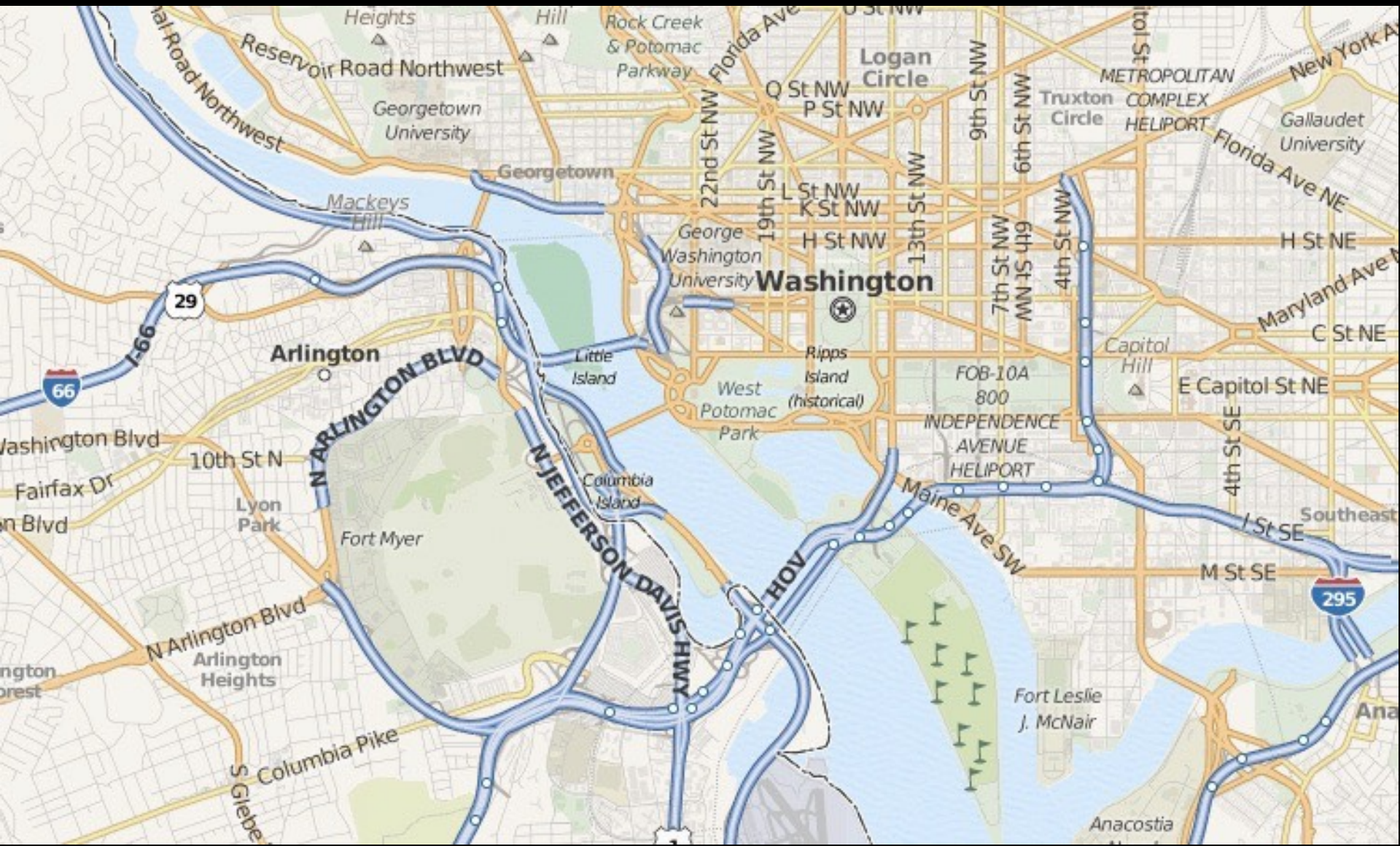




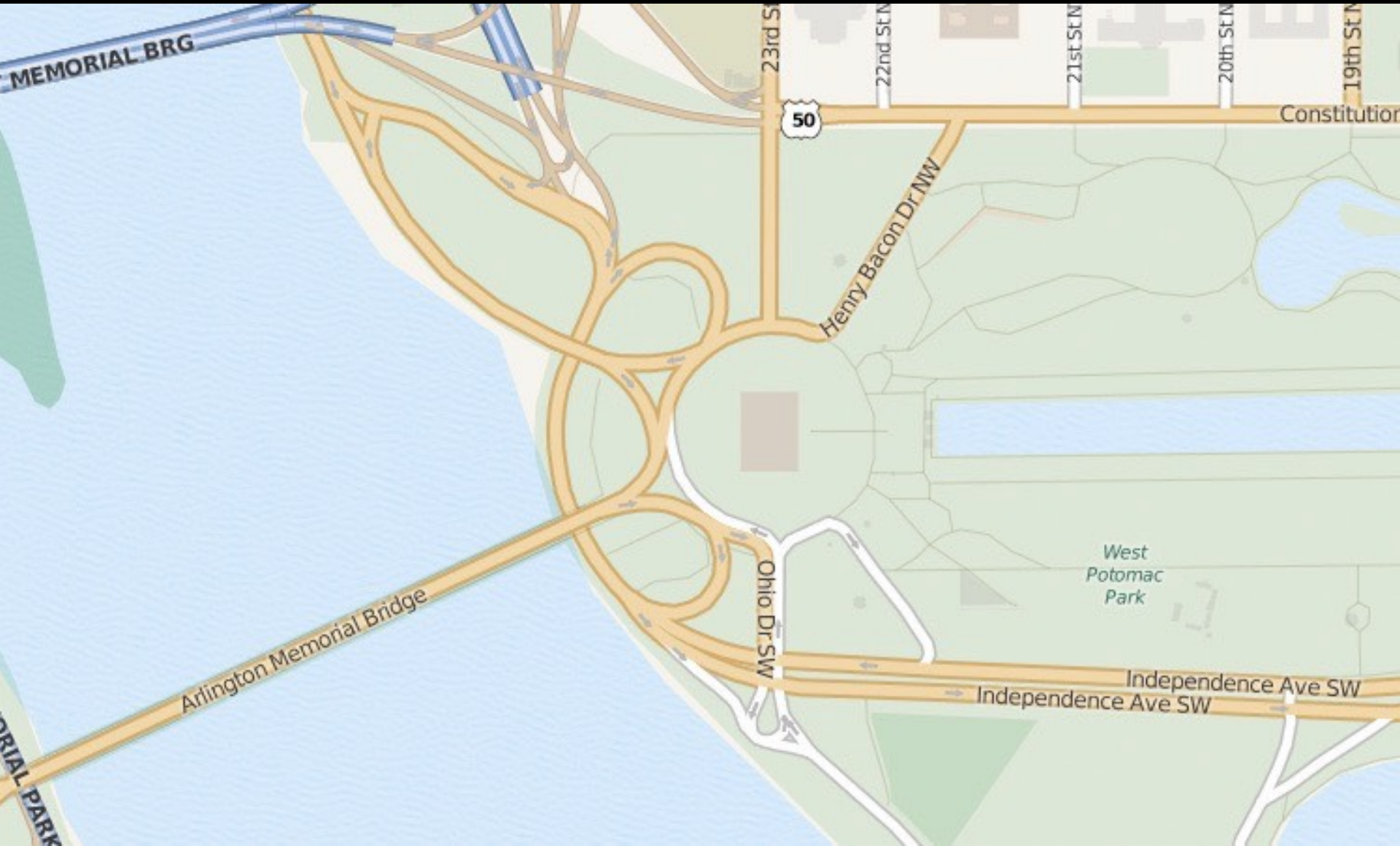












MEMORIAL BRG

50

Constitution

Henry Bacon Dr NW

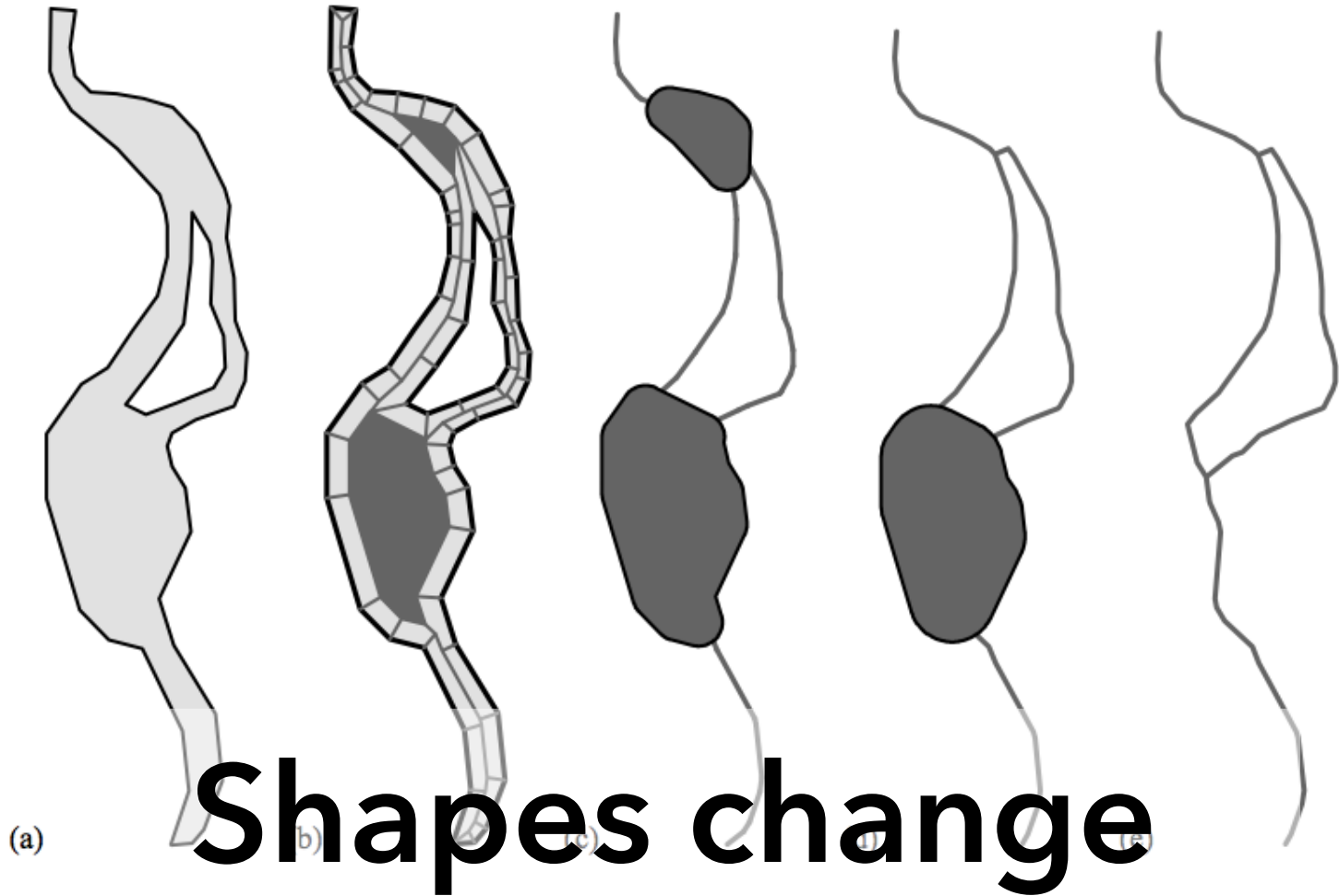
Arlington Memorial Bridge

Ohio Dr SW

West Potomac Park

Independence Ave SW

RIAL PARK



# Shapes change

Figure 11. Fragmentation of a river into polygons and lines with different thresholds leading to different results (c, d, e).

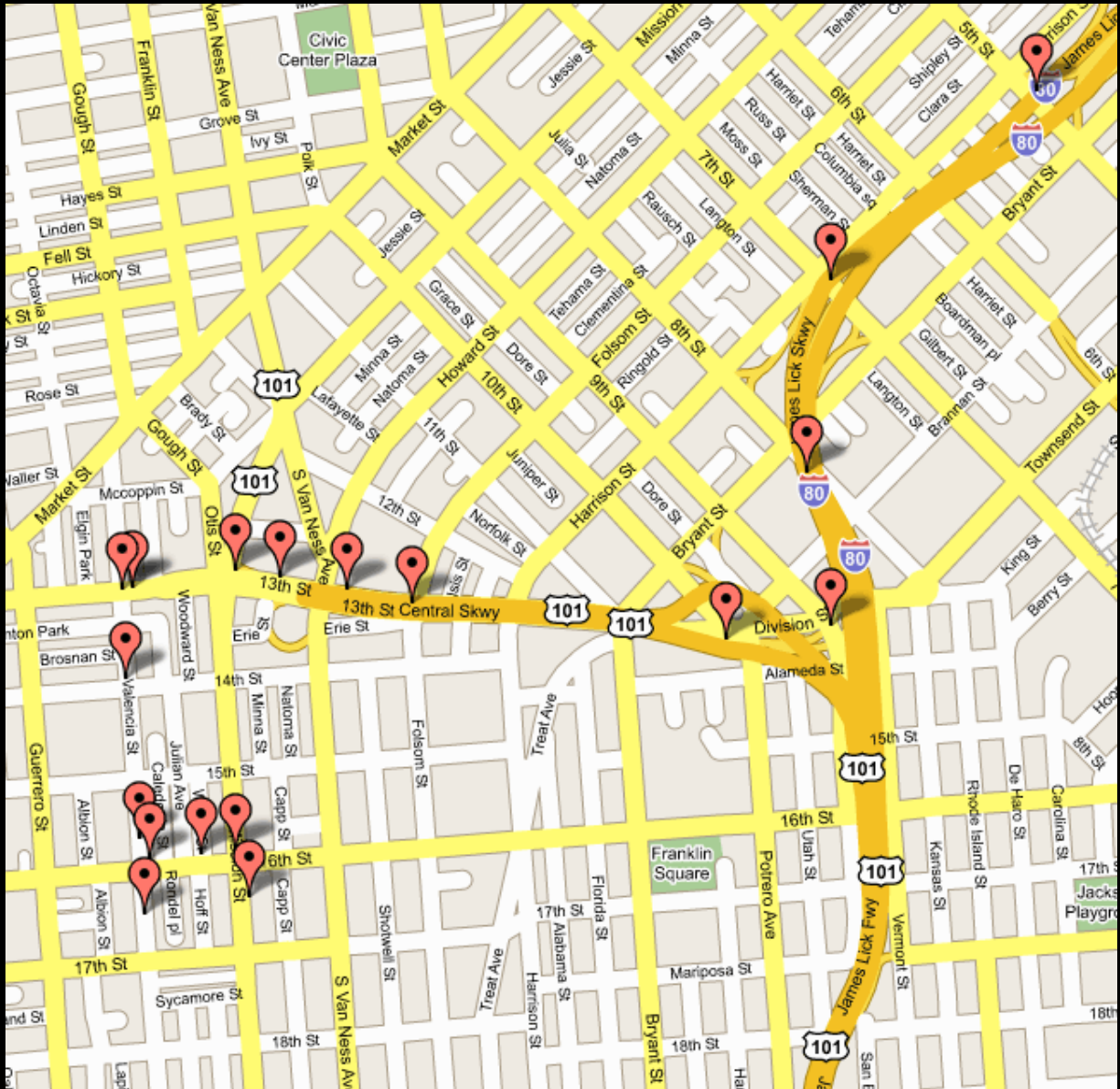
# at different scales



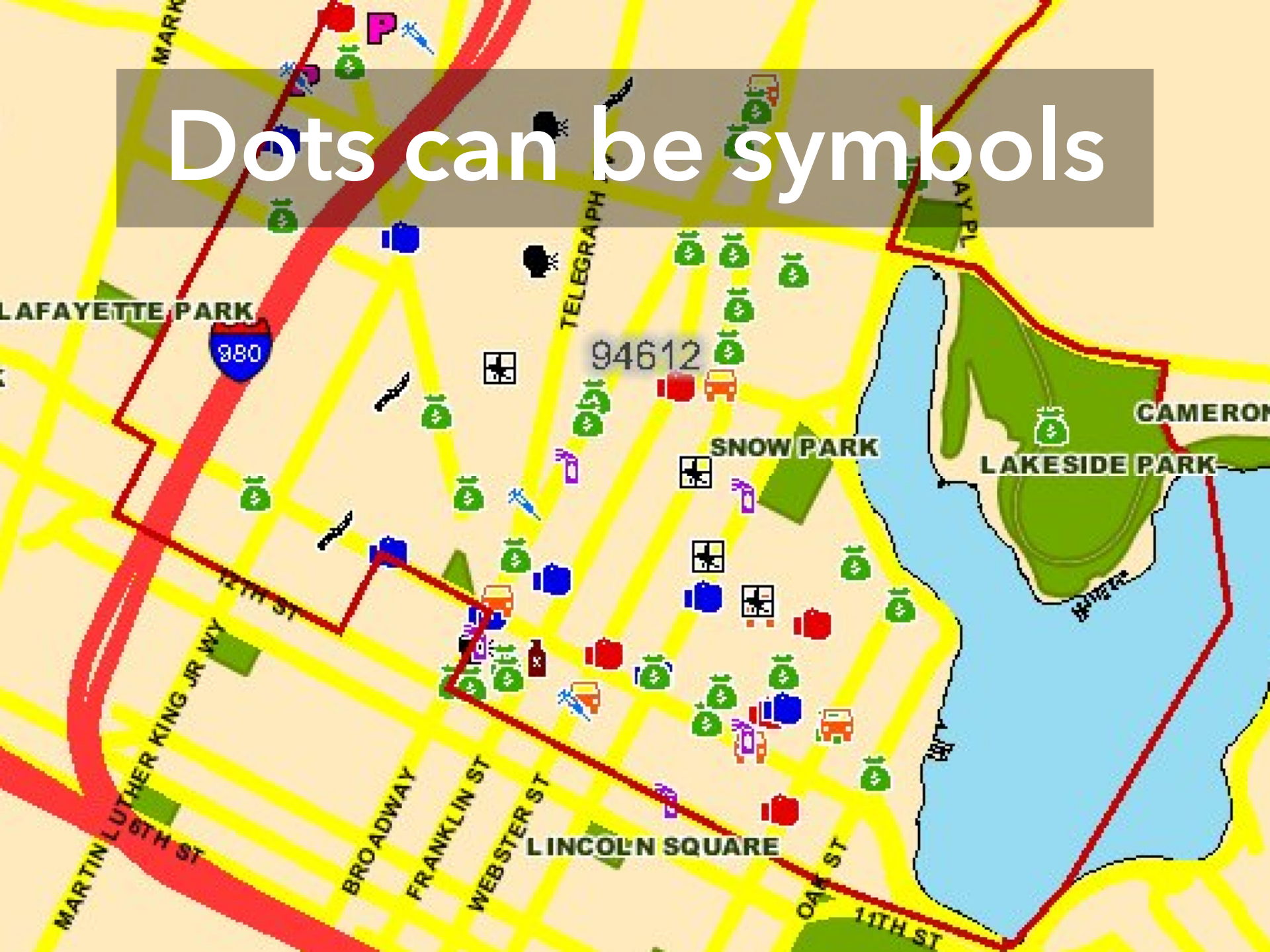
# Mapping

Visualizing Geospatial Data

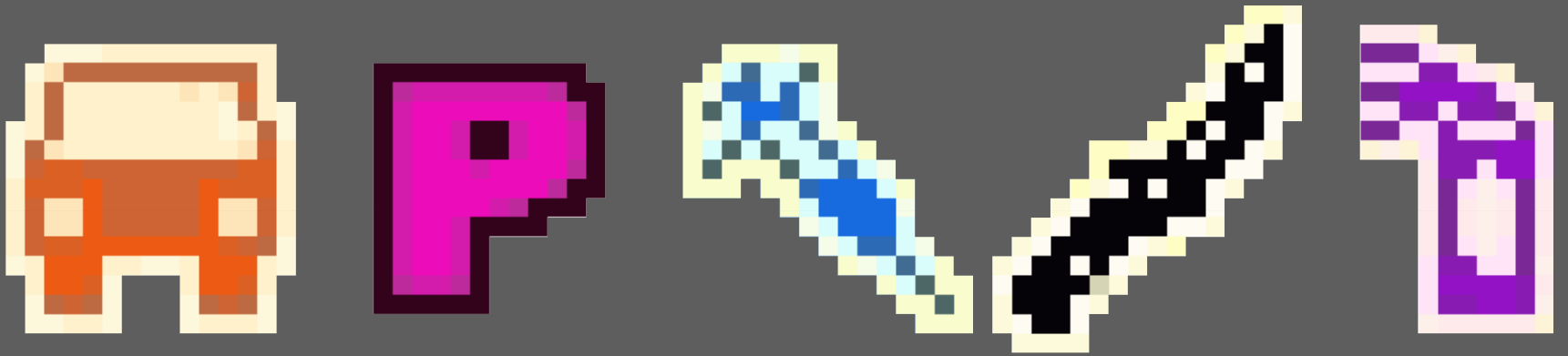
# Symbol Maps



# Dots can be symbols







Guess the crime

# Dots can can be good symbols

CRIME TYPE	Show All   Hide All
AA	Aggravated Assault
Mu	Murder
Ro	Robbery
SA	Simple Assault
DP	Disturbing the Peace
Na	Narcotics
Al	Alcohol
Pr	Prostitution
Th	Theft
VT	Vehicle Theft
Va	Vandalism
Bu	Burglary
Ar	Arson

