



STANFORD SOCIAL INNOVATION REVIEW PRESENTS

DATA ON PURPOSE

TELLING GREAT STORIES WITH DATA

February 9, 9:00 – 9:55 a.m.

Practice Safe Stats!: A PSA



Jake Porway

Founder and Executive
Director, DataKind

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StanfordSOCIAL
INNOVATION^{Review}



We live in revolutionary times.



YOU ARE JUST A NUMBER

Can you make yourself healthier and happier by logging every snore, step and mood swing? As a Californian trend for obsessional data-tracking makes its way over here, **Tim Chester** covers his body in gadgets to find out if self-knowledge is power. Photograph by Paul Stuart

Today I have climbed the equivalent of a tall giraffe. Coffee is my most frequent food. On average, I walk 11,726 steps a day, burning 3,089 calories, over 2.4 hours of activity. I sleep for 6 hours and 9 minutes a night. This week, my sleep efficiency is 72% and my food is 77% healthy. My BMI of 23.5 is 14 percentage points below the median for men my age, and my average daily Met score is 1.71, although I have no idea what a Met score is.

I am, it seems, nothing more than a bundle of numbers and milestones, spurred on by LEDs and chided by pop-up messages. A wireless accessory for the iPhone; perhaps its most sophisticated yet.

My arms are covered in bands, my pockets augmented with accelerometers, my eyes numb from all the charts, my heart pumping to the beat of a heart-rate monitor and forcing its ventricles to keep up with the national average. My head is about to implode from all the positive affirmation and gentle nudging, but it's OK because my memories are being saved to my hard drive and my mood swings are earning me "hugs" from strangers.

I am producing, analysing and socially sharing personal data. I am becoming fitter, happier, and more productive. I am staying motivated by earning badges. I have become a Quantified Self (QS).

The QS movement that I've temporarily joined began, as these things tend to do, in San Francisco's Bay Area in 2007. Two Wired magazine editors, Gary Wolf and Kevin

 **369 MINS**
Sleep per night

 **73**
bpm

 **582**
photos logged

 **11,726**
steps walked





OLD SYSTEM

BAP workers handwrote bike repayment transactions



NEW SYSTEM

With Open Data Kit, BAP has improved data collection efficiencies & data analysis