**TIME OF DAY**  
Show All | Hide All  
Light | Dark [nearest hour]  
Commute | Nightlife  
Day | Night | Swing Shift

**DATE** Past Week  
Sep 2009  
AUG 17 2009 AUG 24 2009 AUG 31 2009 SEP 7 2009



**Dots can include data**



# Dots are ubiquitous





# "Red Dot Fever"



# Mapping America: Every City, Every Block

Find something interesting? Share this view on [Twitter](#) or [Facebook](#)

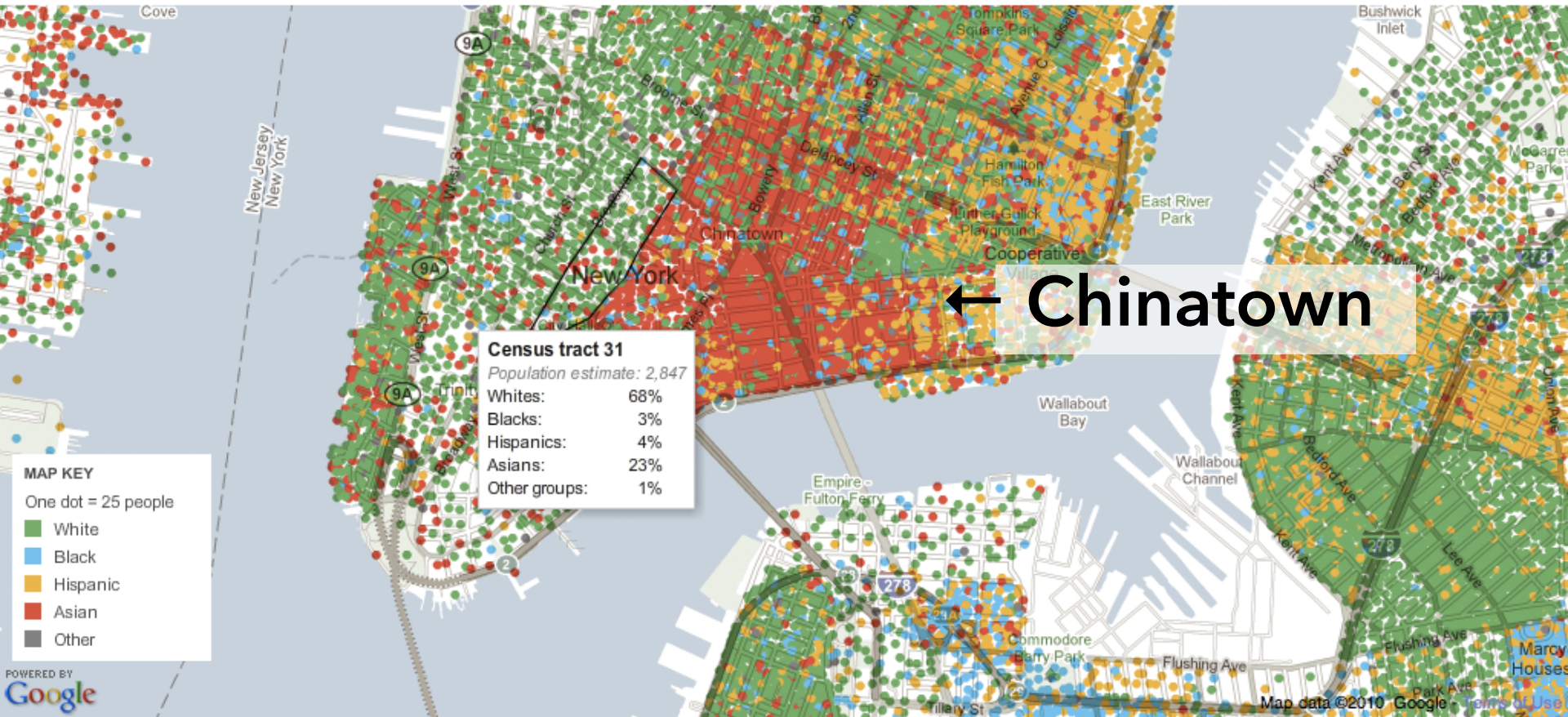
Browse local data from the Census Bureau's American Community Survey, based on samples from 2005 to 2009. Because these figures are based on [View Readers Maps \(49\)](#) samples, they are subject to a margin of error, particularly in places with a low population, and are best regarded as estimates.

## Distribution of racial and ethnic groups

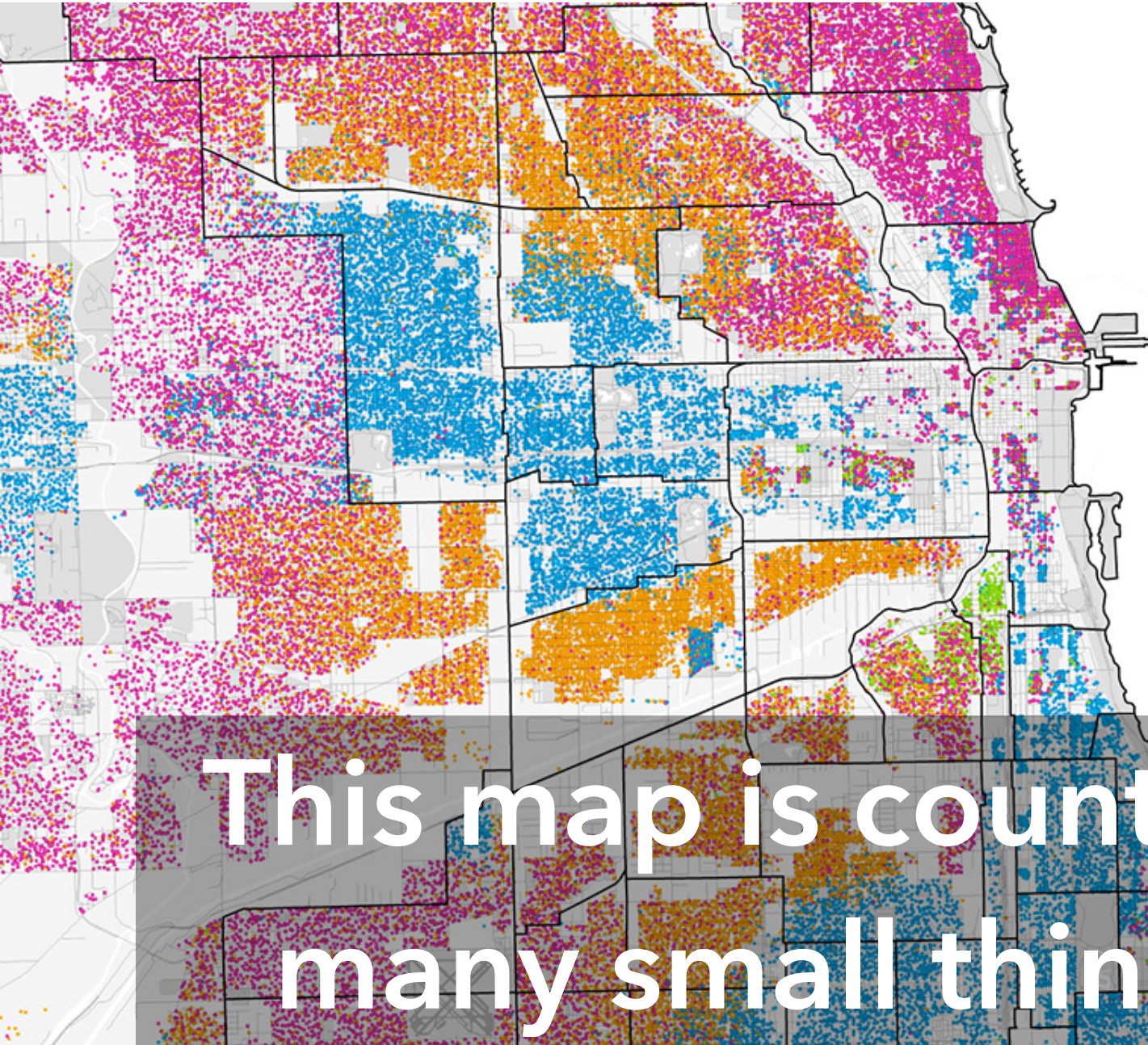
[View More Maps](#)

Address, ZIP code or city

Go







the black lines show  
chicago's official  
community areas.

each dot represents  
twenty-five people.  
here, hispanic is  
exclusive of other  
categories.

block-level data  
from the U.S. census.

scale 1:200,000

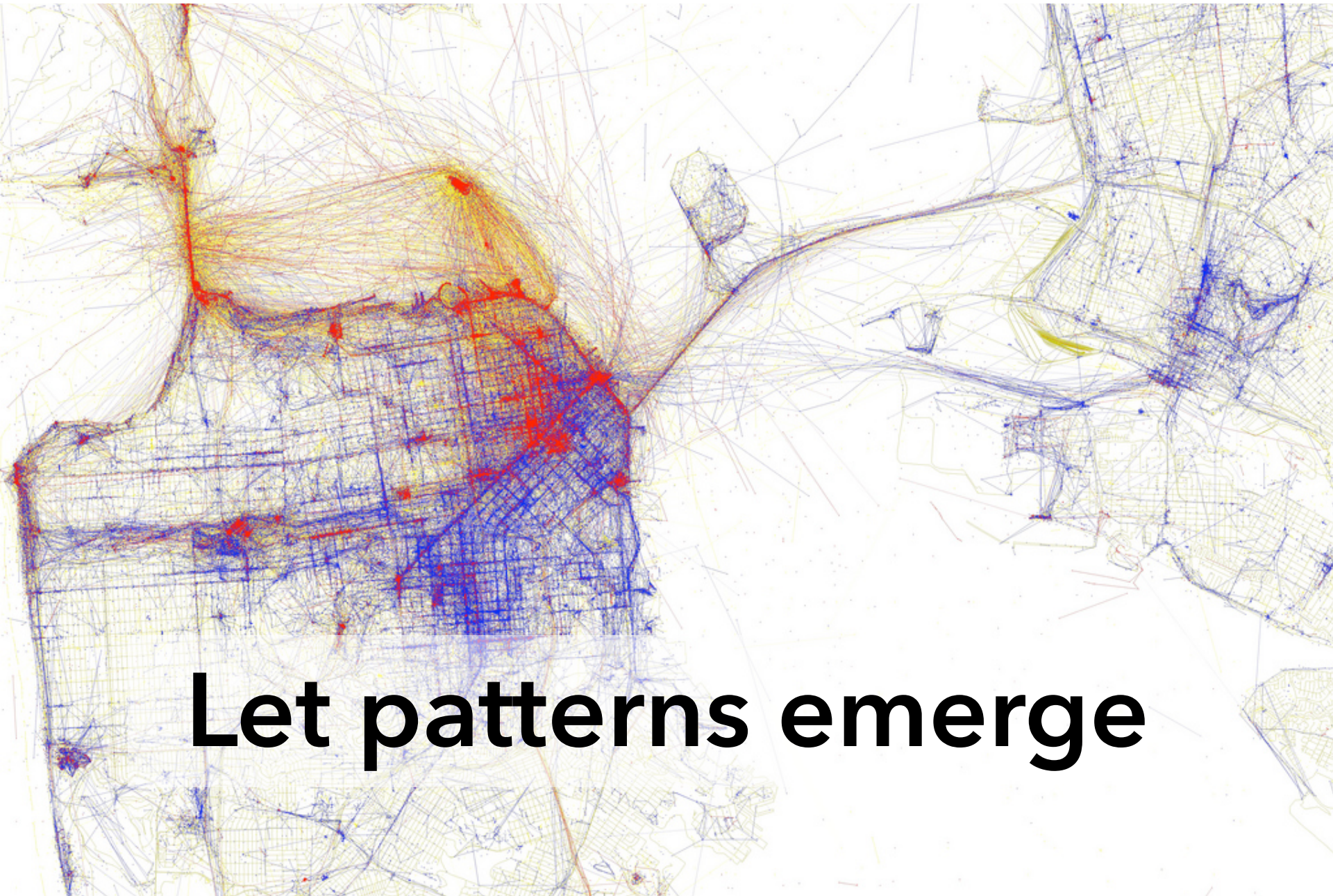
This map is counting  
many small things



# Clustering, grouping





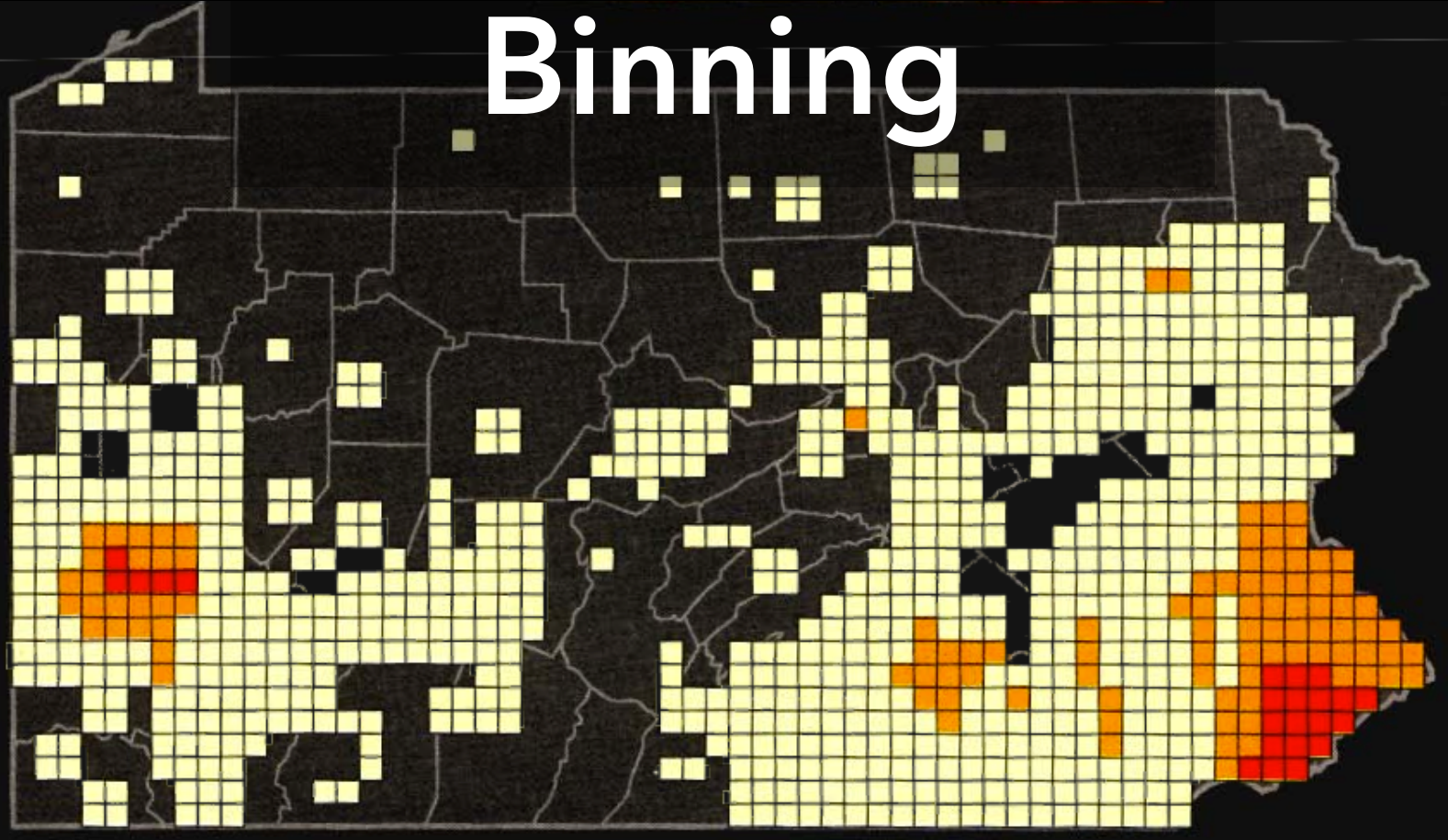


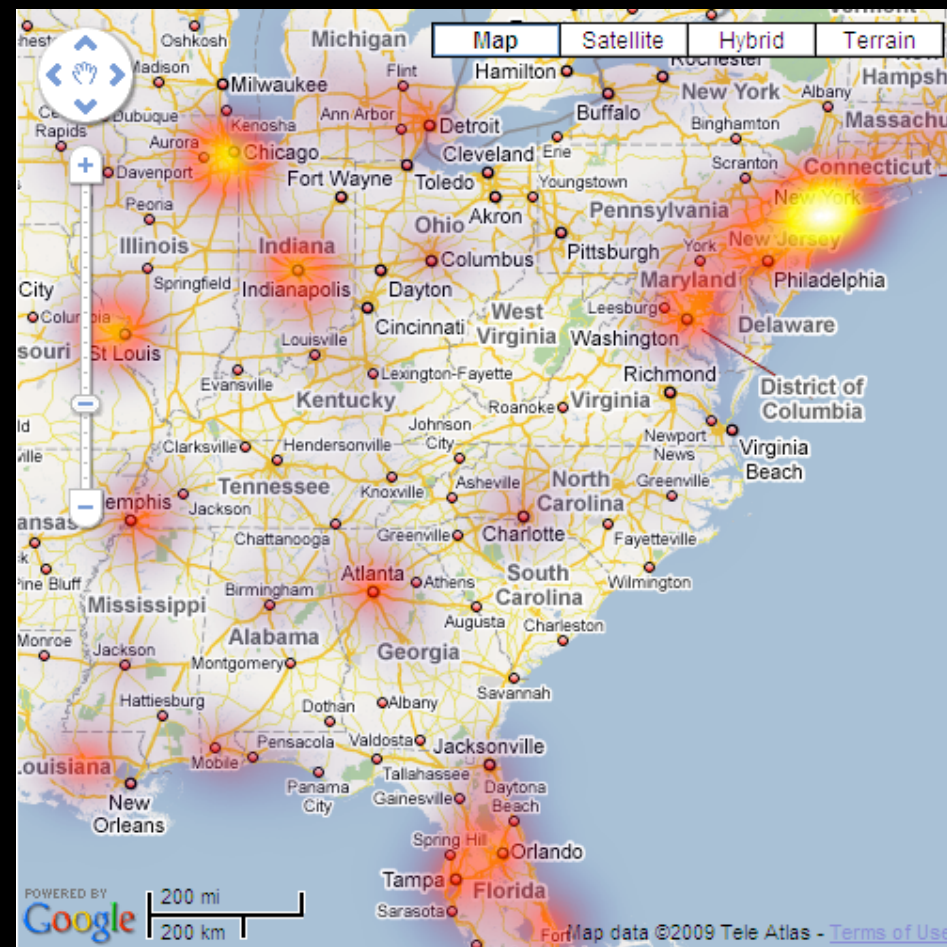
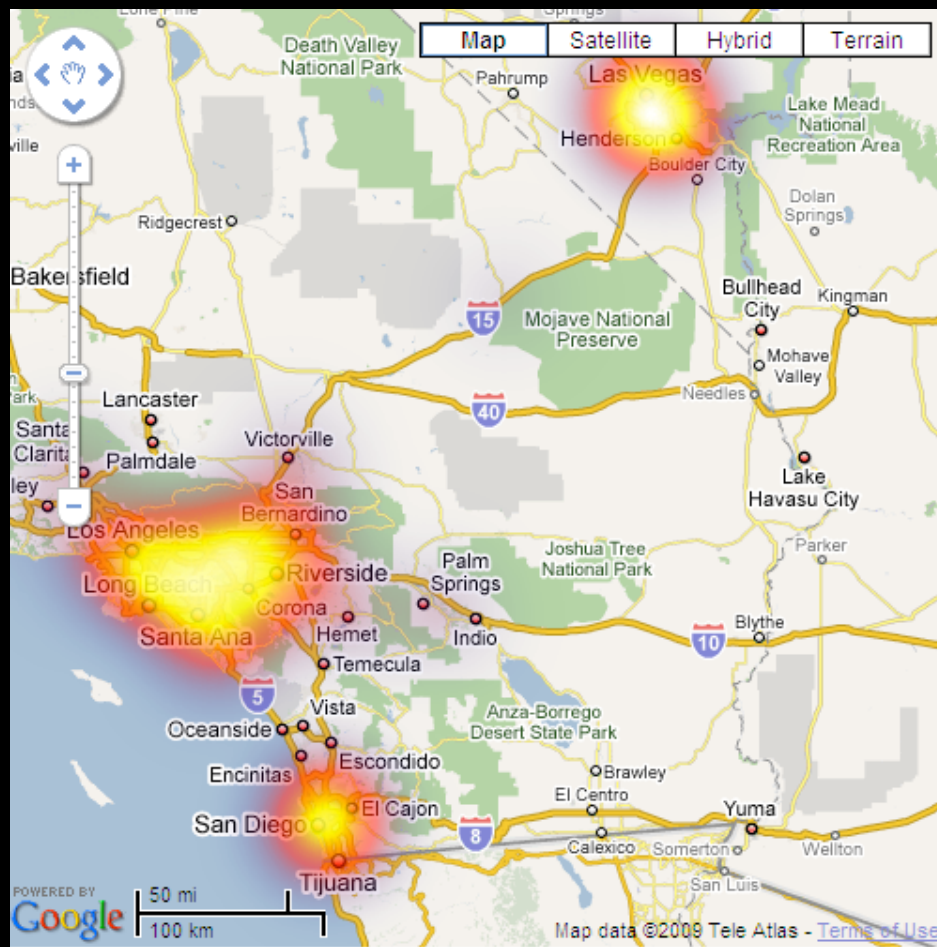
**Let patterns emerge**

# Continuous Data



# Binning



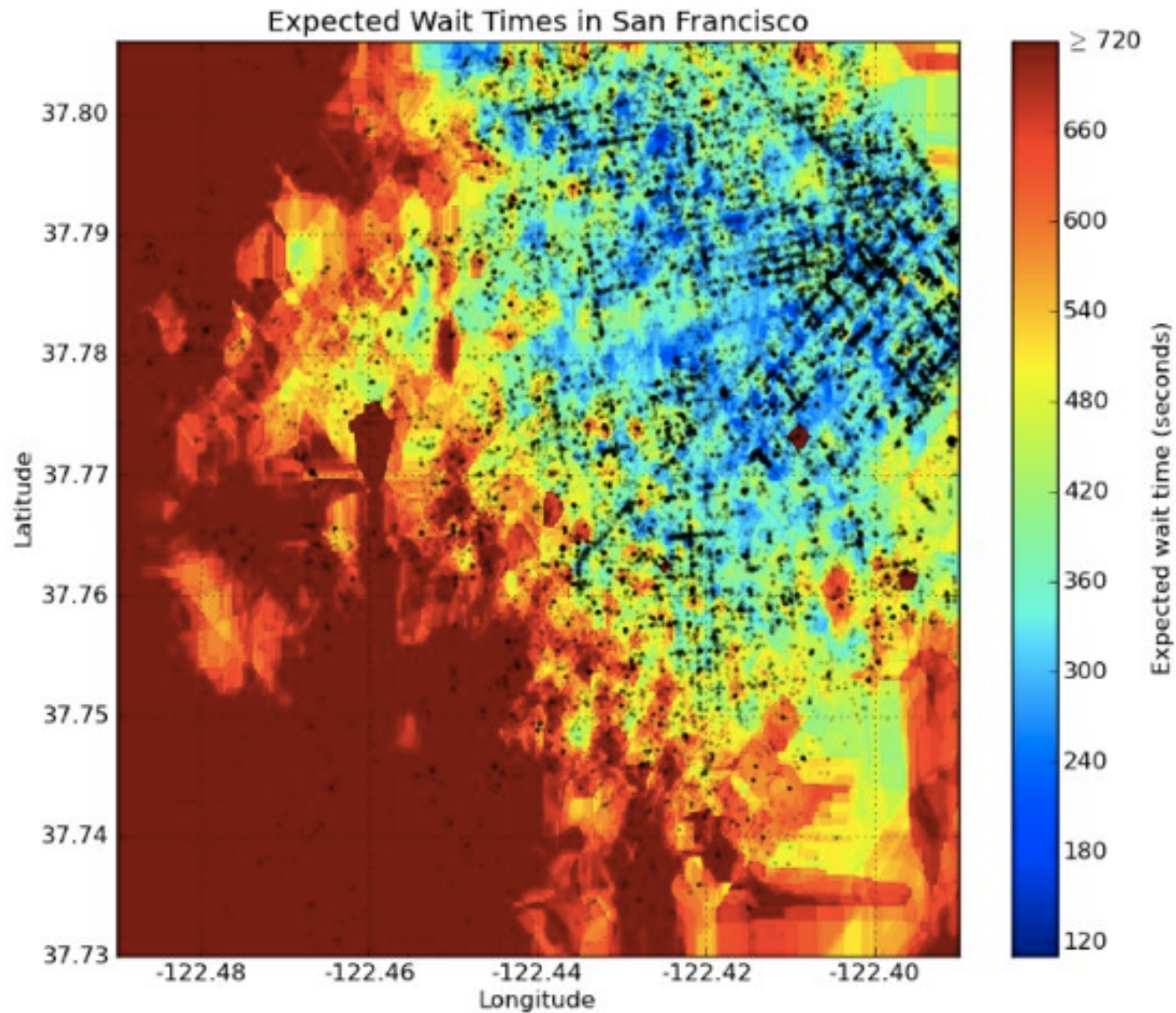


Don't hide the context



# Uber Wait Times, 2011

<http://sta.mn/6x27>





# Break data into buckets

## CRIMESPOTTING

The brazen 2007 murder of journalist Chauncey Bailey in Oakland, California, led Stamen partner Mike Migurski to

make the city's crime data more accessible. This heat map of downtown uses data from CrimeWatch, a community website,

to show the gaps between crimes at a given intersection: white is high-crime; darker areas are safe. [stamen.com](http://stamen.com)

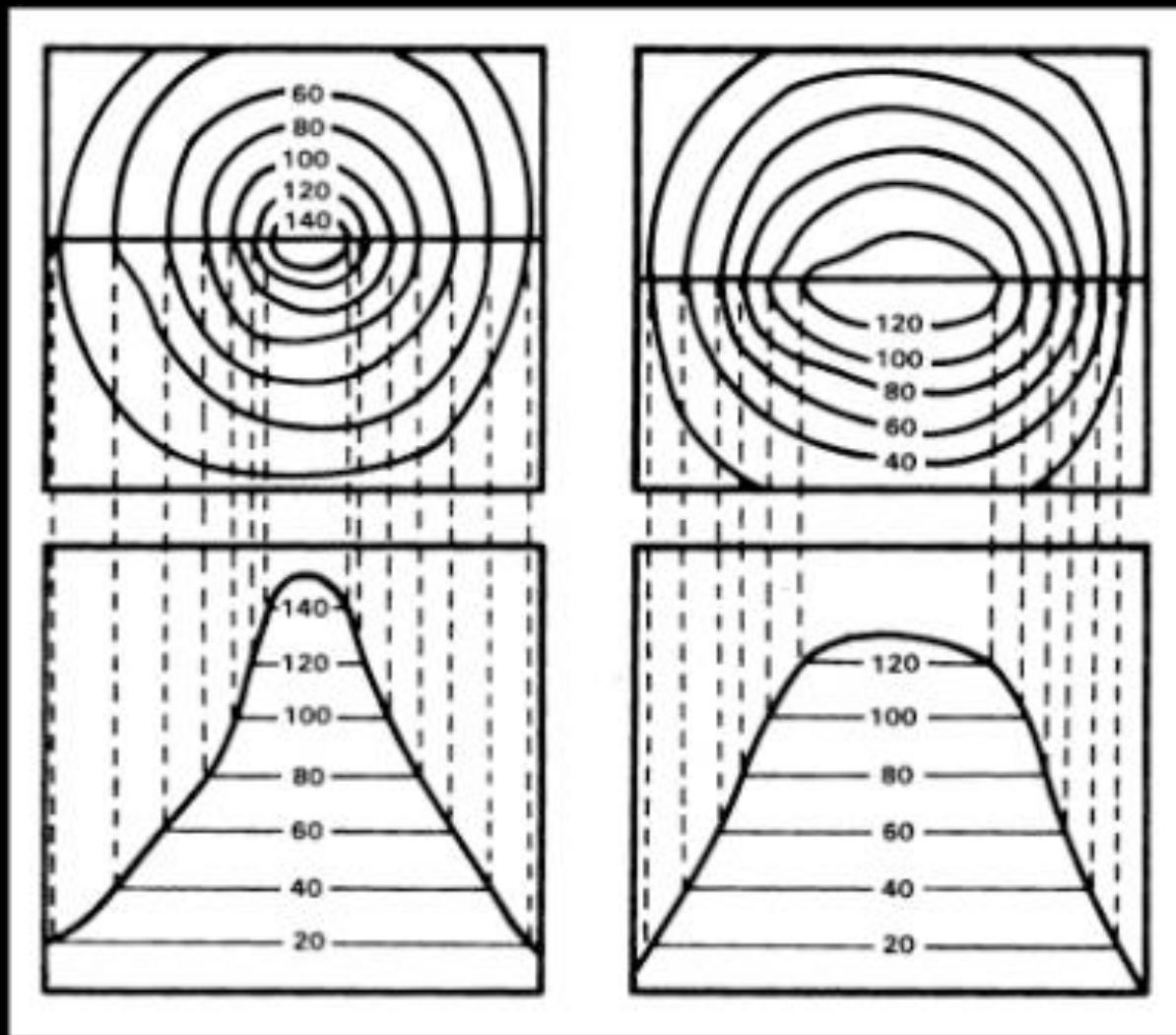
### KEY

Colours show how recently a crime was reported in a given part of Oakland

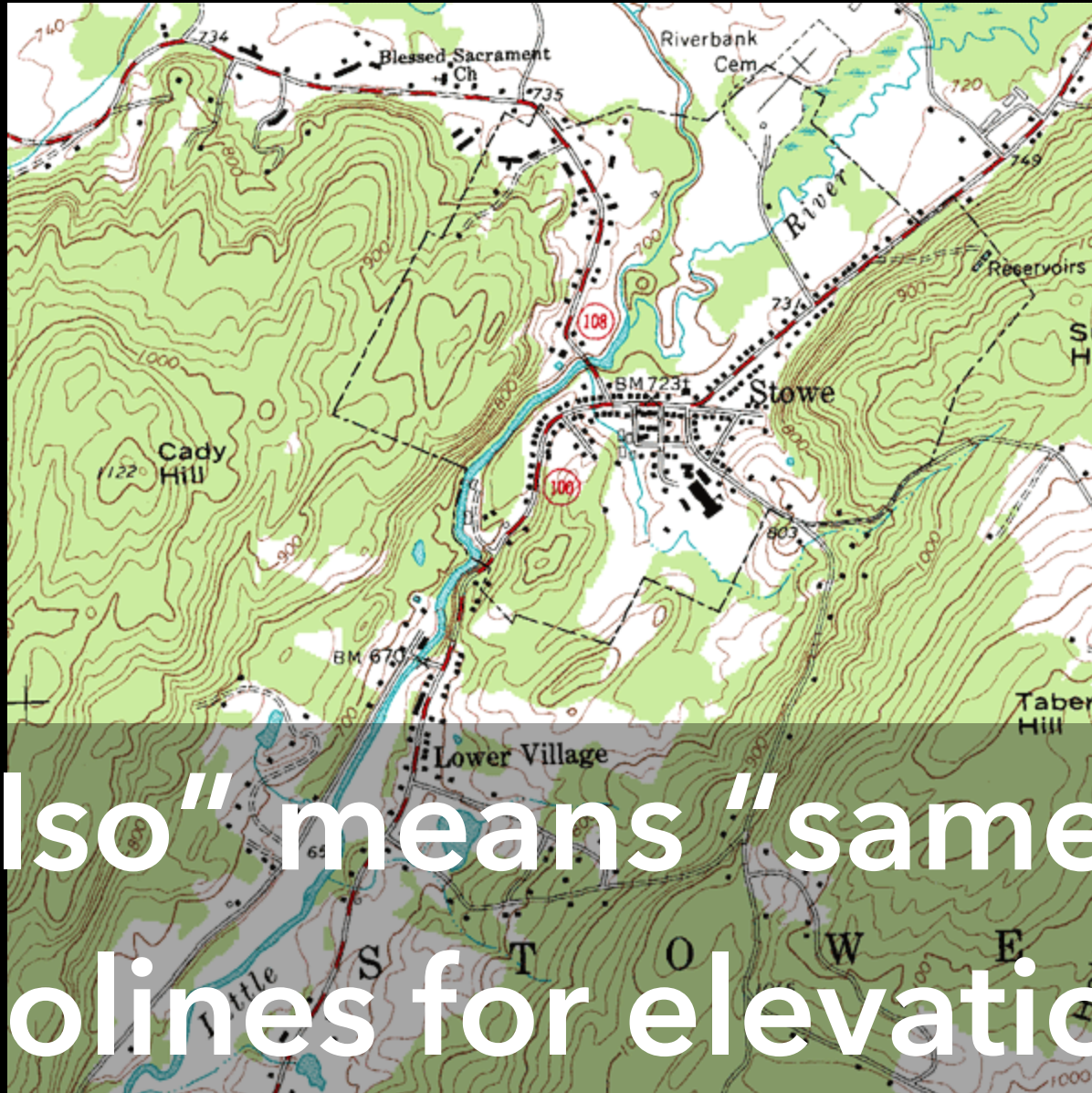
- A week ago
- Two weeks ago
- A month ago
- Two months ago
- Three months ago
- Four months ago
- Five months ago