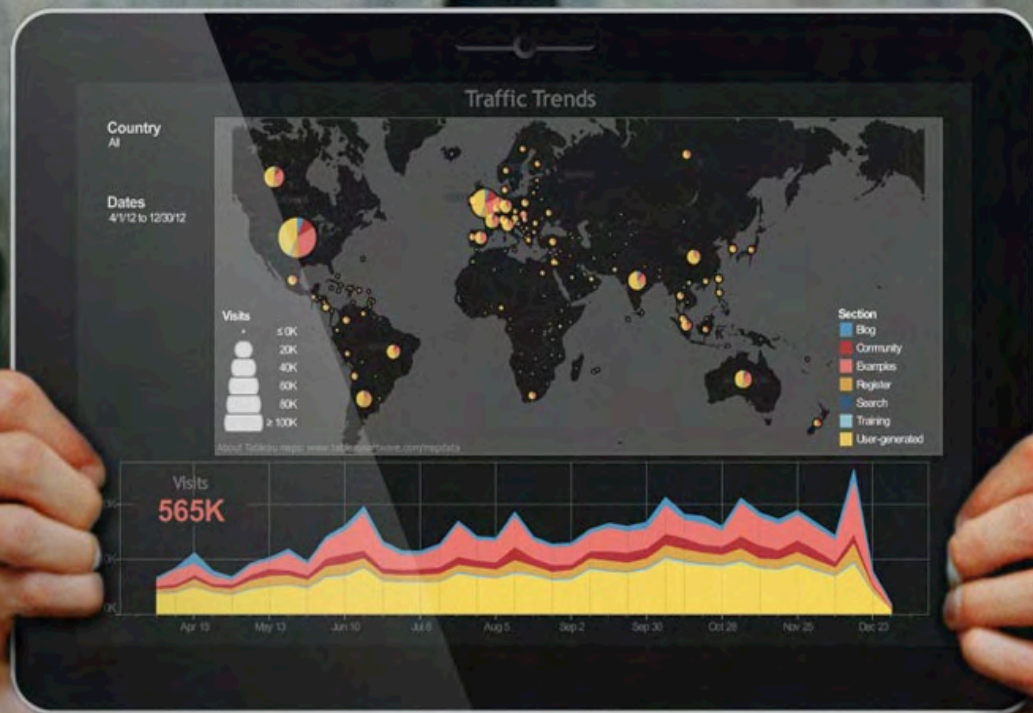


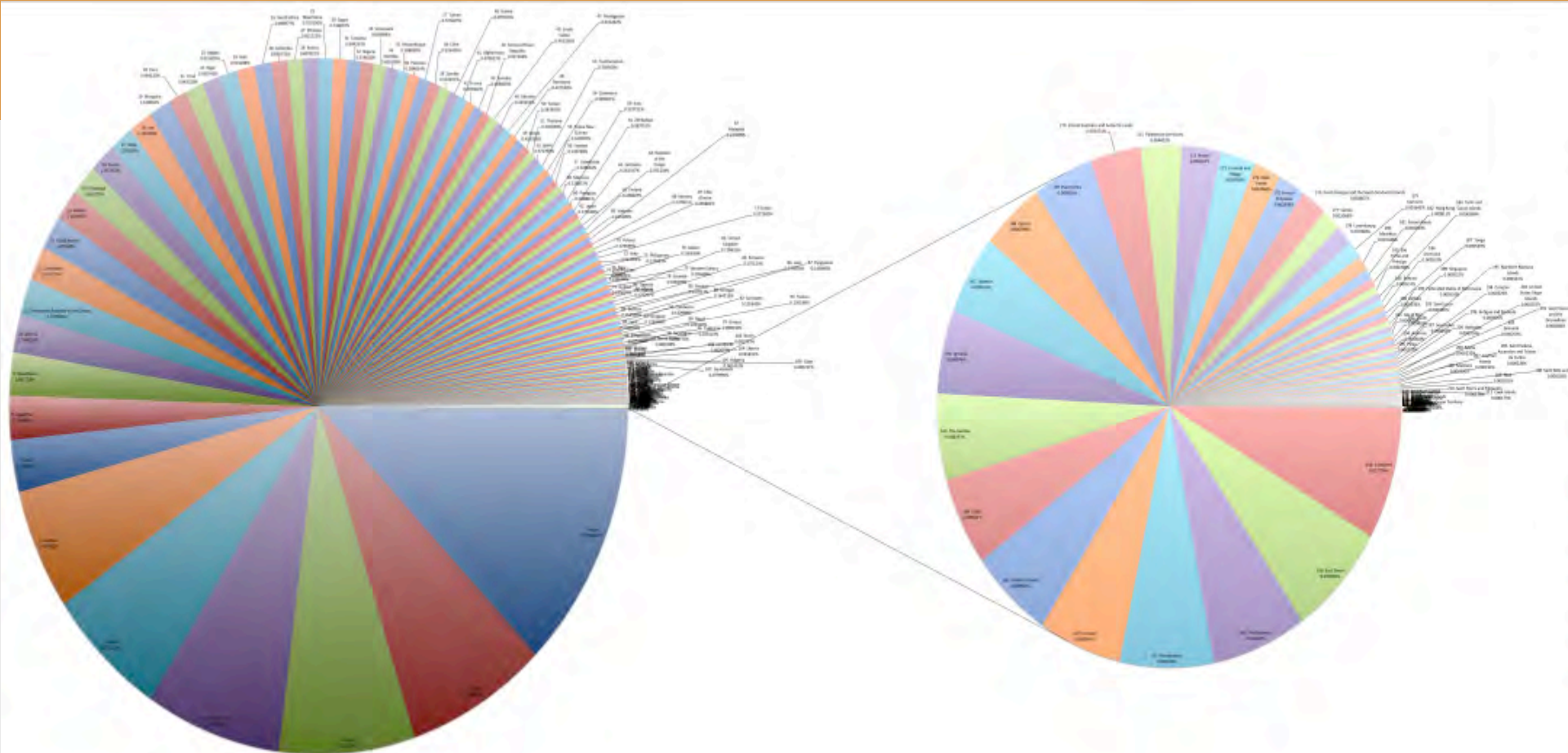
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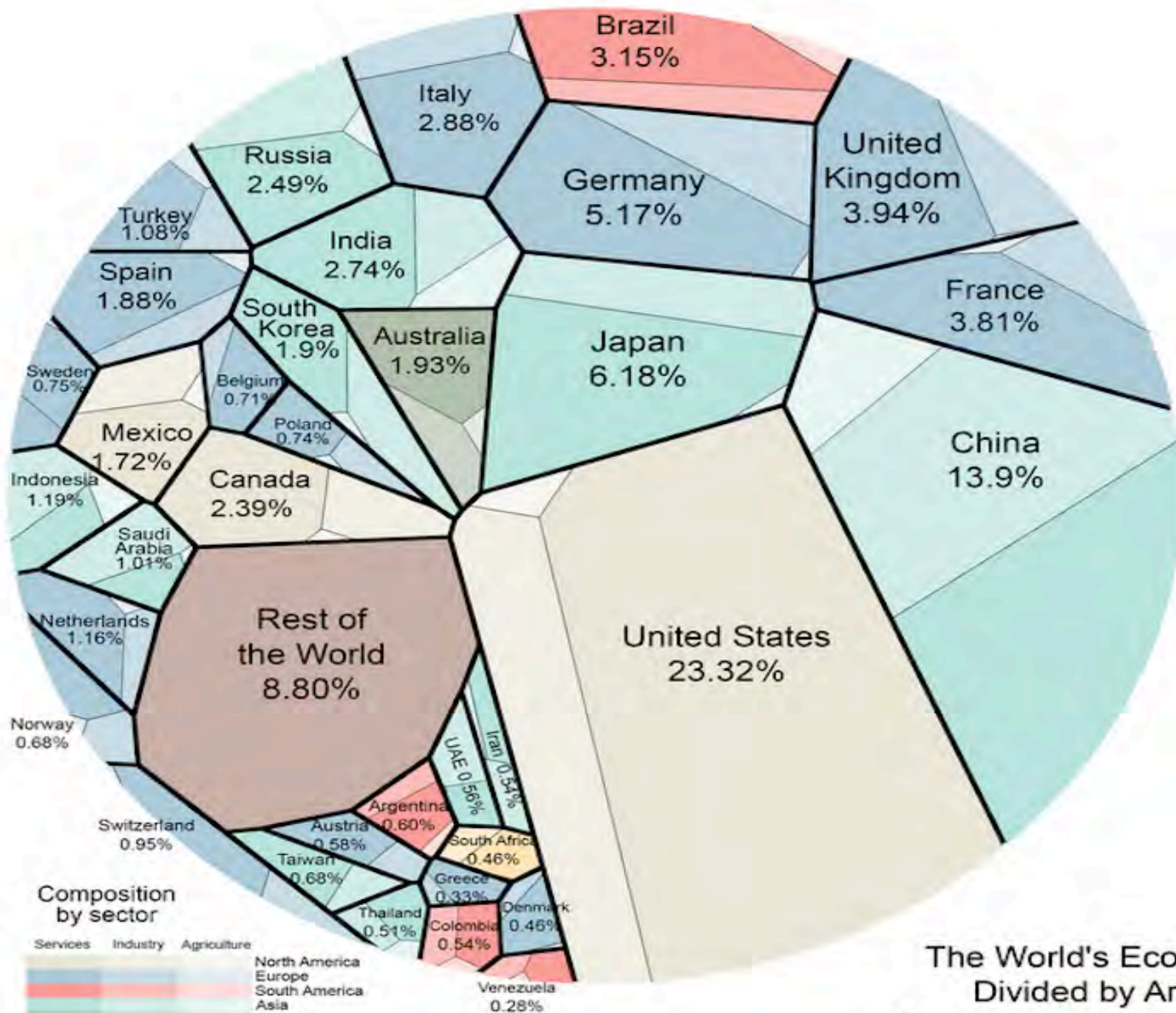
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The World's Economy
Divided by Area

howmuch.net



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WEAPONS OF CHOICE

BANG! EDITOR FIRED AFTER PUBLISHING GUN-OWNER MAP

Released addresses of permit holders, then hired armed guard herself

Published: 08/07/2013 at 9:32 PM

ADVERTISEMENT

• **High Power Flashlight Selling Out Fast**

G700 Tactical Flashlight

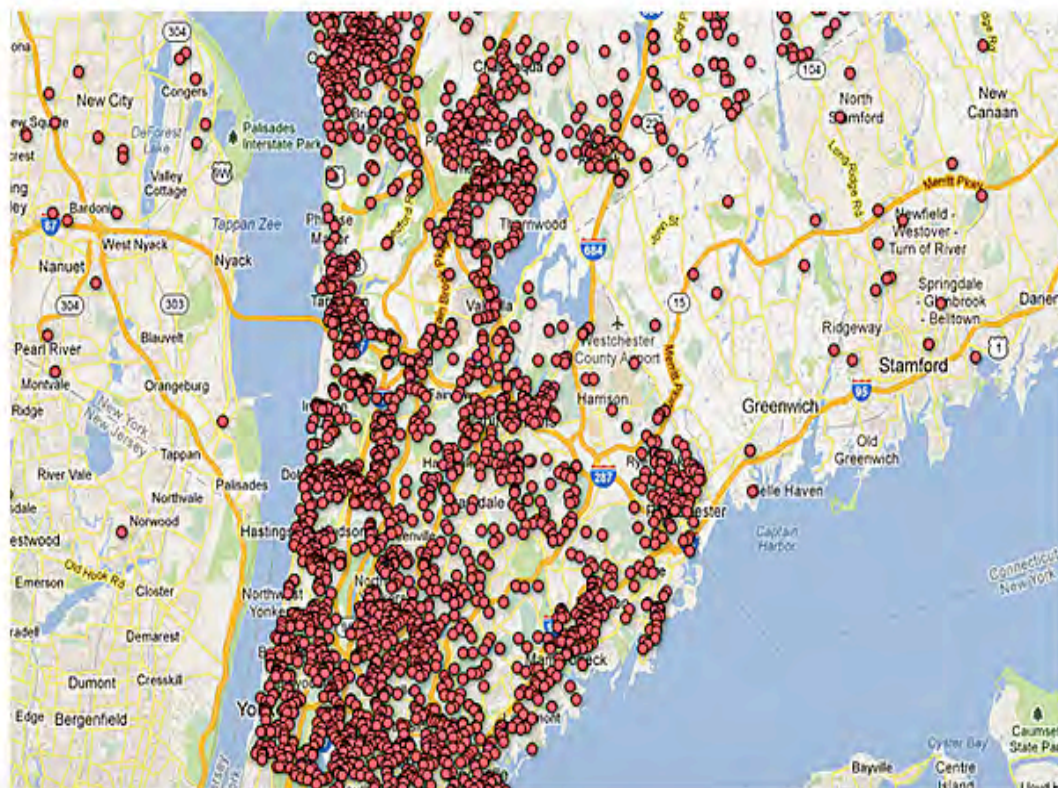
• **Brilliant Mortgage Payoff Method Has Banks On...**

Comparisons.org

• **iPhone 6 Plus's Being Sold for Next to Nothing**

QuiBids

Sponsored Links



WND RELATED STORIES

[Town imposes essay-writing for gun permit](#)

[1st challenge to Obama's gun orders hits court](#)

[Now foster parents can't have guns](#)

[Select Obama invite went to 'f--k police officers' professor](#)

[NRA's Wayne LaPierre challenges Obama to debate](#)

[U.S. attorney general to 'institutionalize' Obama gun laws](#)

[Gun-control comment backfires on White House](#)

[Congressman to Obama: 'Target the lawbreakers'](#)

[Obama gun grab shot down by 'American Sniper' widow](#)

[Obama admits: 'I've never owned a gun'](#)

[Sheriff David Clarke: Obama, Clinton 'anti-gun bigots'](#)

The Trials and Tribulations of Data Visualization for Good

OR

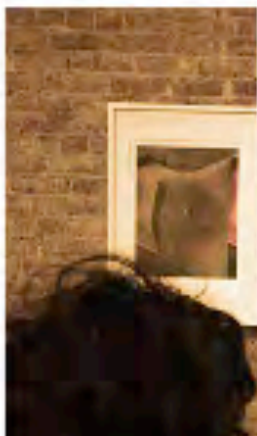
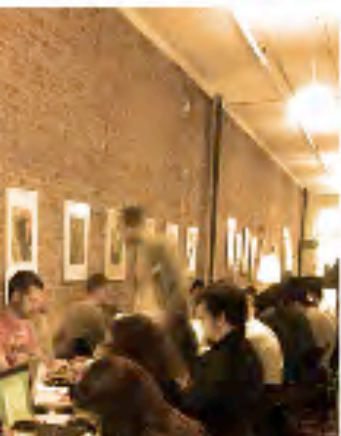
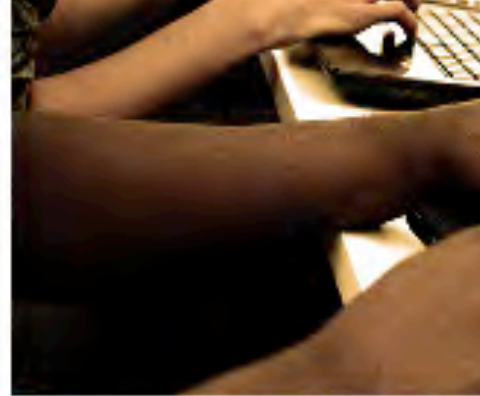
How to Practice Safe Stats



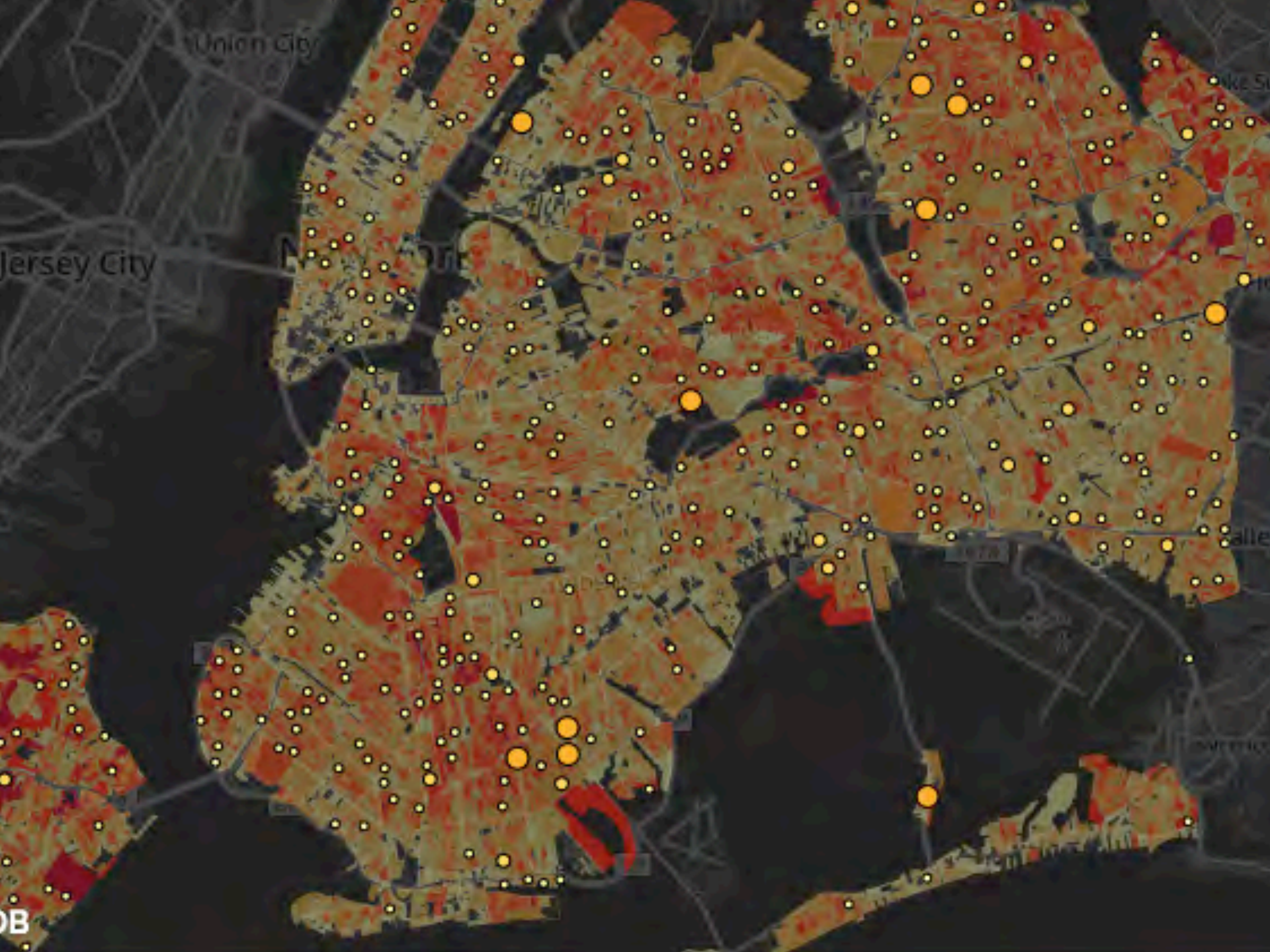


DataKind

Harnessing the power
of data science in the
service of humanity.







- 311 2010-present
- ☒ COMBINE INTO ONE CSV
 - ☐ SCRUB NAMES
 - ☐ LOW LAT

2005-present

Inventory census

TREE MGMT SYSTEM

- ☒ ACCESS TO CSV
- ☐ SCRUB NAMES
- ☐ GEOCODE (padding - NYC Parks with)

1998-2008

Brooklyn only 1997-2008

1. Prob of tree falling?
2. # trees falling?



$$E(\#) = \frac{1}{\#} \cdot \# \text{ Trees}$$

TREE SPECIES CHARACTERISTICS

- USDA Plant Database
- VA Tech Dendrology Website
- NYC Parks Website, 'Approved Species' & Florida IFAS Extension

Data...?

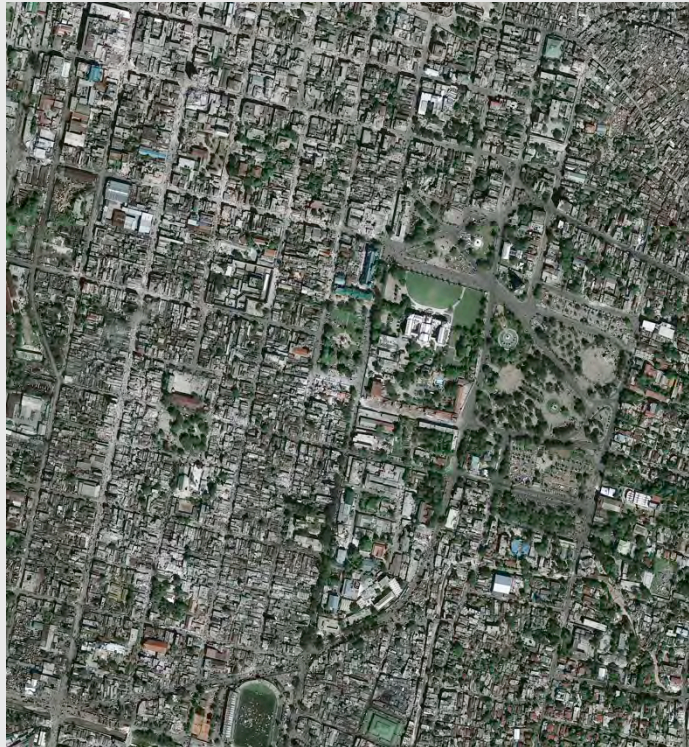
“535 visitors to stanford.edu”

“99% retention rate”

“1 in 3 African Americans”

“\$140,000 in Q3”

...Or Data?