# Meaningful buckets

<http://sta.mn/b6>

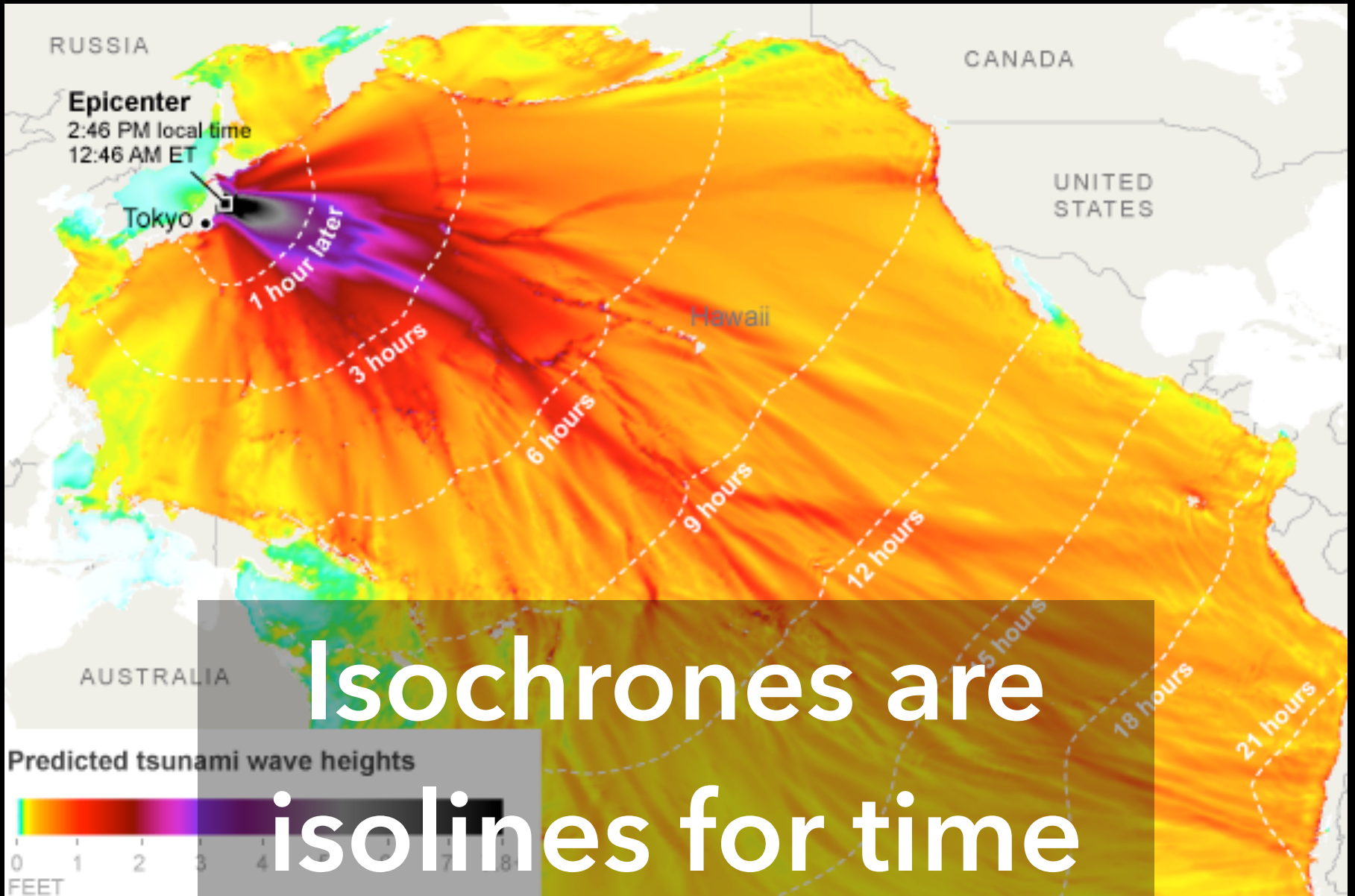






**“Iso” means “same”**  
**Isolines for elevation**



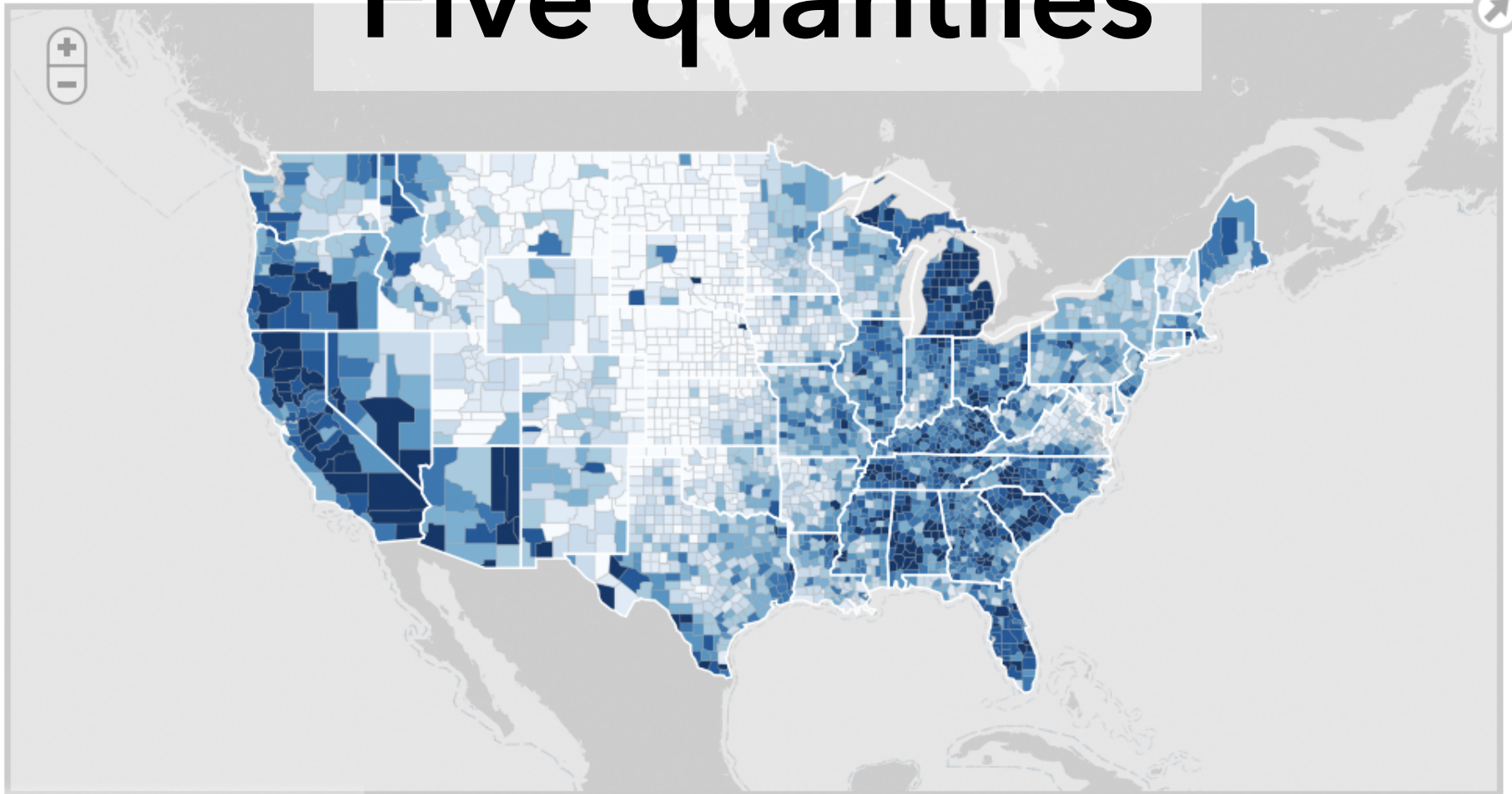


# Choropleth Maps

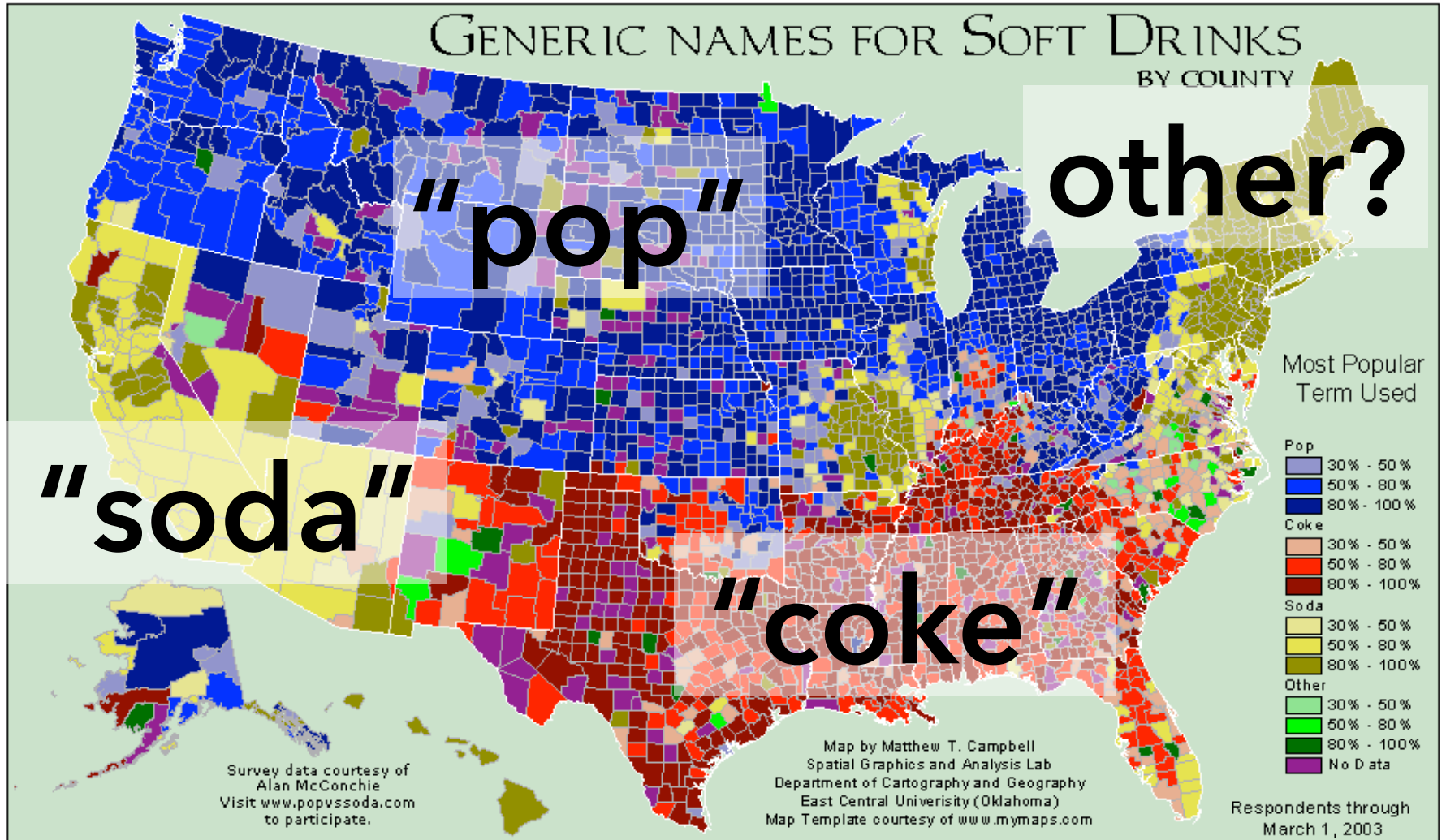




# Five quantiles

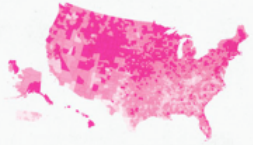


# GENERIC NAMES FOR SOFT DRINKS BY COUNTY



## READING, WRITING, AND EARNING MONEY

The latest data from the U.S. Census's American Community Survey paints a fascinating picture of the United States at the county level. We've looked at the educational achievement and the median income of the entire nation, to see where people are going to school, where they're earning money, and if there is any correlation.



A HIGH SCHOOL GRADUATES 65% 75% 82% 85%



B COLLEGE GRADUATES 15% 22% 30% 40%

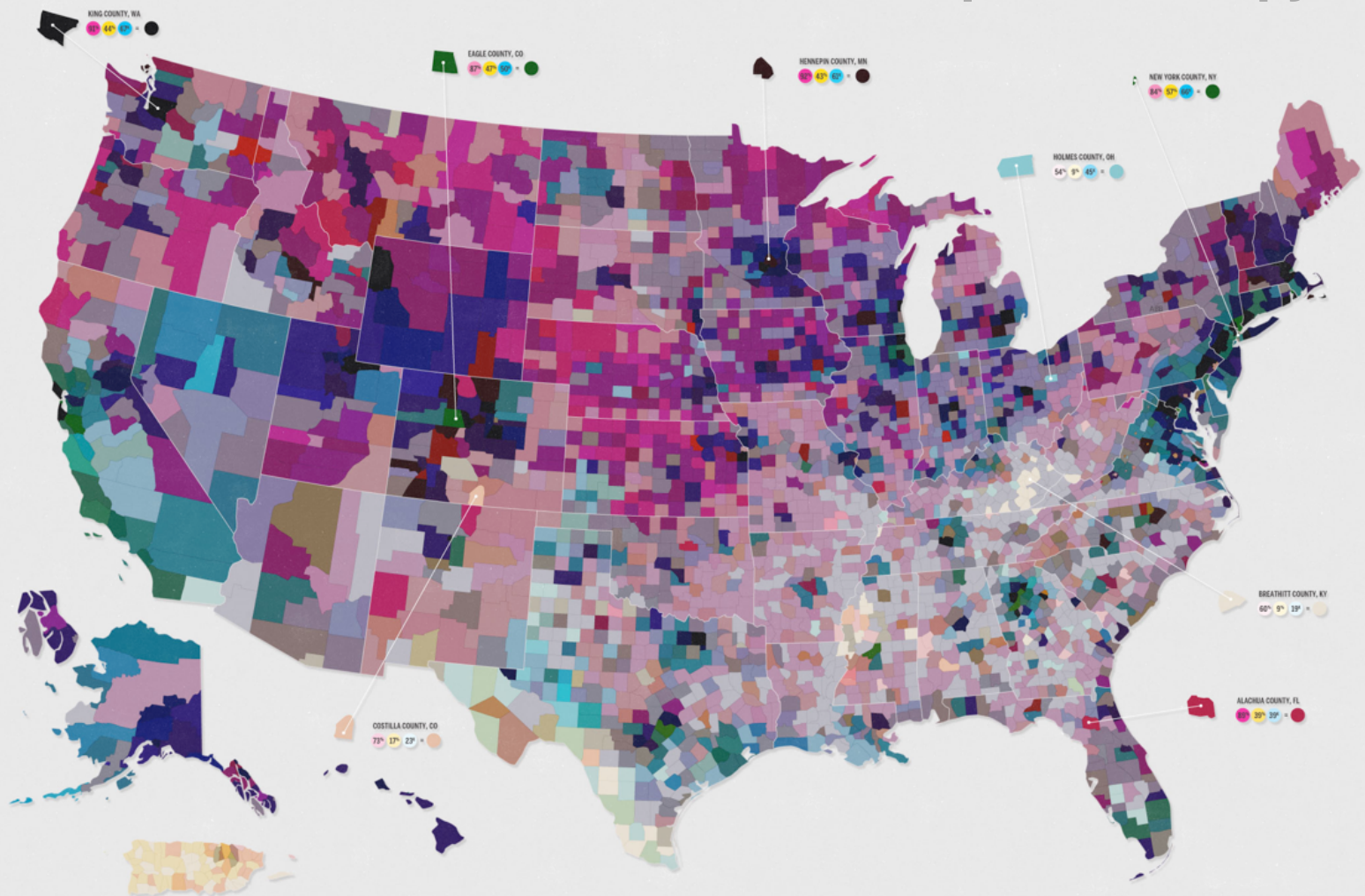


C MEDIAN HOUSEHOLD INCOME 25K 40K 50K 60K

The map at right is a product of overlaying the three sets of data. The variation in hue and value has been produced from the data shown above. In general, darker counties represent a more educated, better paid population while lighter areas represent communities with fewer graduates and lower incomes.

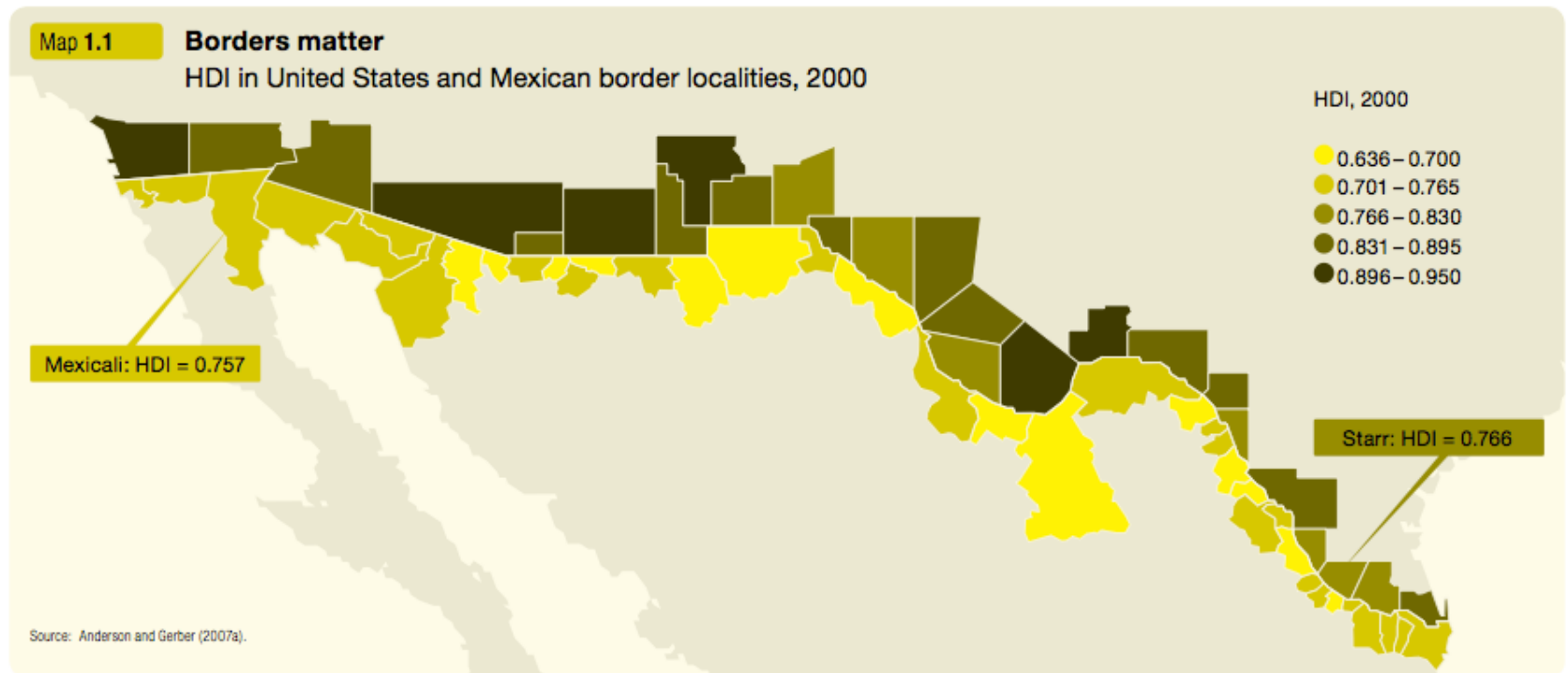


A collaboration between GOOD and Gregory Huback  
SOURCE: US Census



# Choose colors well

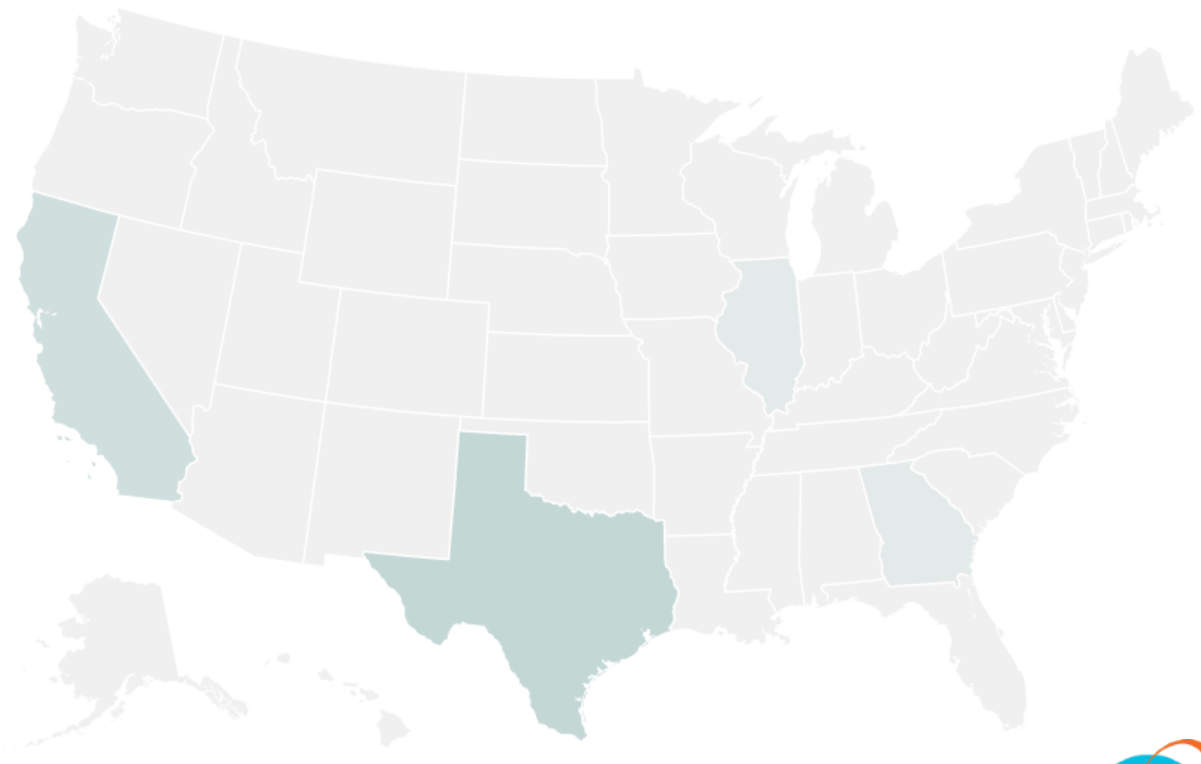
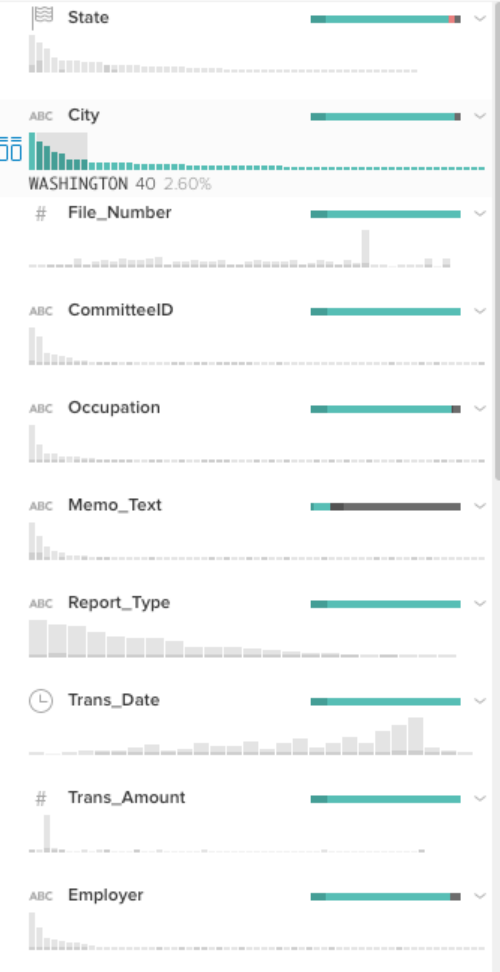




# Focus on the foreground

Sort: Default Edit

State



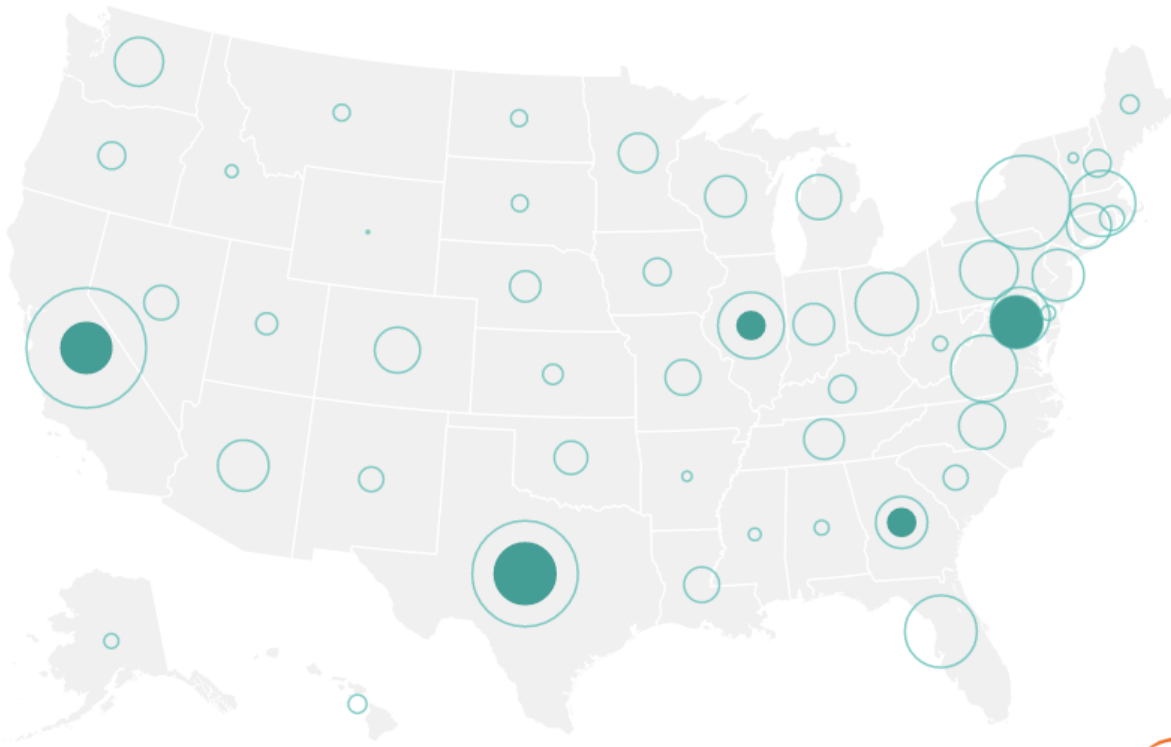
# What is obscured?