samplelog.log

```
1 #Software: Microsoft Internet Information Services X.X-
2 #Version: X-
3 #Date: 2010-03-24 07:00:01-
4 #Fields: date time s-sitename s-computername s-ip cs-method cs-uri-stem cs-uri-query s-port cs-
5 2010-03-24 07:00:01 ZZZZC941948879 RUFFLES 222.222.222.222 GET / - 80 - 220.181.7.113 HTTP/1.1
6 2010-03-24 07:00:23 ZZZZC941948879 RUFFLES 222.222.222.222 GET /2009/12/im_not_mean_im_just_ar
7 2010-03-24 07:00:32 ZZZZC941948879 RUFFLES 222.222.222.222 GET /terminal-blank.gif - 80 - 217.
8 2010-03-24 07:00:32 ZZZZC941948879 RUFFLES 222.222.222.222 GET /grep-options.gif - 80 - 217.23
9 2010-03-24 07:00:32 ZZZZC941948879 RUFFLES 222.222.222.222 GET /terminal-cat.gif - 80 - 217.23
10 2010-03-24 07:00:32 ZZZZC941948879 RUFFLES 222.222.222.222 GET /terminal-pwd-cd.gif - 80 - 217
11 2010-03-24 07:00:39 ZZZZC941948879 RUFFLES 222.222.222.222 GET /robots.txt - 80 - 95.55.207.95
12 2010-03-24 07:00:39 ZZZZC941948879 RUFFLES 222.222.222.222 GET /rss-short.xml - 80 - 173.45.23
13 2010-03-24 07:00:43 ZZZZC941948879 RUFFLES 222.222.222.222 GET /2009/08/22-things-you-dont-kno
14 2010-03-24 07:00:44 ZZZZC941948879 RUFFLES 222.222.222.222 GET /screen.css - 80 - 98.88.35.135
15 2010-03-24 07:00:44 ZZZZC941948879 RUFFLES 222.222.222.222 GET /img/rss-header-red.gif - 80 -
16 2010-03-24 07:00:44 ZZZZC941948879 RUFFLES 222.222.222.222 GET /img/logo.jpg - 80 - 98.88.35.1
17 2010-03-24 07:00:44 ZZZZC941948879 RUFFLES 222.222.222.222 GET /img/input-emailsend.jpg - 80 -
18 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /images/cm-ebook-banner.gif - 8
19 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /img/bg.jpg - 80 - 98.88.35.135
20 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /img/bg-top.jpg - 80 - 98.88.35
21 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /21things/checkout-login.gif -
22 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /img/topnav-contact.jpg - 80 -
23 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /21things/portent-email-sub.gif
24 2010-03-24 07:00:45 ZZZZC941948879 RUFFLES 222.222.222.222 GET /rss-header.jpg - 80 - 98.88.35
```



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
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Statistics...?

California

Want more? [Browse data set](#)

People QuickFacts	California
 Population, 2014 estimate	38,802,500
 Population, 2010 (April 1) estimates base	37,254,503
 Population, percent change - April 1, 2010 to July 1, 2014	4.2%
 Population, 2010	37,253,956
 Persons under 5 years, percent, 2014	6.5%
 Persons under 18 years, percent, 2014	23.6%
 Persons 65 years and over, percent, 2014	12.9%
 Female persons, percent, 2014	50.3%
<hr/>	
 White alone, percent, 2014 (a)	73.2%
 Black or African American alone, percent, 2014 (a)	6.5%
 American Indian and Alaska Native alone, percent, 2014 (a)	1.7%
 Asian alone, percent, 2014 (a)	14.4%
 Native Hawaiian and Other Pacific Islander alone, percent, 2014 (a)	0.5%
 Two or More Races, percent, 2014	3.7%
 Hispanic or Latino, percent, 2014 (b)	38.6%
 White alone, not Hispanic or Latino, percent, 2014	38.5%
<hr/>	
 Living in same house 1 year & over, percent, 2009-2013	84.7%



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...or Statistics?

same length N . The derivation is equally valid if the document lengths vary.

According to the model, the total probability of the model is:

$$P(\mathbf{W}, \mathbf{Z}, \boldsymbol{\theta}, \boldsymbol{\varphi}; \alpha, \beta) = \prod_{i=1}^K P(\varphi_i; \beta) \prod_{j=1}^M P(\theta_j; \alpha) \prod_{t=1}^N P(Z_{j,t} | \theta_j) P(W_{j,t} | \varphi_{Z_{j,t}}),$$

where the bold-font variables denote the vector version of the variables. First of all, $\boldsymbol{\varphi}$ and $\boldsymbol{\theta}$ need to be integrated out.

$$\begin{aligned} P(\mathbf{Z}, \mathbf{W}; \alpha, \beta) &= \int_{\boldsymbol{\theta}} \int_{\boldsymbol{\varphi}} P(\mathbf{W}, \mathbf{Z}, \boldsymbol{\theta}, \boldsymbol{\varphi}; \alpha, \beta) d\boldsymbol{\varphi} d\boldsymbol{\theta} \\ &= \int_{\boldsymbol{\varphi}} \prod_{i=1}^K P(\varphi_i; \beta) \prod_{j=1}^M \prod_{t=1}^N P(W_{j,t} | \varphi_{Z_{j,t}}) d\boldsymbol{\varphi} \int_{\boldsymbol{\theta}} \prod_{j=1}^M P(\theta_j; \alpha) \prod_{t=1}^N P(Z_{j,t} | \theta_j) d\boldsymbol{\theta}. \end{aligned}$$

All the θ s are independent to each other and the same to all the φ s. So we can treat each θ and each φ separately. We now focus only on the θ part.

$$\int_{\boldsymbol{\theta}} \prod_{j=1}^M P(\theta_j; \alpha) \prod_{t=1}^N P(Z_{j,t} | \theta_j) d\boldsymbol{\theta} = \prod_{j=1}^M \int_{\theta_j} P(\theta_j; \alpha) \prod_{t=1}^N P(Z_{j,t} | \theta_j) d\theta_j.$$

We can further focus on only one θ as the following:

$$\int_{\theta_j} P(\theta_j; \alpha) \prod_{t=1}^N P(Z_{j,t} | \theta_j) d\theta_j.$$

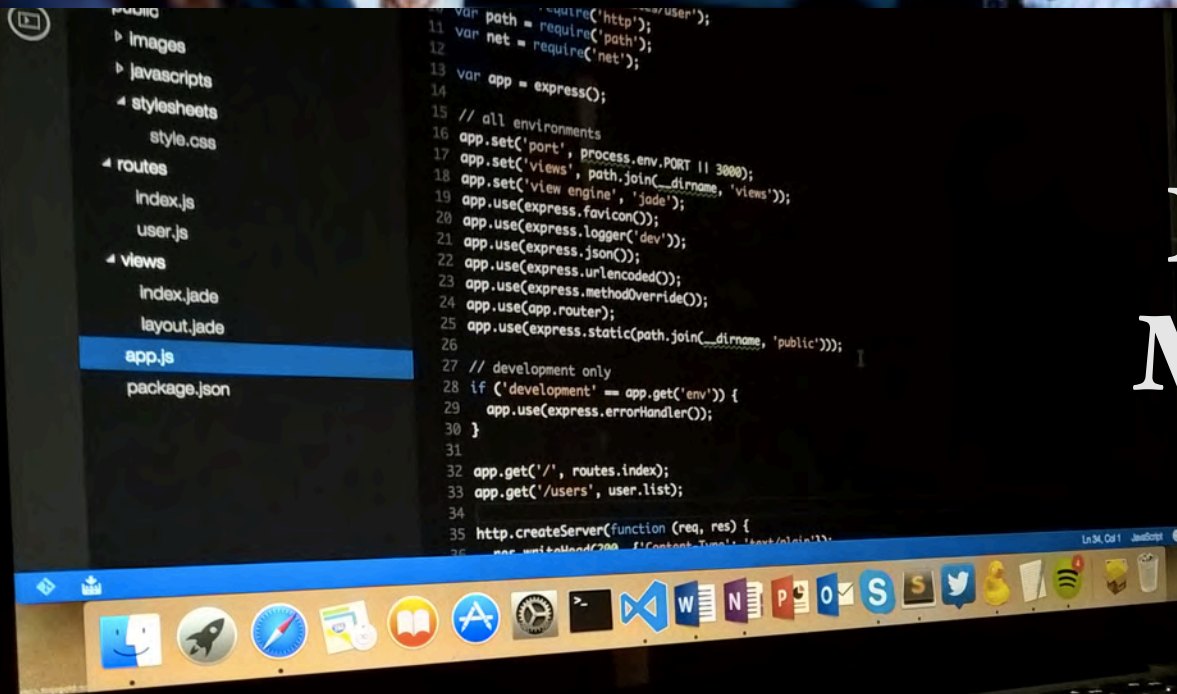
Actually, it is the hidden part of the model for the j^{th} document. Now we replace the probabilities in the above equation by the true distribution expression to write

$$\int_{\theta_j} P(\theta_j; \alpha) \prod_{t=1}^N P(Z_{j,t} | \theta_j) d\theta_j = \int_{\theta_j} \frac{\Gamma(\sum_{i=1}^K \alpha_i)}{\prod_{i=1}^K \Gamma(\alpha_i)} \prod_{i=1}^K \theta_{j,i}^{\alpha_i - 1} \prod_{t=1}^N P(Z_{j,t} | \theta_j) d\theta_j.$$

Data for Humans (Viz)



Data for Machines (Stats)



**HUMAN
BEHAVIOR
FLOWS FROM
THREE MAIN
SOURCES:
DESIRE,
EMOTION, AND
KNOWLEDGE.**

PLATO





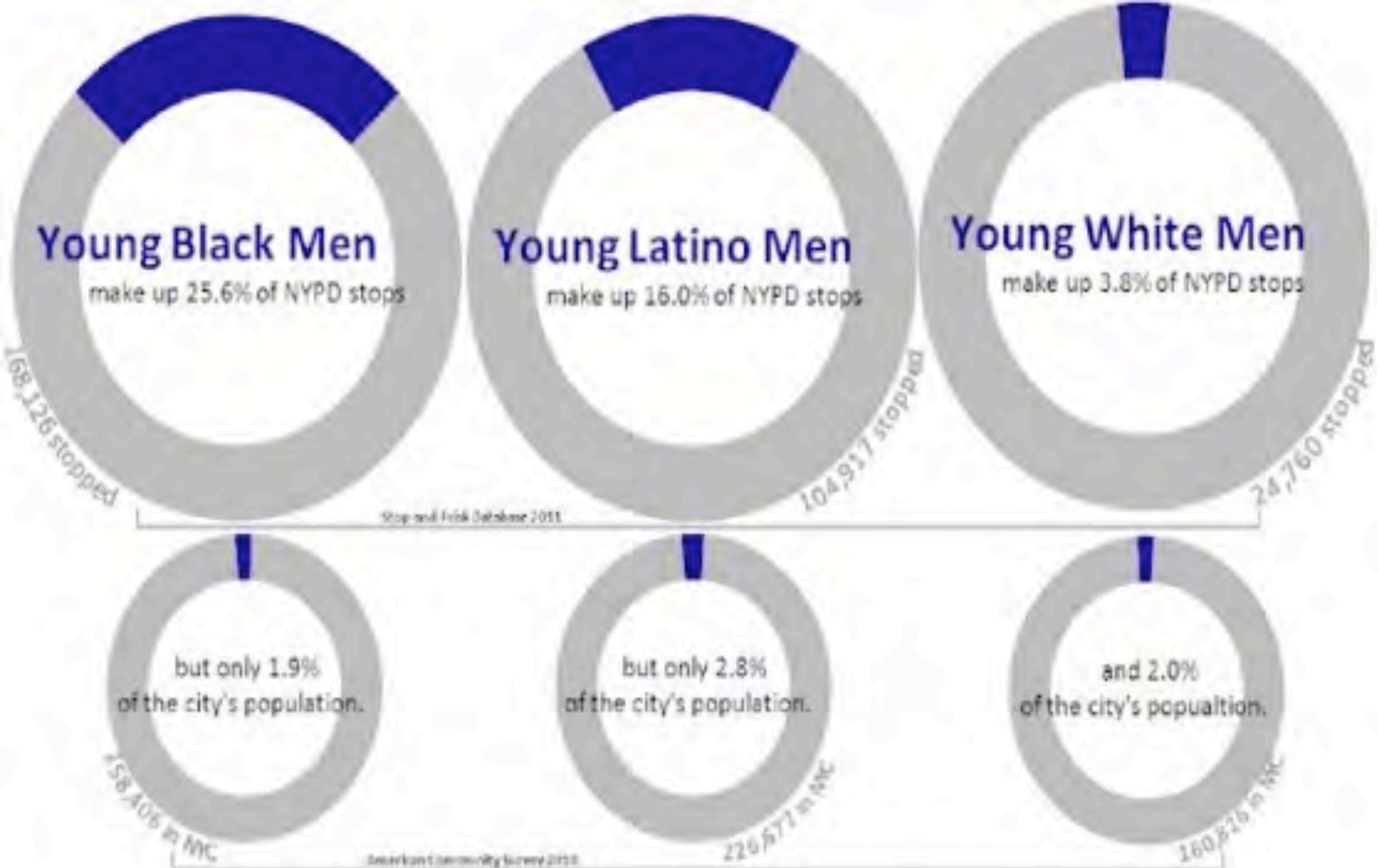
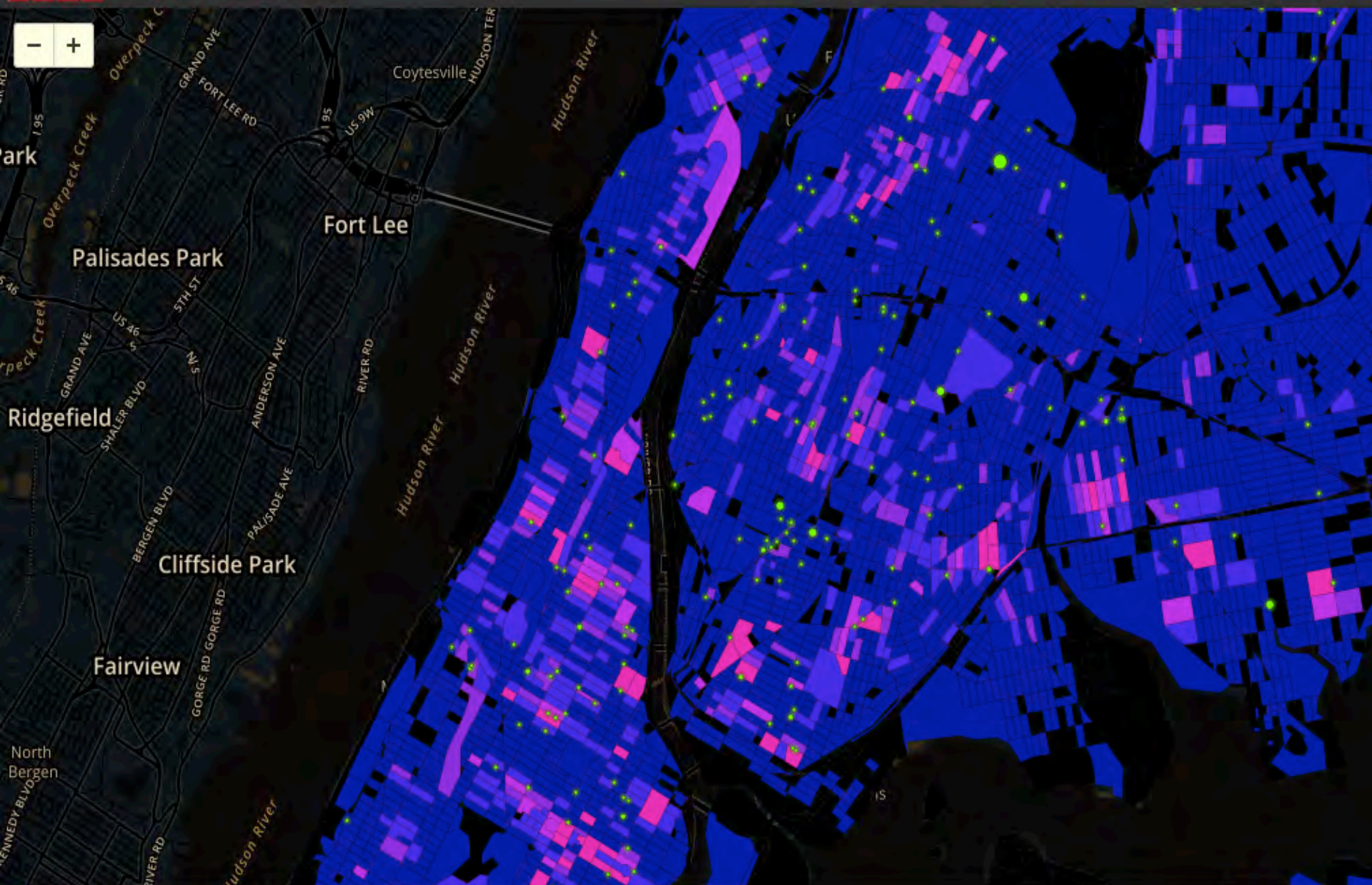