Sort: Default Edit

State



WASHINGTON 40 2.60%



# Regions -> Symbols



# Cartograms

# New York Times ratings

**198**  
Safe Dem.

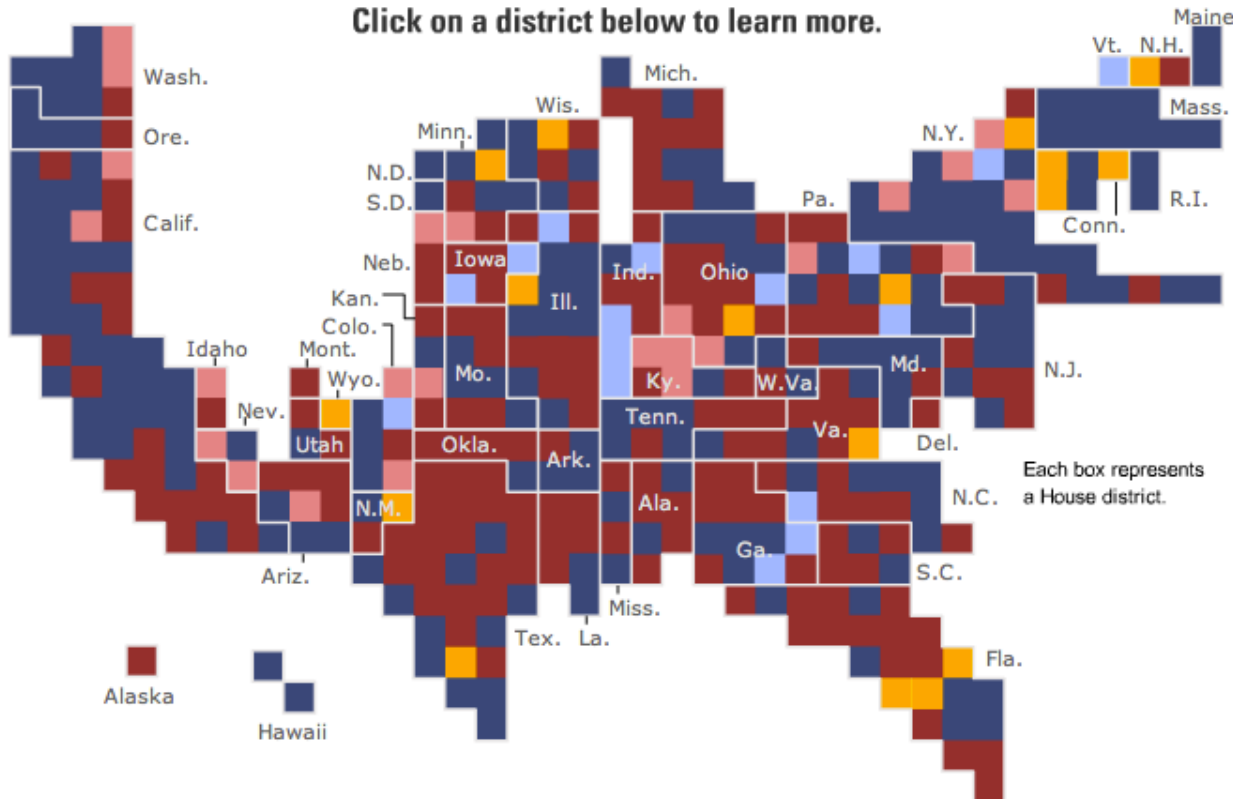
**16**  
Leaning Dem.

**17**  
Toss up

**24**  
Leaning Rep.

**180**  
Safe Rep.

Click on a district below to learn more.



Each box represents a House district.

**ANALYZE RACES**

CREATE OUTCOMES

Shade the map using the pulldown...

New York Times ratings [dropdown menu]

...then show only certain states

New York Times ratings ?

Democrat:  Safe  Leaning  Toss Up

Republican:  Safe  Leaning

Current Rep.  Dem.  Rep.

Margin in 2004 House race

Democrat:  >50%  25-50%  <25%

Republican:  >50%  25-50%  <25%

Votes for president  Kerry  Gore  Bush  Bush

Appearances by big fundraisers ?

George W. Bush  Bill Clinton

Races to watch ?

Open races

Switch districts ?

Urbanization

Urban  Suburban  Rural  Mixed

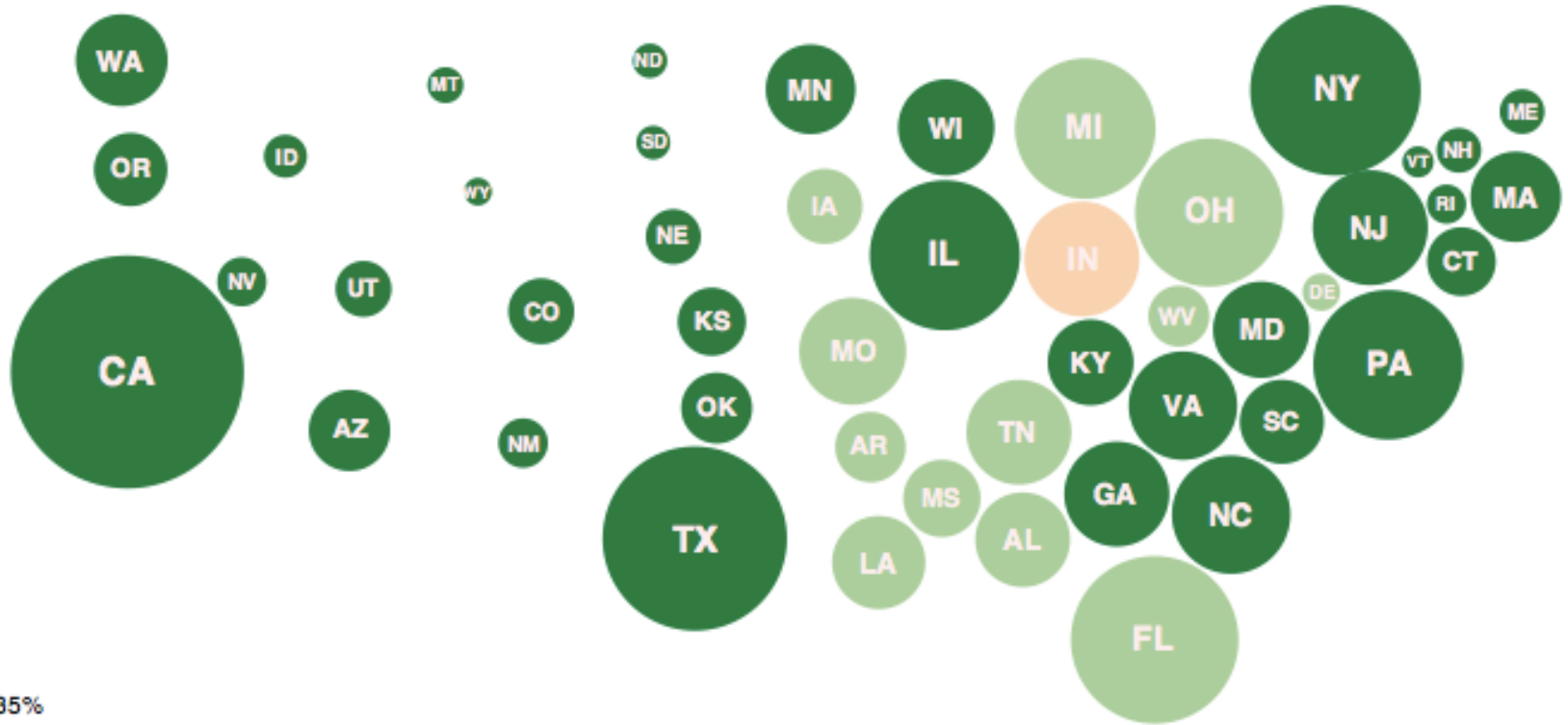
Race/Ethnicity

White  Black  Hispanic

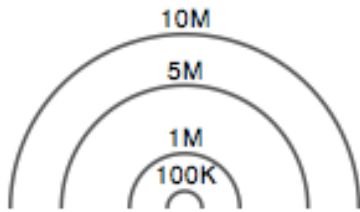
Median income

<\$30K  \$30-50K  >\$50K

RESET

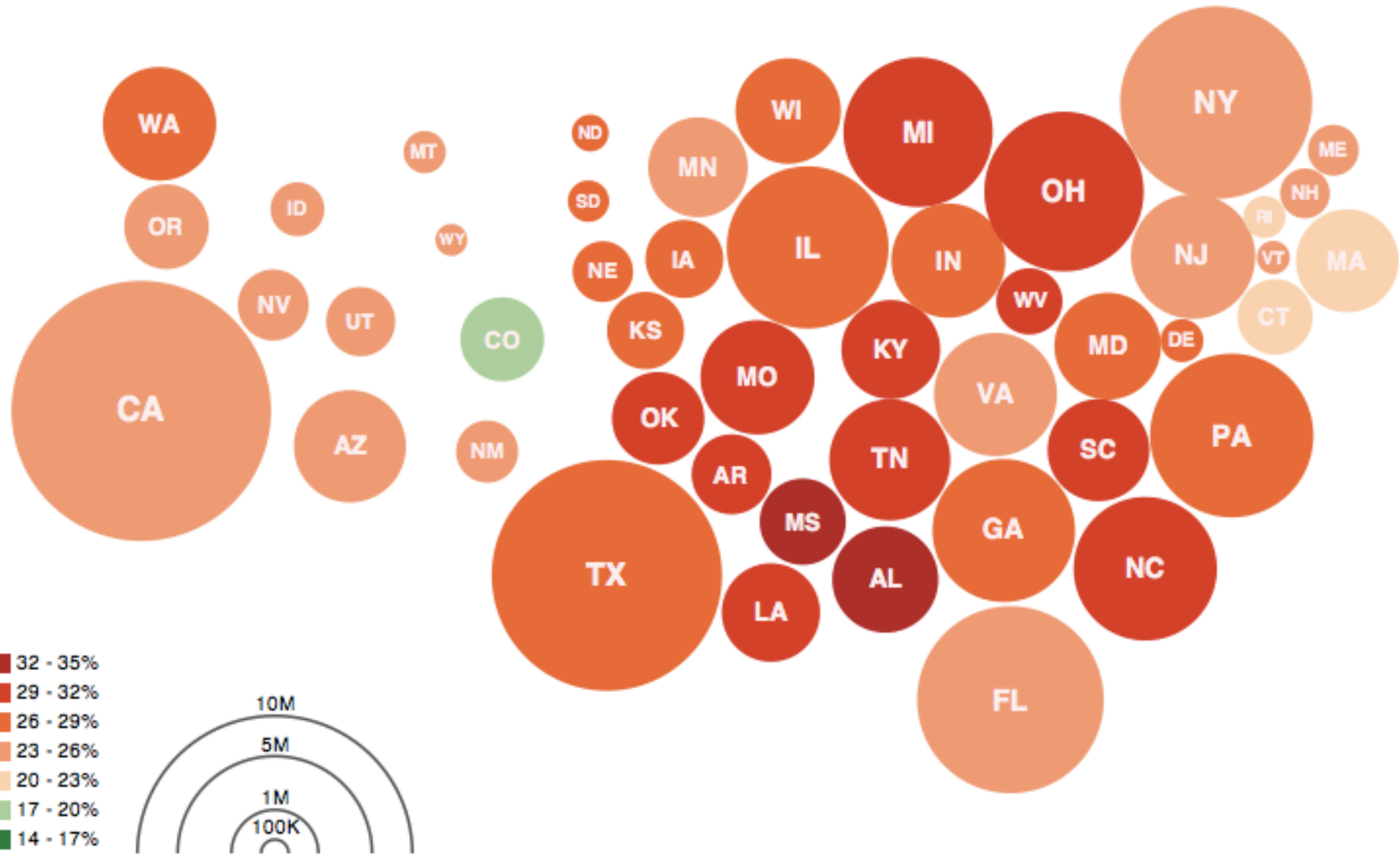


- 32 - 35%
- 29 - 32%
- 26 - 29%
- 23 - 26%
- 20 - 23%
- 17 - 20%
- 14 - 17%

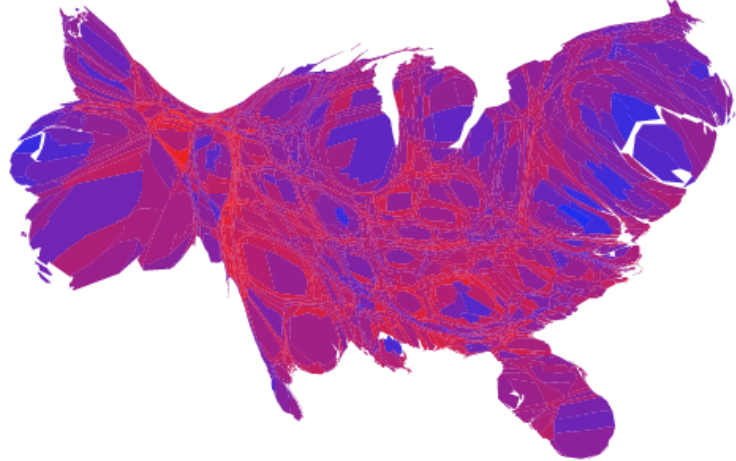
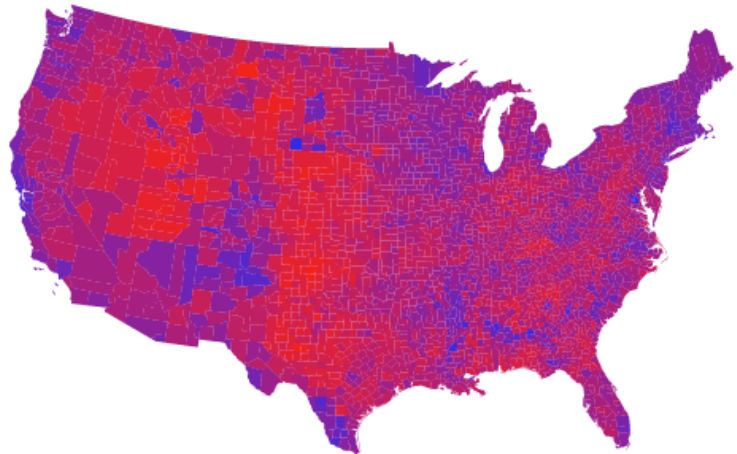
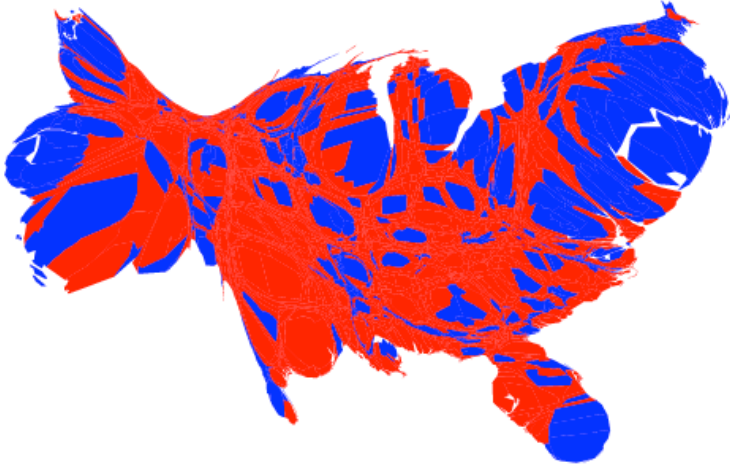
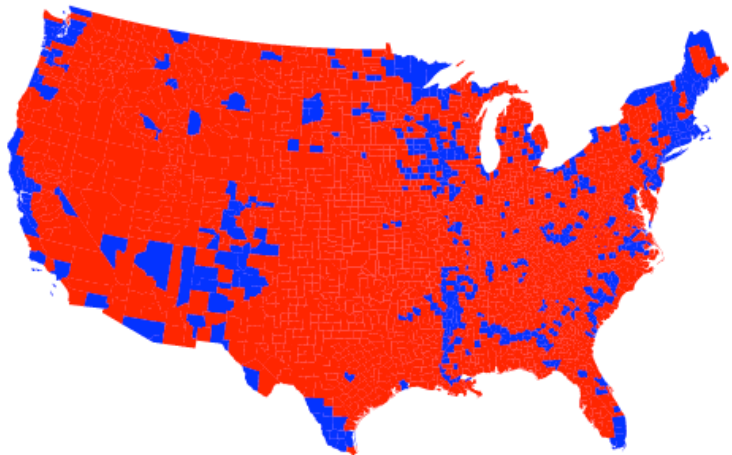
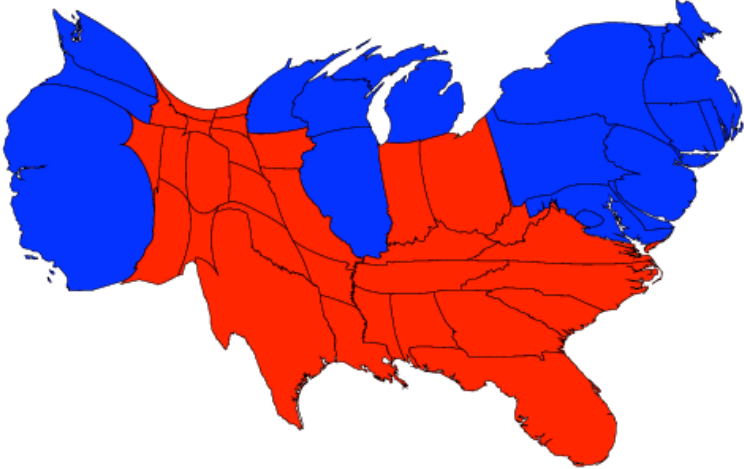
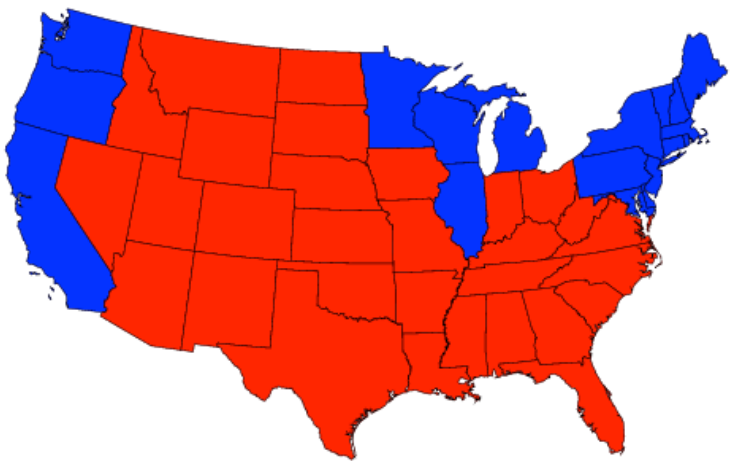