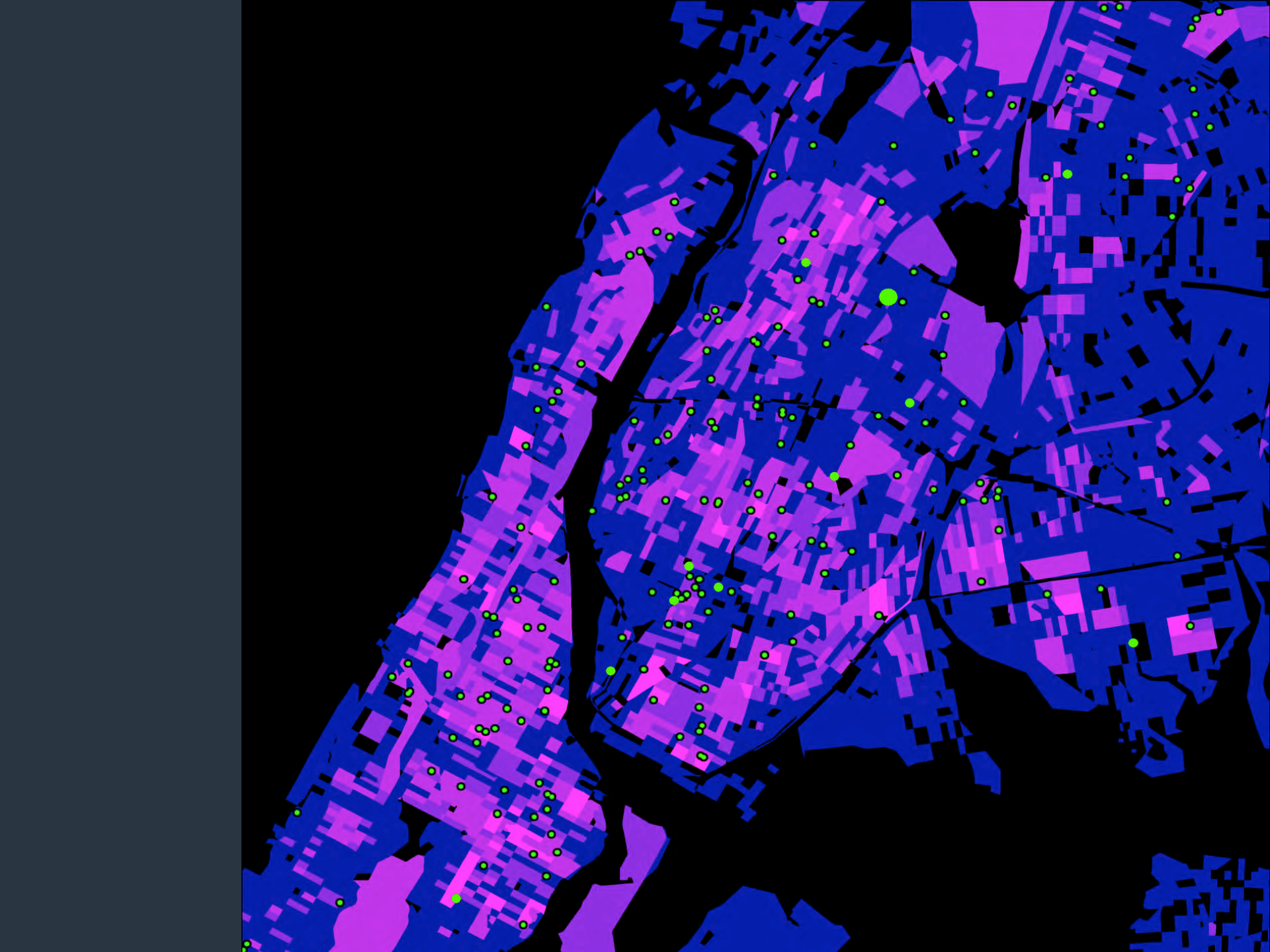
Image by the New York Civil Liberties Union.



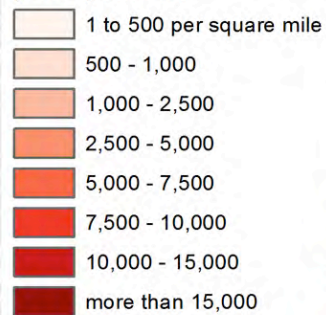
Colors reflect total stops in one block:

Color	Stops
Blue	1
Light Blue	100
Light Red	200
Red	300
Dark Red	400
Dark Red	+

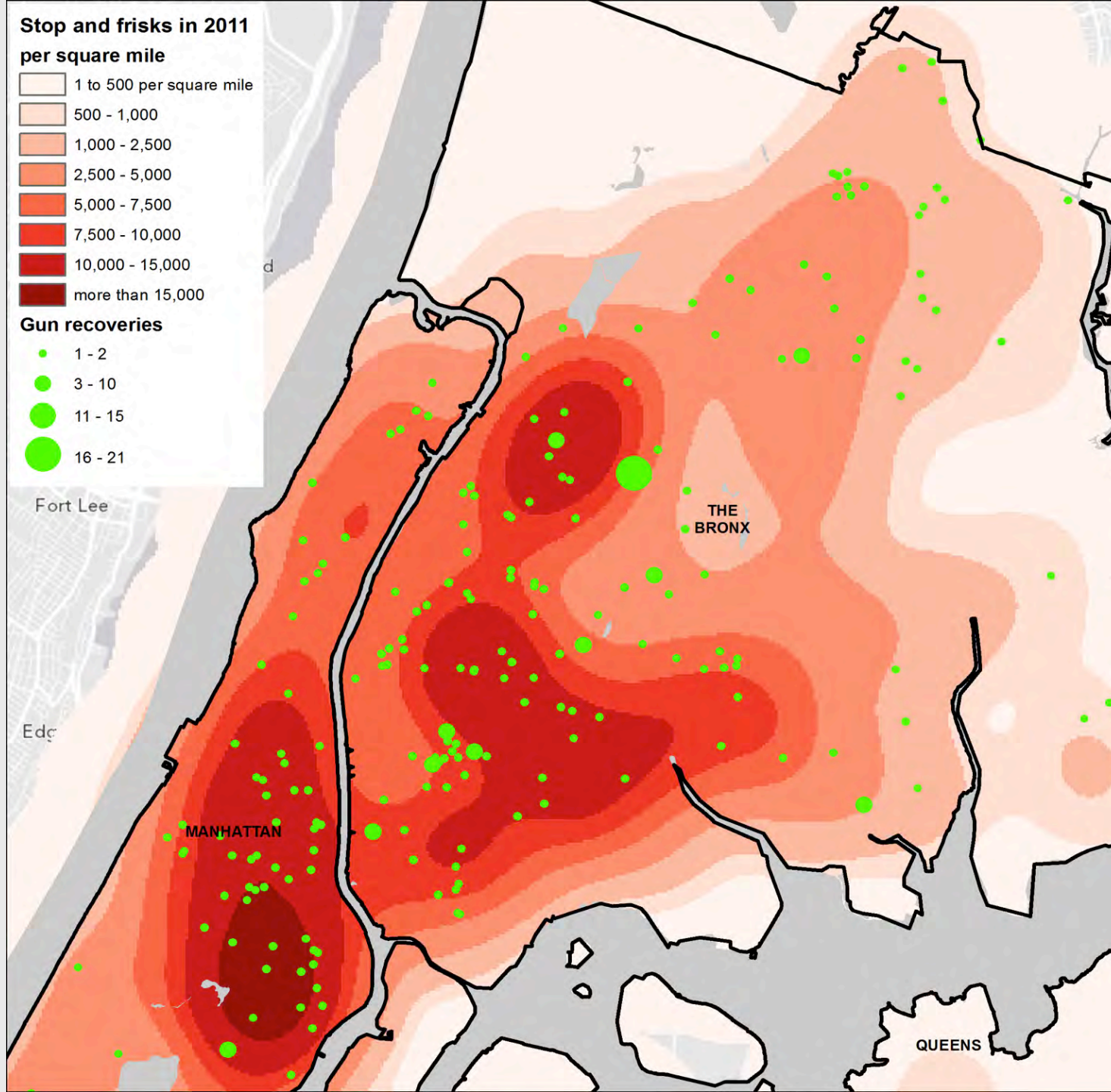
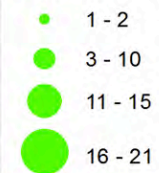
Dots mark stops where a gun was found. Bigger dots indicate groups of stops. All data 2011.