**Obesity Map (Dorling Cartogram)** Vadim Ogievetsky





**Obesity Map (Dorling Cartogram)** Vadim Ogievetsky



# China Still Dominates, but Some Manufacturers Look Elsewhere

While China maintains its overwhelming dominance in manufacturing, multinational companies are looking for ways to limit their reliance on factories there. [Related Article »](#)

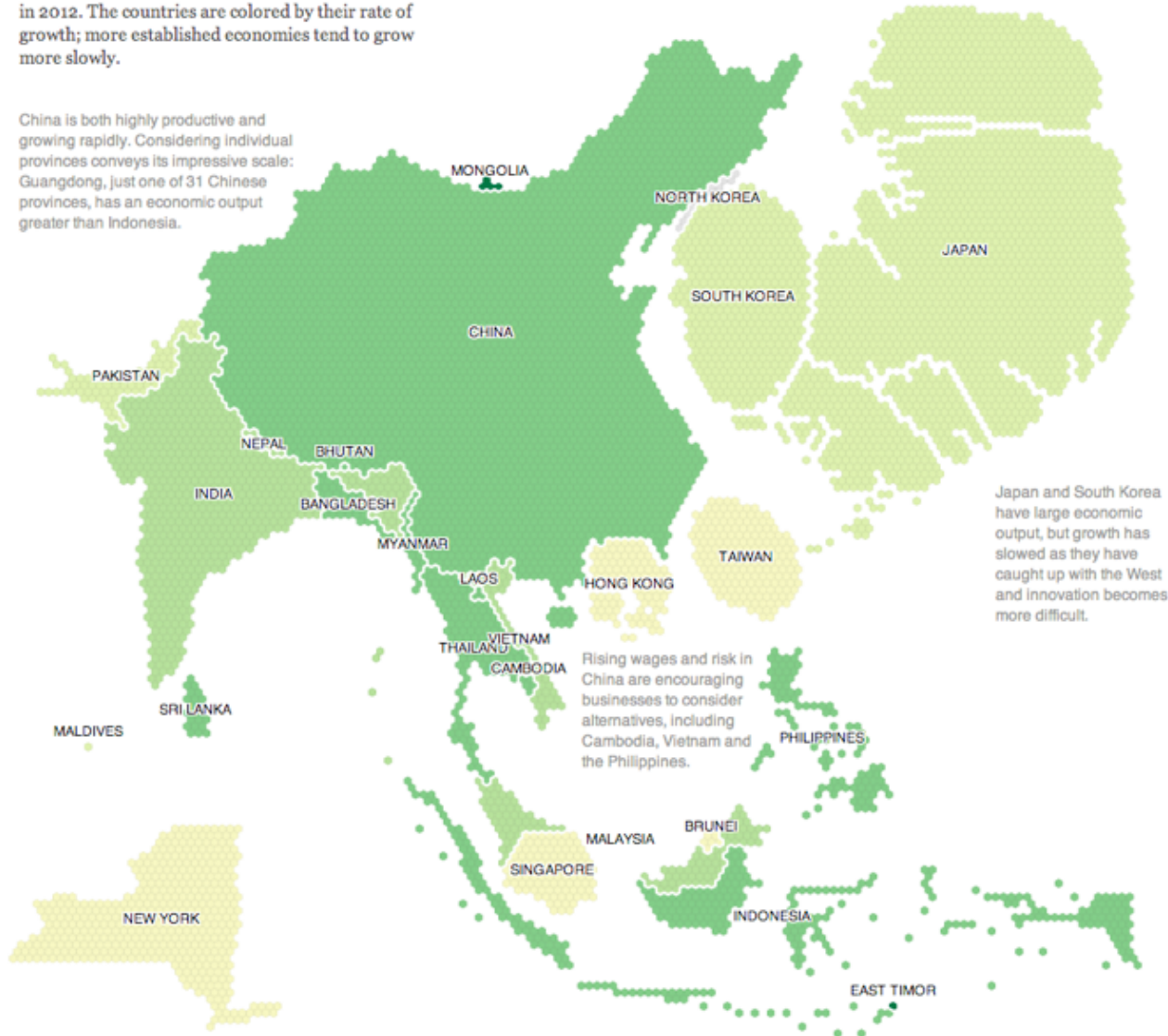
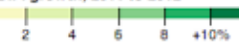
## Economic Output

In this map, geography is distorted so that each country is **sized according to its economic output in 2012**. The countries are colored by their rate of growth; more established economies tend to grow more slowly.

China is both highly productive and growing rapidly. Considering individual provinces conveys its impressive scale: Guangdong, just one of 31 Chinese provinces, has an economic output greater than Indonesia.

Each hexagon represents \$2.7 billion in G.D.P.

G.D.P. growth, 2011 to 2012

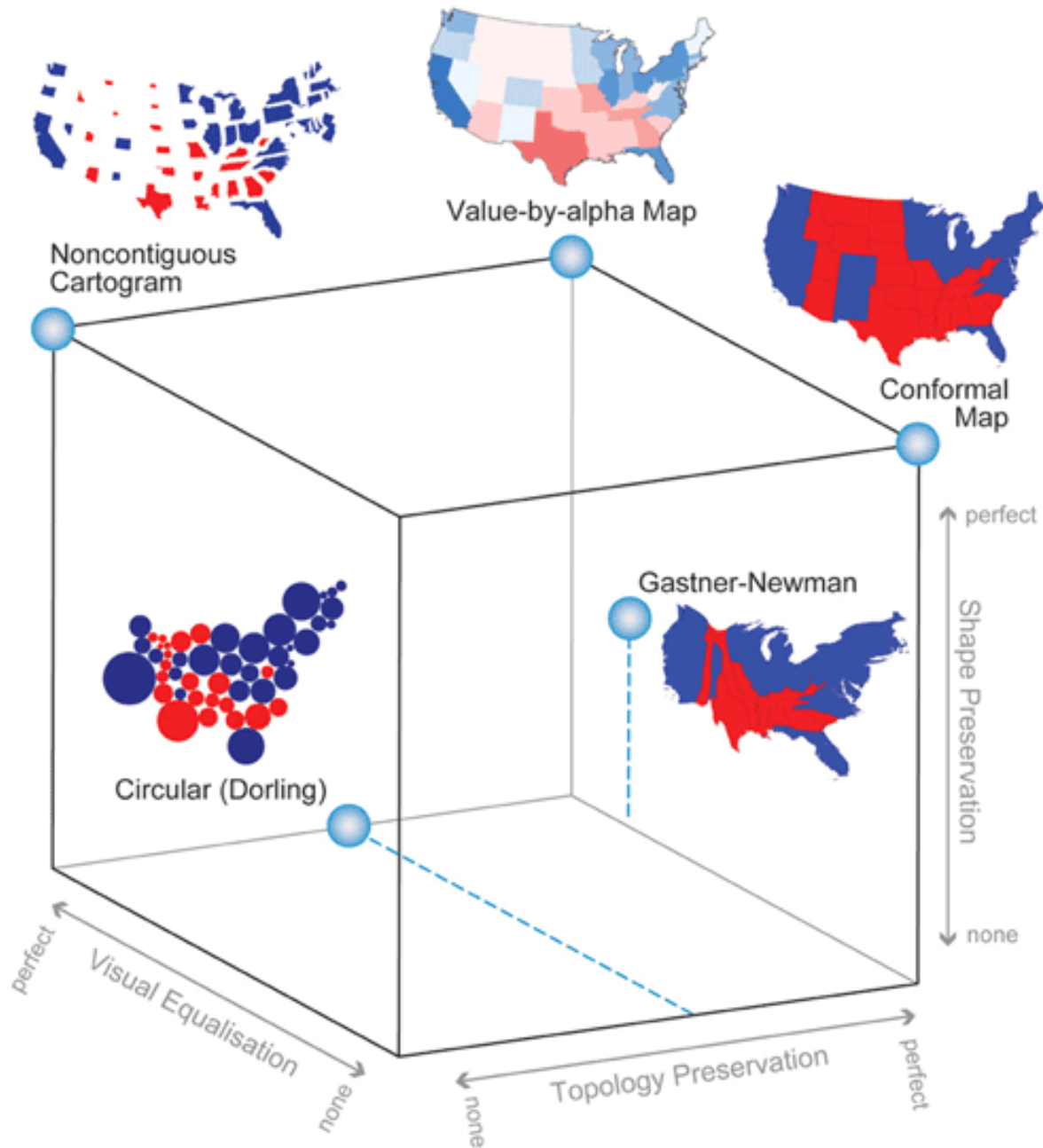


Japan and South Korea have large economic output, but growth has slowed as they have caught up with the West and innovation becomes more difficult.

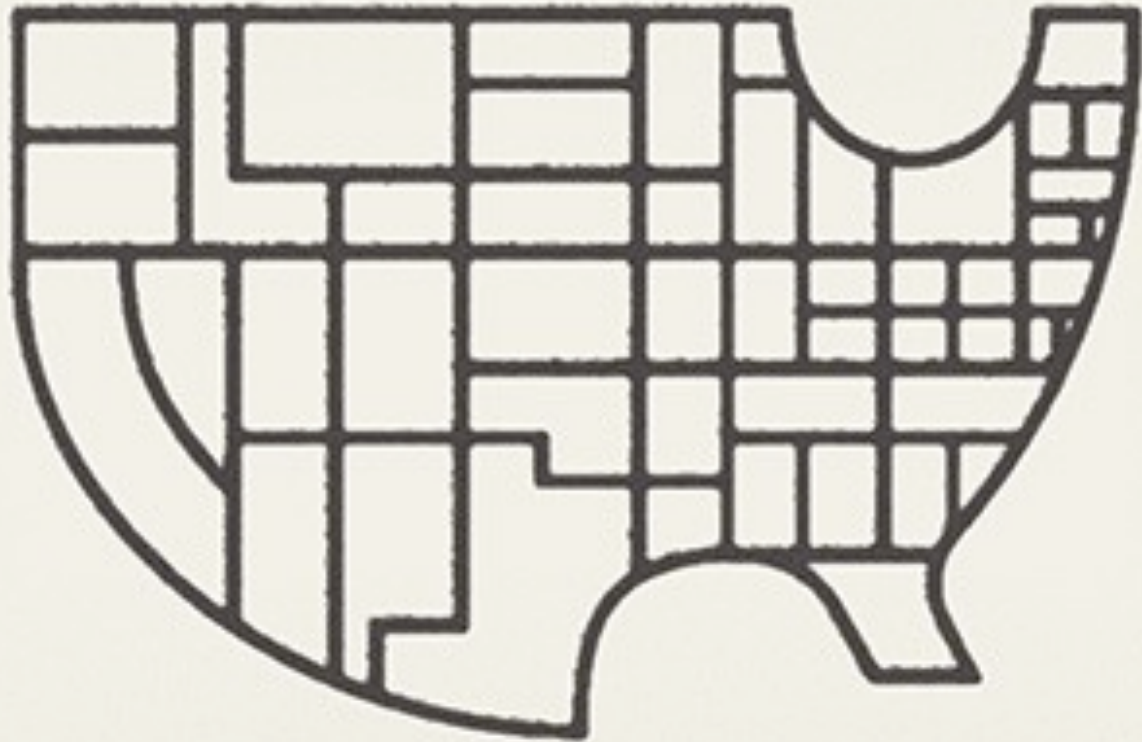
Rising wages and risk in China are encouraging businesses to consider alternatives, including Cambodia, Vietnam and the Philippines.

New York shown for comparison.





**Major distortions  
can stay recognizable**



# Flow Maps

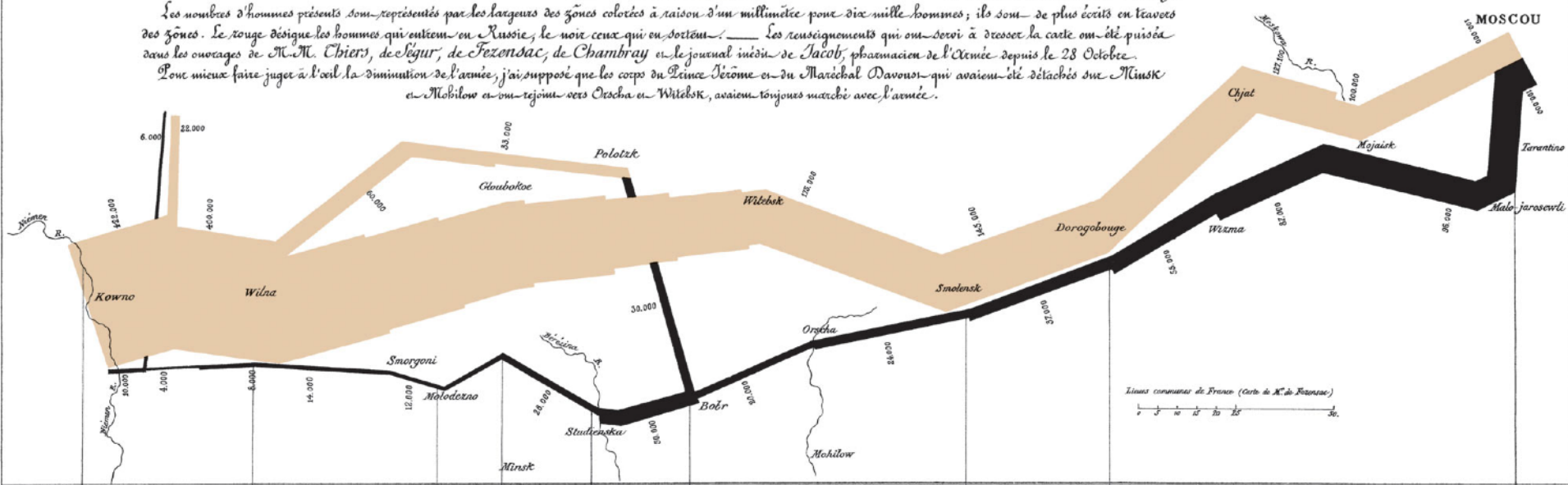


# Minard 1869: Napoleon's march

## Carte Figurative des pertes successives en hommes de l'Armée Française dans la campagne de Russie 1812-1813.

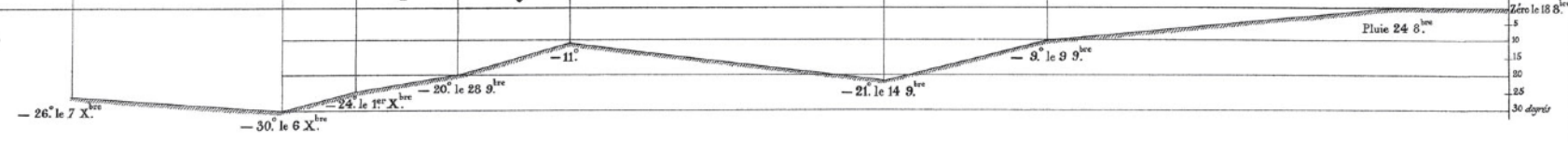
Dressée par M. Minard, Inspecteur Général des Ponts et Chaussées en retraite Paris, le 20 Novembre 1869.

Les nombres d'hommes présents sont représentés par les largeurs des zones colorées à raison d'un millimètre pour dix mille hommes; ils sont de plus écrits en travers des zones. Le rouge désigne les hommes qui entrent en Russie, le noir ceux qui en sortent. — Les renseignements qui ont servi à dresser la carte ont été puisés dans les ouvrages de M. M. Chiers, de Légar, de Fezensac, de Chambray et le journal inédit de Jacob, pharmacien de l'Armée depuis le 28 Octobre. Pour mieux faire juger à l'œil la diminution de l'armée, j'ai supposé que les corps du Prince Jérôme et du Maréchal Davoust qui avaient été détachés sur Minsk et Mohilow et qui rejoindront Orscha ou Witebsk, avaient toujours marché avec l'armée.



### TABLEAU GRAPHIQUE de la température en degrés du thermomètre de Réaumur au dessous de zéro.

Les Cosaques passent au galop le Niémen gelé.



Autog. par Regnier, 8, Rue St-Marc St-Germain à Paris.

Imp. Lit. Regnier et Doucet.



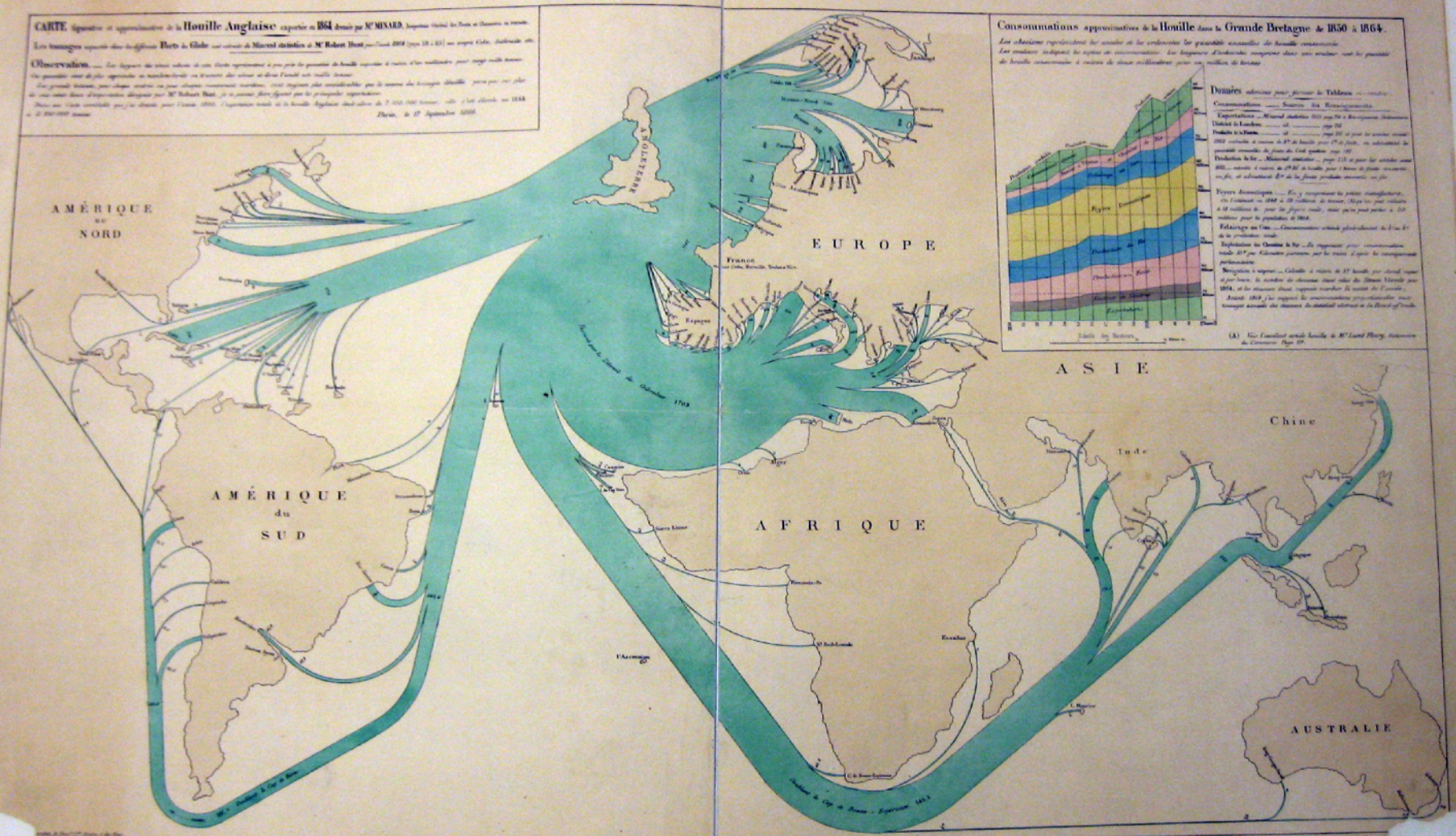
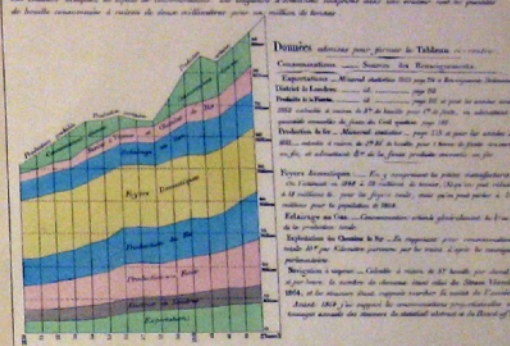
**CARTE** figurative et approximative de la **Houille Anglaise** exportée en 1864 dessinée par M<sup>r</sup> MINARD, Ingénieur Civil des Ponts et Chaussées en France.