**Stop and frisks in 2011
per square mile**



Gun recoveries



Stop and Frisk Data API

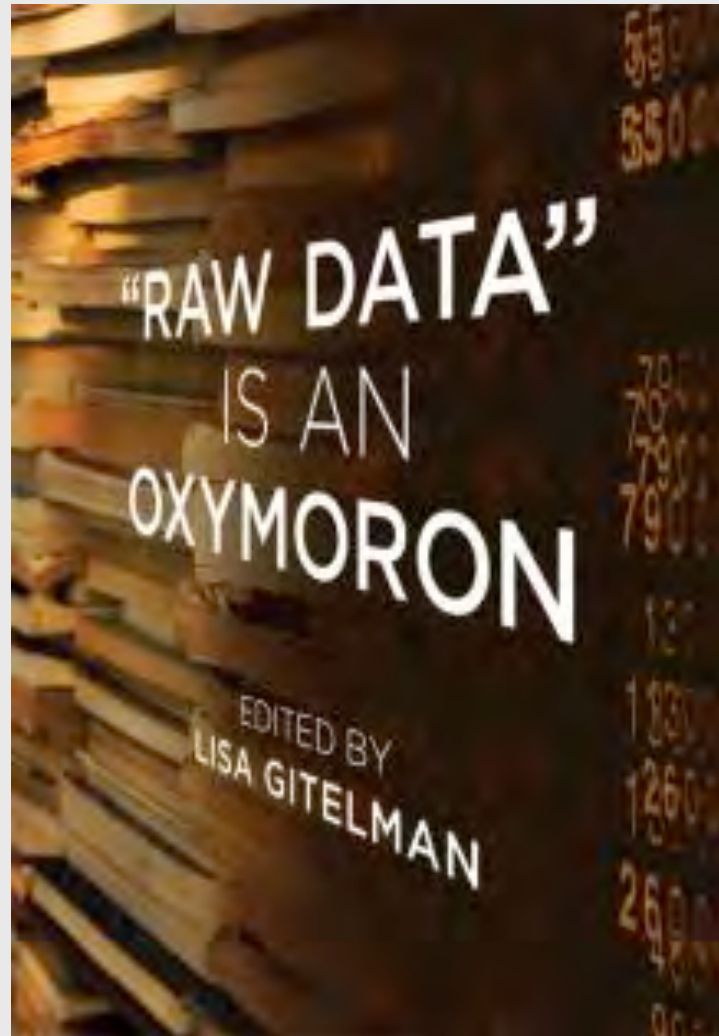
4259606 total records match your query

[Learn more](#)

[Previous Page](#)

[Next Page](#)

crimsusp	age	sex	crossst	race	build	frisked	_id
CPW	28	M	NEWTOWN ROAD	P	M	False	506ec425519d0b5bf11415ea
BURGLARY	26	M	37 AVENUE	Q	M	True	506ec425519d0b5bf11415eb
BURG	32	M	GORDON STREET	B	M	True	506ec425519d0b5bf11415ec
GRAND LARCENY AUTO	36	M		B	M	False	506ec425519d0b5bf11415ed
C.P.W.	18	Z		Z	T	True	506ec425519d0b5bf11415ee
FEL	20	M	SAGAMORE AVENUE	B	T	False	506ec425519d0b5bf11415ef
ROBBERY	35	M		Q	M	False	506ec425519d0b5bf11415f0
M	20	F	NEPTUNE AVENUE	Q	M	False	506ec425519d0b5bf11415f1
CPW	24	M		Q	M	True	506ec425519d0b5bf11415f2
CPW	14	M		B	M	True	506ec425519d0b5bf11415f3
FEL/ROBBERY	16	M	67 AVENUE	B	M	True	506ec425519d0b5bf11415f4
NARCOTICS SALE	20	Z		B	M	True	506ec425519d0b5bf11415f5
GRAND LARCENY AUTO	19	M		Q	M	False	506ec425519d0b5bf11415f6
MISD. FIREWORKS	19	M		Q	T	False	506ec425519d0b5bf11415f7
QUESTIONING	23	F		Q	H	False	506ec425519d0b5bf11415f8



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Tips To Keep In Mind



We look at the present
through a rear-view
mirror.

We march
backwards
into the future

- 1. It's hard to imagine how a new medium is used at first.**

Statement of Functional Expenses

THE AMERICAN RED CROSS

Statement of Functional Expenses

Year ended June 30, 2004

(with summarized information for the year ended June 30, 2003)

(In thousands)

	Program Services								Total Program Services
	Armed Forces Emergency Services	Domestic Disaster Services	Liberty Disaster Relief - Sept 11 Response	Biomedical Services	Health and Safety Services	Community Services	Int'l Relief & Development Services		
Salaries and wages	\$ 33,987	\$ 75,980	\$ 8,886	\$ 835,690	\$ 100,134	\$ 55,743	\$ 12,736	\$ 1,122,726	
Employee benefits	8,940	30,151	1,733	229,125	25,247	14,651	3,519	303,316	
Subtotal	42,927	106,131	10,619	1,064,815	125,381	70,394	16,255	1,426,042	
Travel and maintenance	1,133	15,552	288	32,619	3,834	3,210	2,360	58,956	
Equipment maintenance and rental	1,030	9,629	182	59,606	4,334	3,293	9,234	86,907	
Supplies and materials	2,572	15,463	195	455,247	39,583	17,657	806	529,401	
Contractual services	8,866	47,089	8,310	403,892	32,514	20,220	10,481	593,571	
Financial and material assistance	2,588	69,483	32,567	3,368	2,890	13,516	23,081	147,273	
Depreciation and amortization	1,790	10,807	-	53,032	2,511	4,208	546	78,874	
Total expenses	\$ 60,896	\$ 281,651	\$ 52,101	\$ 2,133,382	\$ 316,205	\$ 125,495	\$ 54,363	\$ 2,914,736	

	Supporting Services					Total Expenses	
	Fund Raising	Management and General	Total Supporting Services				
				2004	2003		
Salaries and wages	\$ 44,530	\$ 88,617	\$ 131,147	\$ 1,253,873	\$ 1,234,120		
Employee benefits	11,610	23,598	35,208	338,524	295,063		
Subtotal	56,140	110,215	166,355	1,592,397	1,529,183		
Travel and maintenance	2,430	4,591	7,021	66,107	86,433		
Equipment maintenance and rental	1,442	5,065	6,507	67,014	51,148		
Supplies and materials	13,482	5,550	19,031	548,932	565,608		
Contractual services	34,083	32,920	67,003	660,376	630,354		
Financial and material assistance	1,014	3,405	2,417	149,090	378,434		
Depreciation and amortization	2,597	13,765	16,362	95,236	88,494		
Total expenses	\$ 111,178	\$ 173,518	\$ 284,696	\$ 3,199,452	\$ 3,169,653		

See accompanying notes to the consolidated financial statements.