Les tracés indiquent dans quelle direction et avec quelle abondance les charbons de Grande-Bretagne ont été envoyés dans les divers pays du monde.

**Observation.** — Les tracés ont été calculés d'après les données statistiques de M<sup>r</sup> Robert Bast, par l'année 1864 (page 18 et 19) en employant l'échelle suivante : 1 centimètre = 1000 lieues. Les tracés ont été calculés d'après les données statistiques de M<sup>r</sup> Robert Bast, par l'année 1864 (page 18 et 19) en employant l'échelle suivante : 1 centimètre = 1000 lieues. Les tracés ont été calculés d'après les données statistiques de M<sup>r</sup> Robert Bast, par l'année 1864 (page 18 et 19) en employant l'échelle suivante : 1 centimètre = 1000 lieues.

**Consommations approximatives de la Houille dans la Grande-Bretagne & 1850 & 1864.**

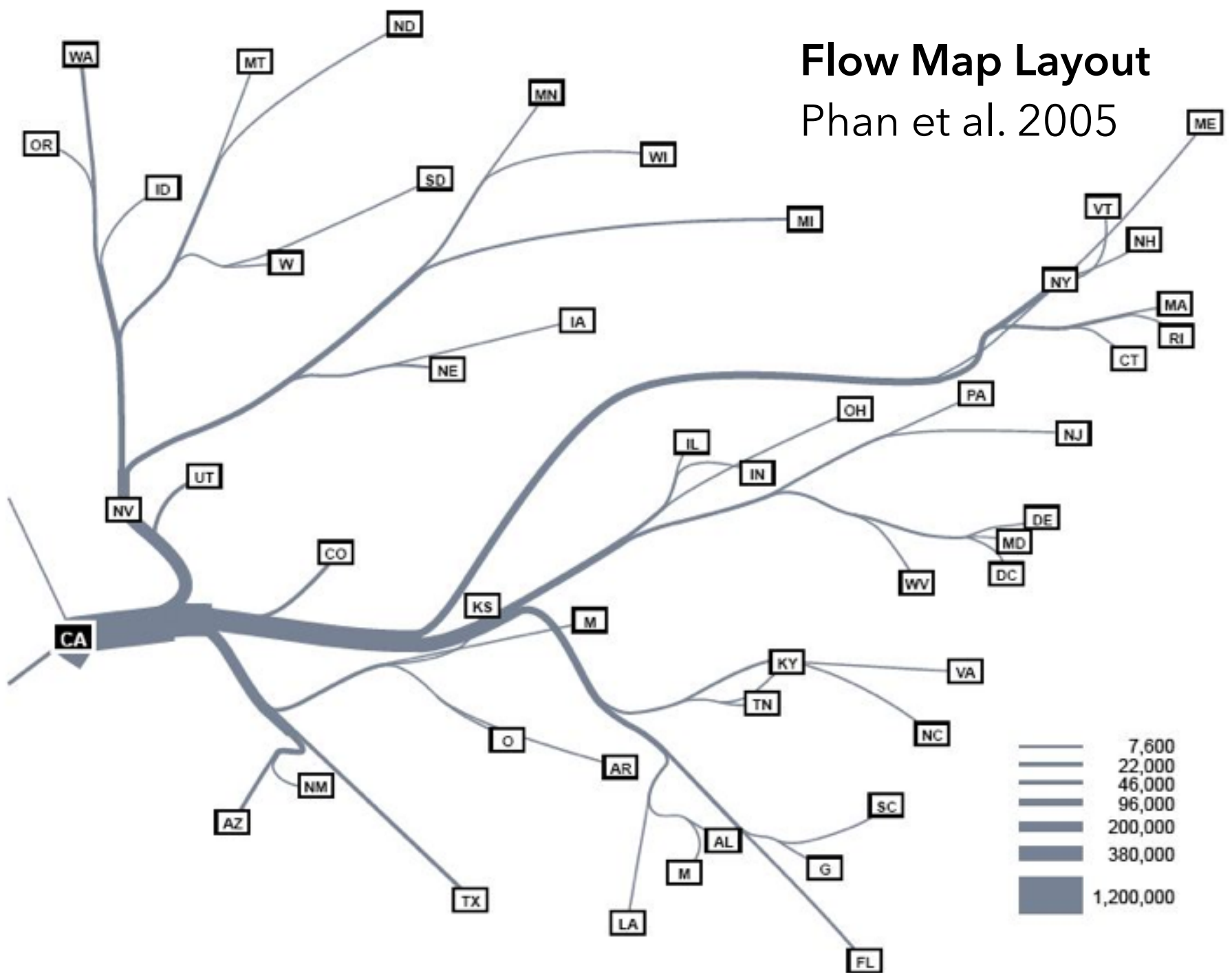
Les chiffres expriment les années et les volumes les quantités annuelles de houille consommées.



1864 British Coal Exports, Charles Minard

# Flow Map Layout

Phan et al. 2005



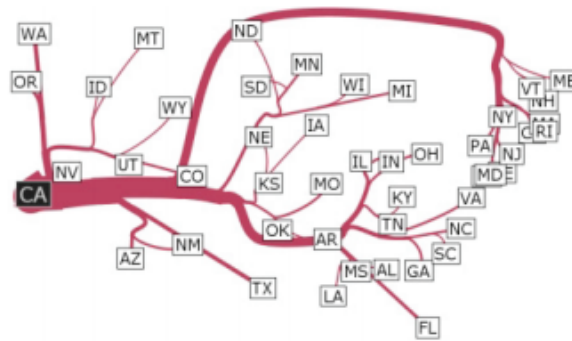


# Migration from California, 95-00

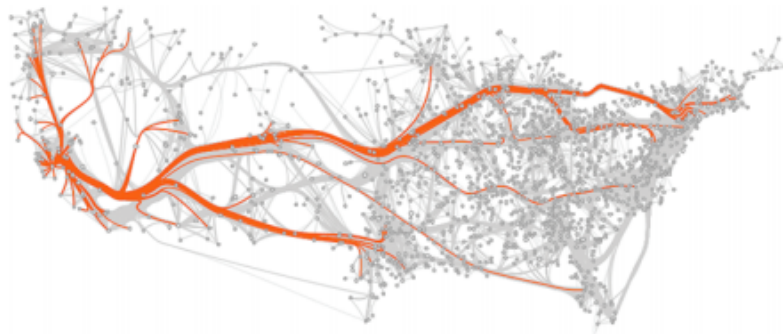
Tobler 1987



Phan et al. 2005



Verbeek et al. 2011



Cui et al. 2008



Holten & van Wijk 2009

# wind map

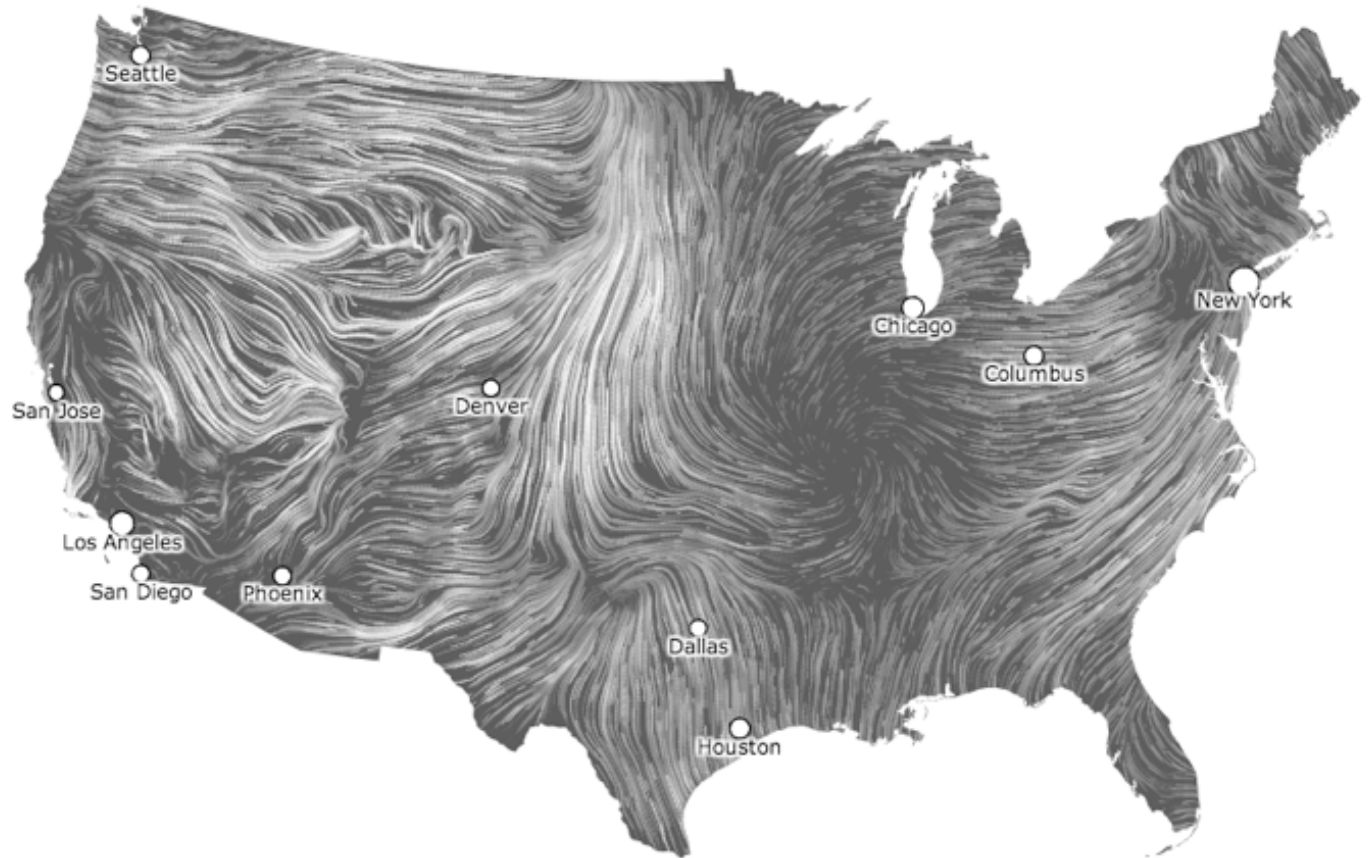
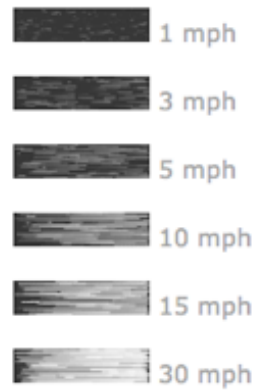
**February 19, 2014**

11:55 am EST

(time of forecast download)

top speed: **35.3 mph**

average: **11.6 mph**



# How Obama Won Re-election

Whites Were Outvoted

Women

Hispanics

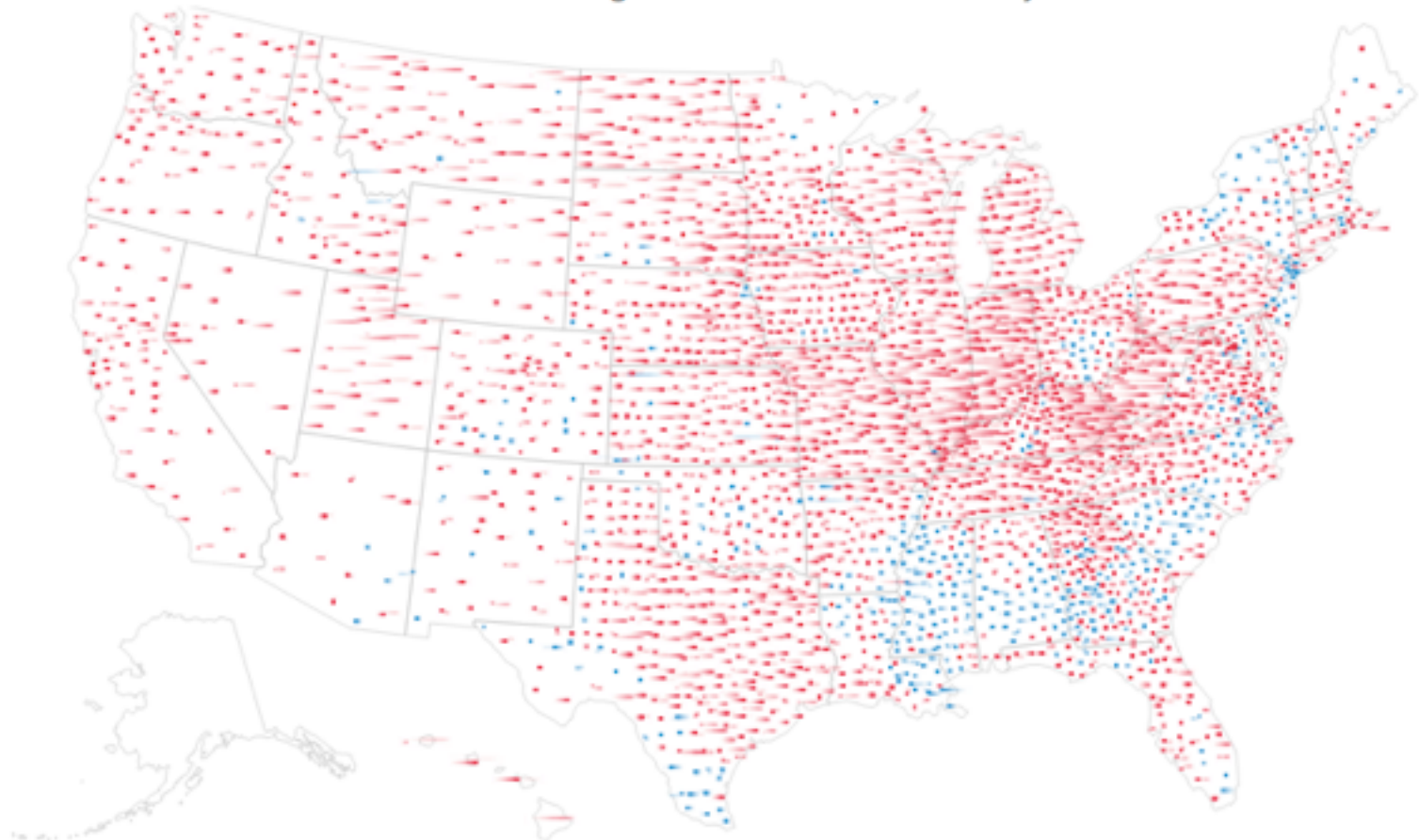
Youth

## Romney's Shift Wasn't Enough

2008

2012

Most of the nation shifted to the right in Tuesday's vote, but not far enough to secure a win for Mitt Romney.





# Generalization

**CARTE** figurative et approximative de la Houille Anglaise exportée en 1864 dessinée par M. MINARD. Imprimée chez les Bureaux de Commerce et d'Industrie.

Les données sont basées sur les chiffres publiés par M. Robert Hunt pour l'année 1864 (pages 18 et 19) sur un rapport G.C. de l'année 1864.

**Observation.** Les lignes de même couleur de cette Carte représentent à peu près la provenance de houille exportée à partir de son extraction pour chaque nation.

Une grande partie de houille exportée en France est venue de deux foyers principaux situés dans le nord-ouest de l'Angleterre.

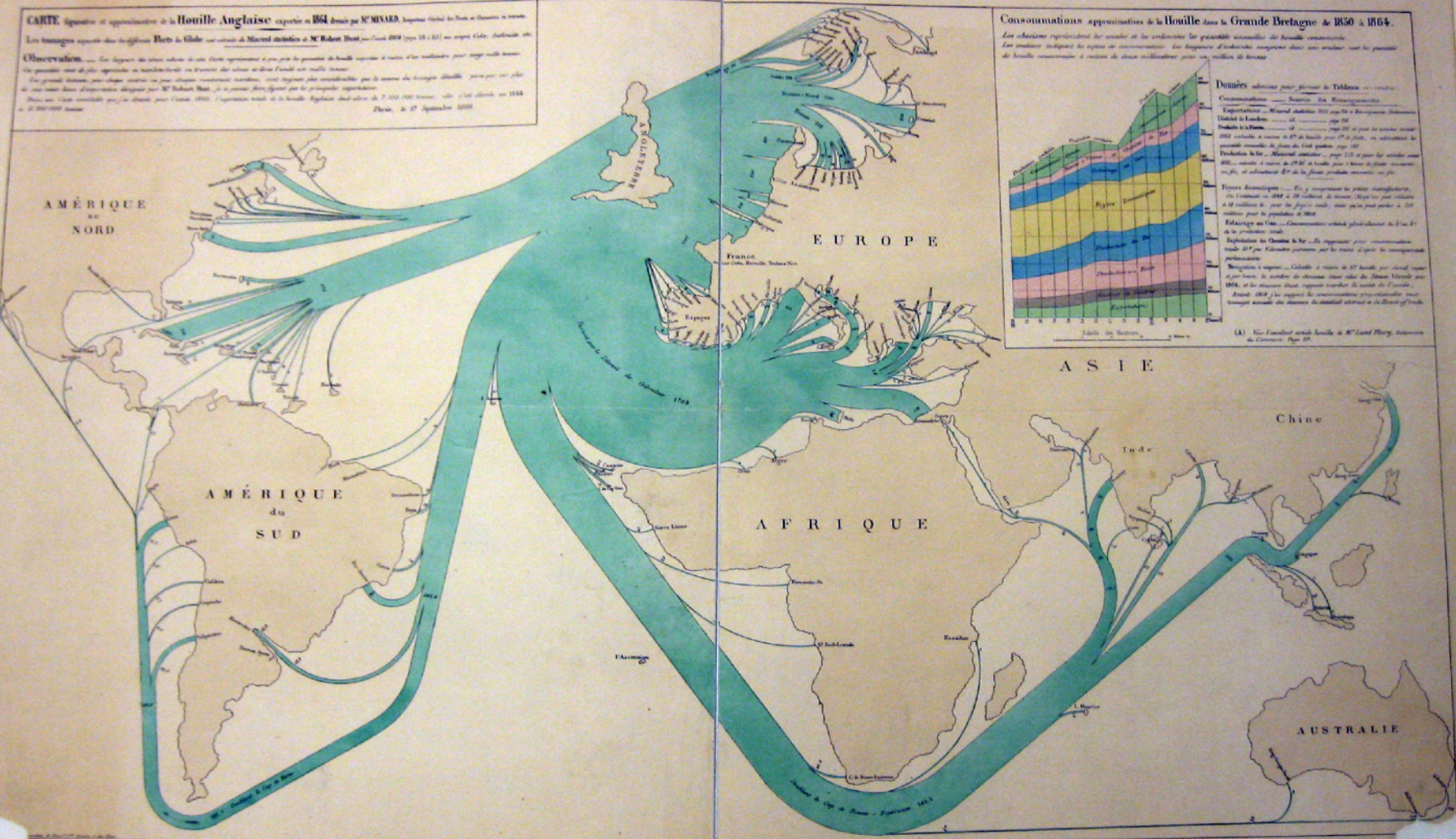
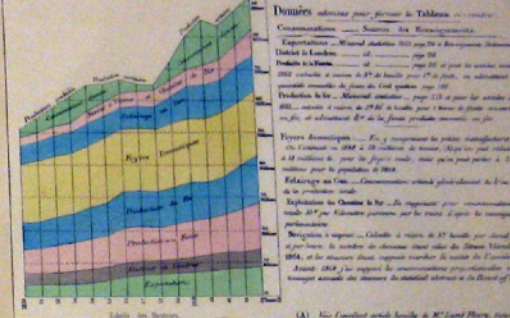
Les données sont basées sur les chiffres publiés par M. Robert Hunt, le 10 janvier 1865, pour la première fois, par le principal rapporteur.

Paris, le 27 Septembre 1865.

**Consommations approximatives de la Houille dans la Grande Bretagne & 1850 à 1864.**

Les chiffres représentent les années et les courbes les quantités annuelles de houille consommées.

Les courbes indiquent le degré de consommation. Les lignes d'ordonnée comptent dans une année, non le produit de houille consommée à raison de deux millions pour un million de tonnes.



2094-626258

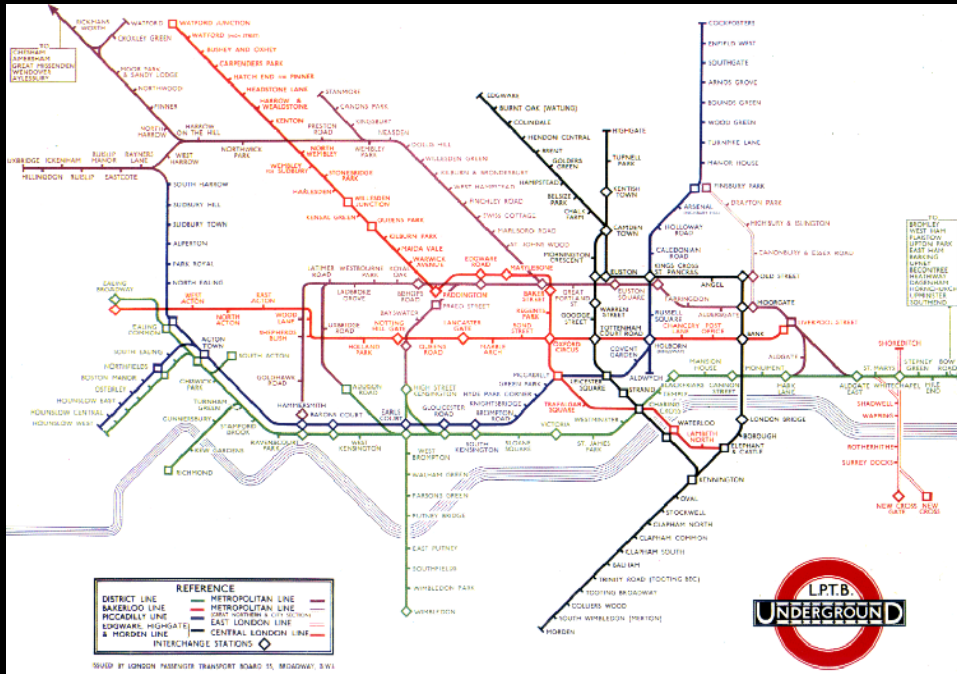
C.201-19-1864-M5

1864 British Coal Exports, Charles Minard

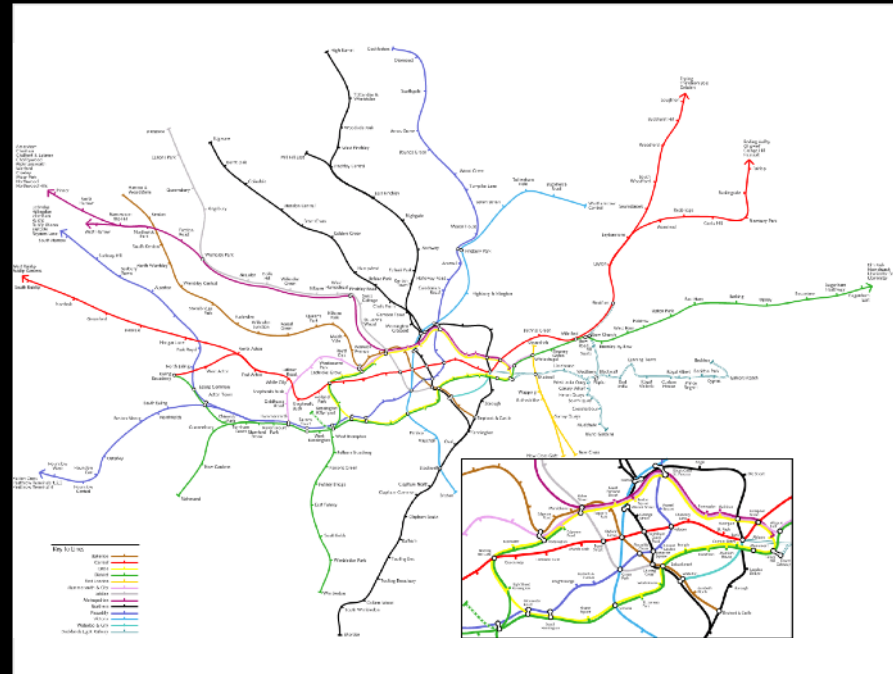








London Underground [Beck 33]



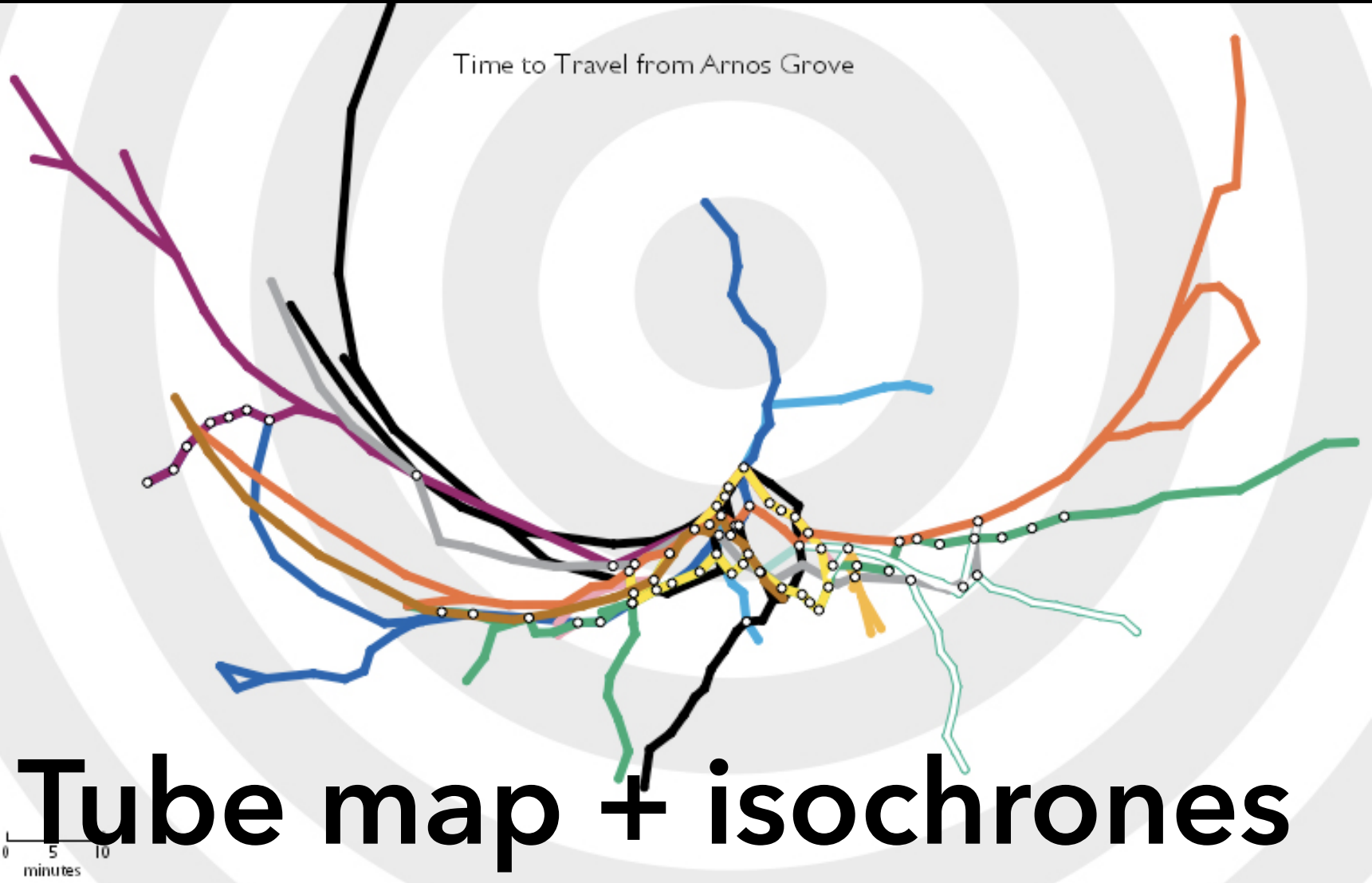
Geographic version of map

**Principle:** Straighten lines to emphasize stop sequence  
**Technique used to emphasize/de-emphasize information**



People \*love\*  
the tube map

Time to Travel from Arnos Grove

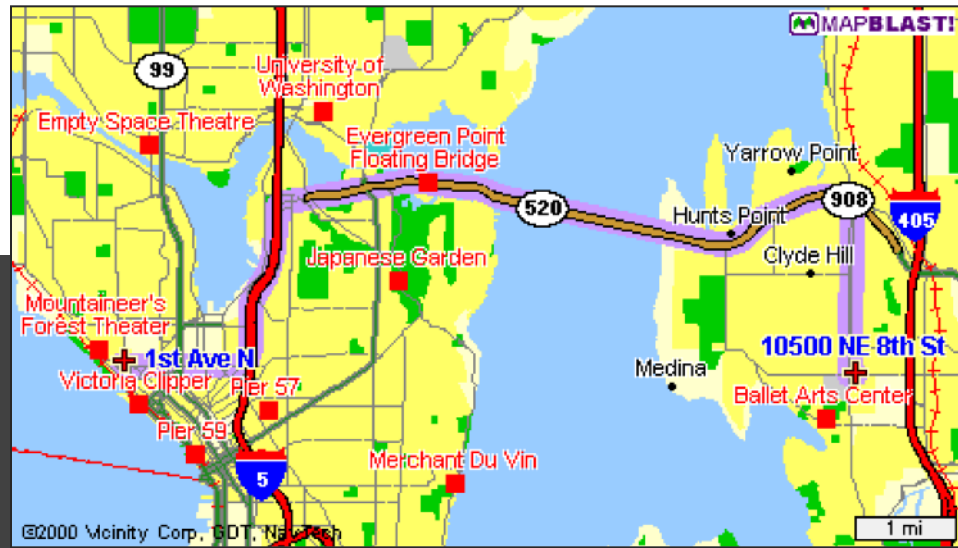
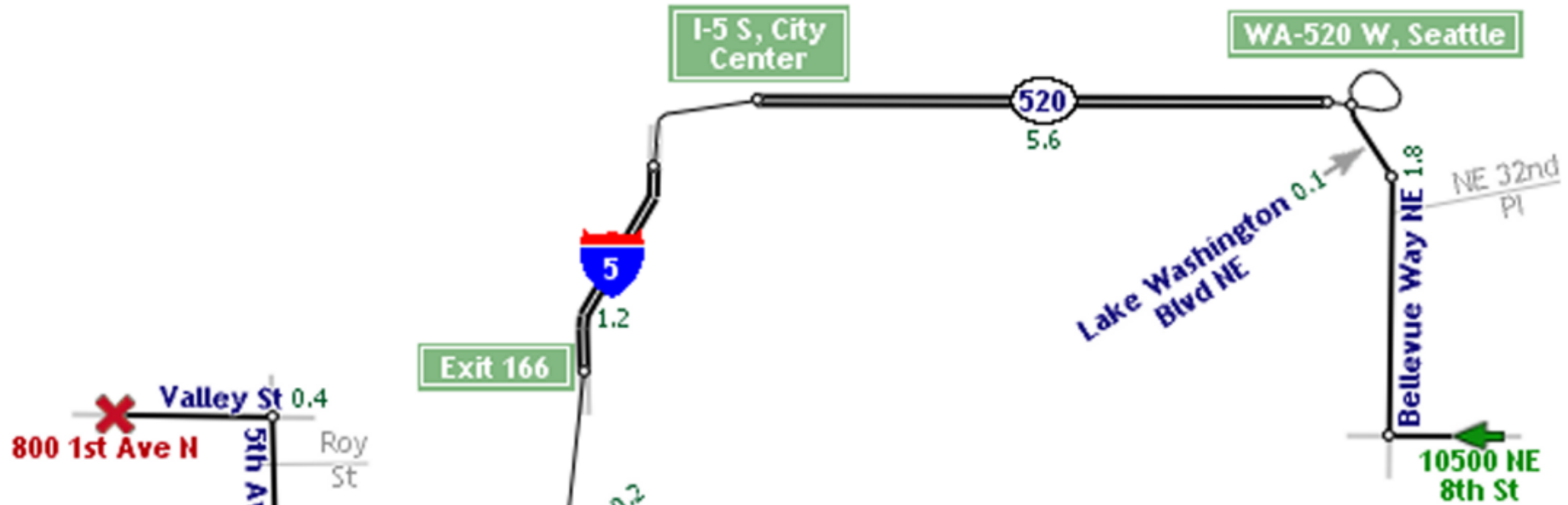


# Tube map + isochrones

0 5 10  
minutes



# Route Maps: Bellevue to Seattle



# Map Design via Optimization [Agrawala '01]

## Set of graphic elements

Roads, labels, cross-streets, ...

## Choose visual attributes

Position, orientation, size, ...

Distortions increase flexibility

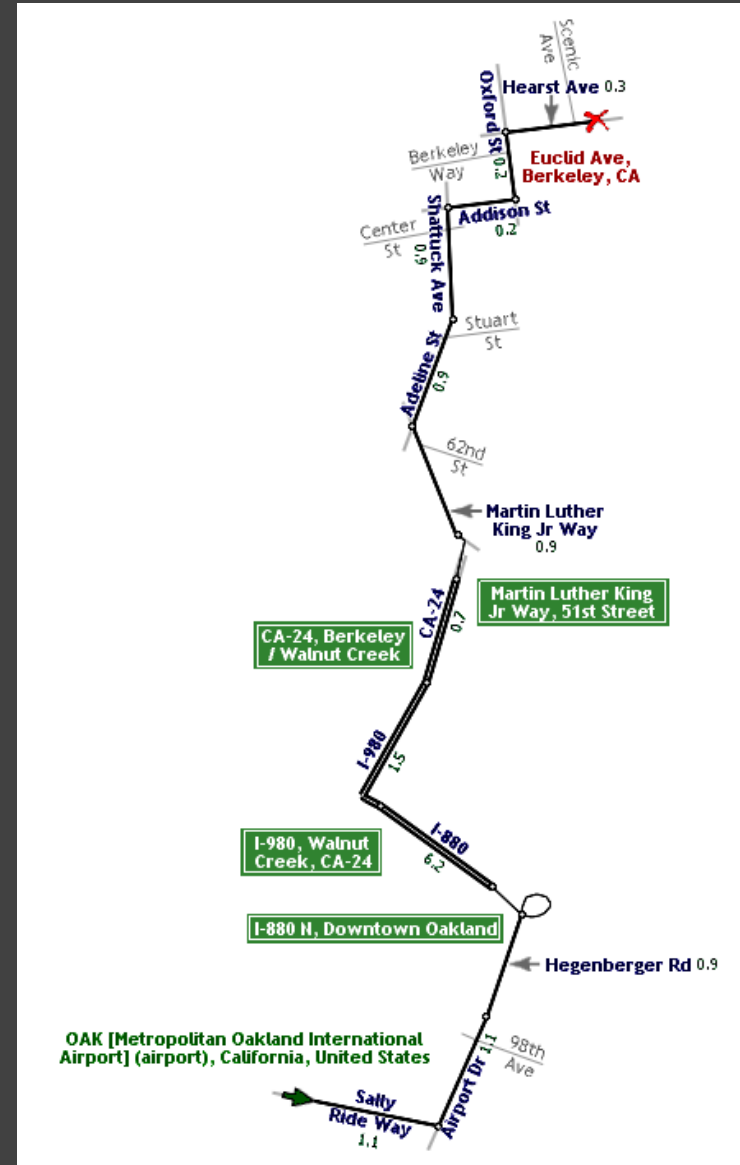
## Develop constraints based on design principles

## Simulated annealing

Perturb: Form a layout

Score: Evaluate quality

Minimize score



# Road Layout Constraints [Agrawala '01]

## Length

Ensure all roads visible

$$((L_{\min} - l(r_i)) / L_{\min})^2 * W_{\text{small}}$$

Maintain ordering by length

$$W_{\text{shuffle}}$$

## Orientation

Maintain original orientation

$$|a_{\text{curr}}(r_i) - a_{\text{orig}}(r_i)| * W_{\text{orient}}$$

## Topological errors

Prevent false

$$\min(d_{\text{origin}}, d_{\text{dest}}) * W_{\text{false}}$$

Prevent missing

$$d * W_{\text{missing}}$$

Ensure separation

$$\min(d_{\text{ext}}, E) * \text{Ext}$$

## Overall route shape

Maintain endpoint direction

$$|a_{\text{curr}}(v) - a_{\text{orig}}(v)| * W_{\text{enddir}}$$

Maintain endpoint distance

$$|d_{\text{curr}}(v) - d_{\text{orig}}(v)| * W_{\text{enddist}}$$



# Tools

# Software Tools

## Web Tools

**d3.geo**: projections, paths and more

**GeoJSON**: JSON format for geo data

**TopoJSON**: topology -> compressed GeoJSON

**Leaflet**: open-source, customizable map tile system

## Other

**PostGIS**: Postgres DB extensions for geo data

**Mapnik**: Render your own map tiles!

# Data Resources

## Natural Earth Data

[naturalearthdata.com](https://naturalearthdata.com)

## OpenStreetMap

[openstreetmap.org](https://openstreetmap.org)

## U.S. Government

[nationalatlas.gov](https://nationalatlas.gov), [census.gov](https://census.gov), [usgs.gov](https://usgs.gov)



# Tutorials

## Let's Make a Map!

<http://bost.ocks.org/mike/map/>

## How to Infer Topology

<http://bost.ocks.org/mike/topology/>