March 2006

corporation for
**NATIONAL &
COMMUNITY
SERVICE** 

MAM 2012 ANNUAL REPORT

HOW DID YOU HELP YOUR NEIGHBORS IN 2012?

Total Population Helped

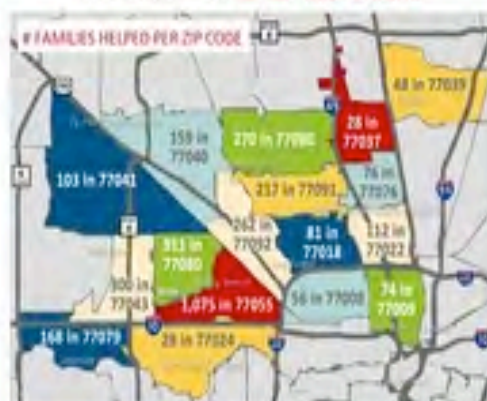
18,504

Unduplicated Family Count

4,642



MAM provides financial assistance to families in **17 ZIP CODES**



111: Out of Area 368: Homeless 111: Unreported

FAMILY ASSISTANCE PROGRAMS

Emergency Financial Assistance because sometimes there simply isn't enough income to cover basic needs, even for those who are working.



Rental assistance prevented eviction and homelessness for **1,090 FAMILIES**

559 FAMILIES received utility assistance



1,208 FAMILIES dressed for work and school with clothing from the MAM Bu-Sale Store



642 FAMILIES were able to get to work with transportation assistance

Help with clinic visits benefited

368 PEOPLE

258 PEOPLE received assistance to pay for necessary prescription medications



SELF-SUFFICIENCY PROGRAMS

Self-sufficiency means balancing the household budget on a regular basis and building assets for the future.

83% OF FAMILIES

receiving Case Management services were able to stabilize their budgets and remain housed 3+ months after leaving MAM's program



70 % OF STUDENTS enrolled in the Employment Certification Program found employment



87 INDIVIDUALS

attended classes to prepare for the GED Exam



5 INDIVIDUALS

took and passed the exam to become U.S. citizens after taking free citizenship classes at MAM



175 STUDENTS

learned English through MAM Adult ESL Classes



PROGRAMS FOR CHILDREN IN SCHOOL

Help children have what they need to learn, stay healthy and realize their potential.



5,714 CHILDREN

received essential clothing and supplies for the start of a new school year



325 KIDS RECEIVED EYE EXAMS AND GLASSES



through the I Can See Program



Christmas Share provided toys and warm blankets to

637 CHILDREN

from **210 FAMILIES**

517 CHILDREN

received free immunizations needed to return to and stay in class



VOLUNTEERS

Help MAM to serve the community in all of MAM's program areas. Volunteers have been the backbone of the organization for nearly 30 years. It takes a minimum of 40 volunteers each day to cover our doors to clients and customers.

340 INDIVIDUALS
22 GROUPS
95 STUDENTS

174 NATIONAL CHARITY LEAGUE MEMBERS & THEIR DAUGHTERS



859 TOTAL VOLUNTEERS

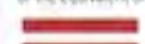
Volunteers contributed

52,440 HOURS

of their time



or the equivalent of



26 FULL TIME EMPLOYEES



2. Beware the comfort of the familiar.

Put a bind on it

map

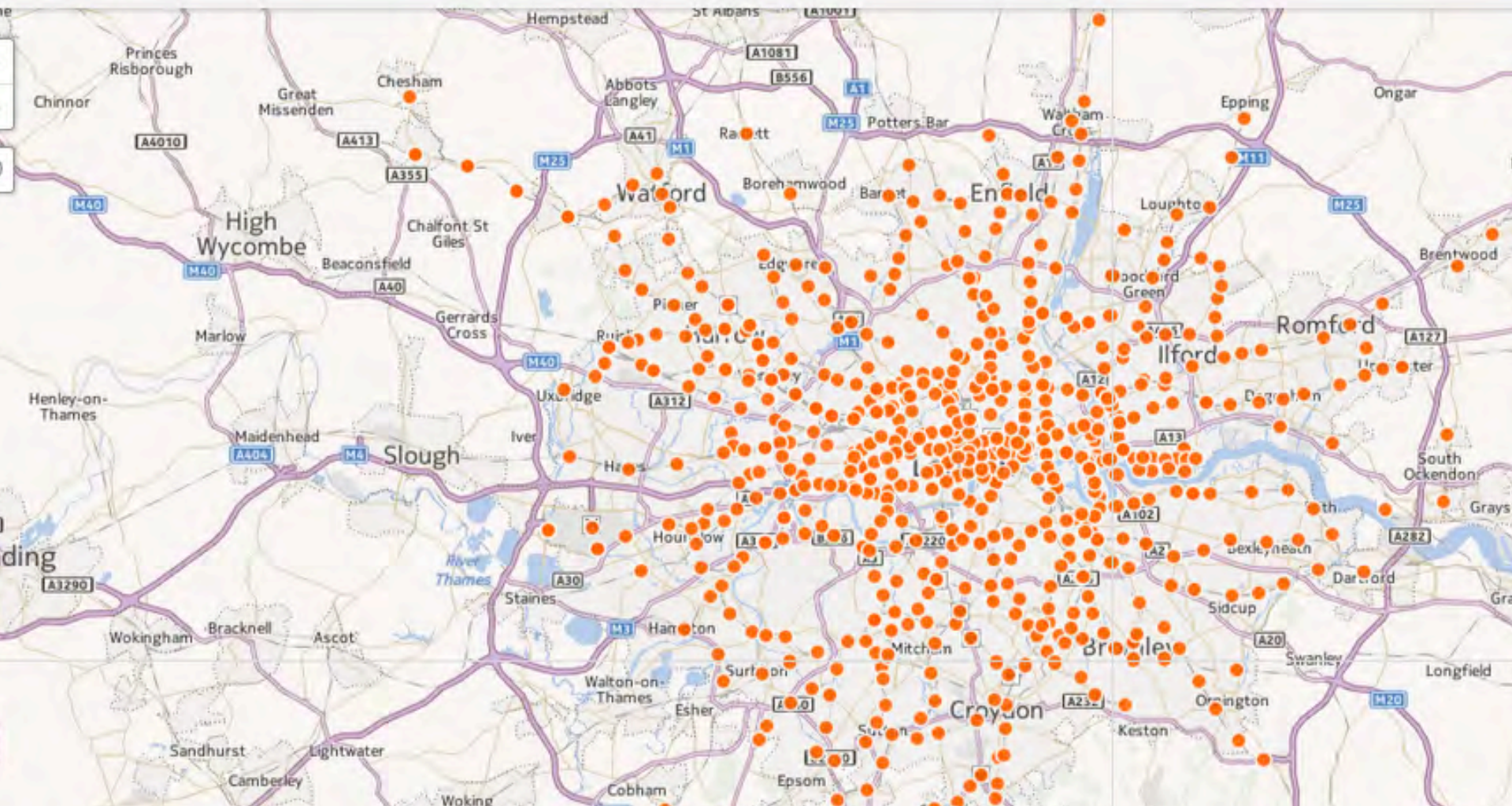
Alfred



add a description...

Table | **Map view**

Basemap
Nokia Day



Add Pod
or Filter

Settings

No Filters
AppliedTo
Proximity
Filter On

Remove

Proximity Filtering

You can filter other datasets to only include records from that dataset that are within (or in proximity to, or not in or near) one or more shapes in this dataset.

Include only records inside of or within 1000 feet of this dataset.

Apply as filter to:

☒ SF Crime Incident...

Disable



DISABLING Proximity Filtering will
UNLOCK this dataset and its filters.



10

\$1.50
Per capita

The Damage



200,000 Dead



1.5 million homeless



97% Port-au-Prince schools out of commission

Explore the median household incomes in neighborhoods across the United States, based on the latest U.S. Census Bureau data.

Median Household Income

\$0 15k 25k 50k 75k 100k 150k 200k +

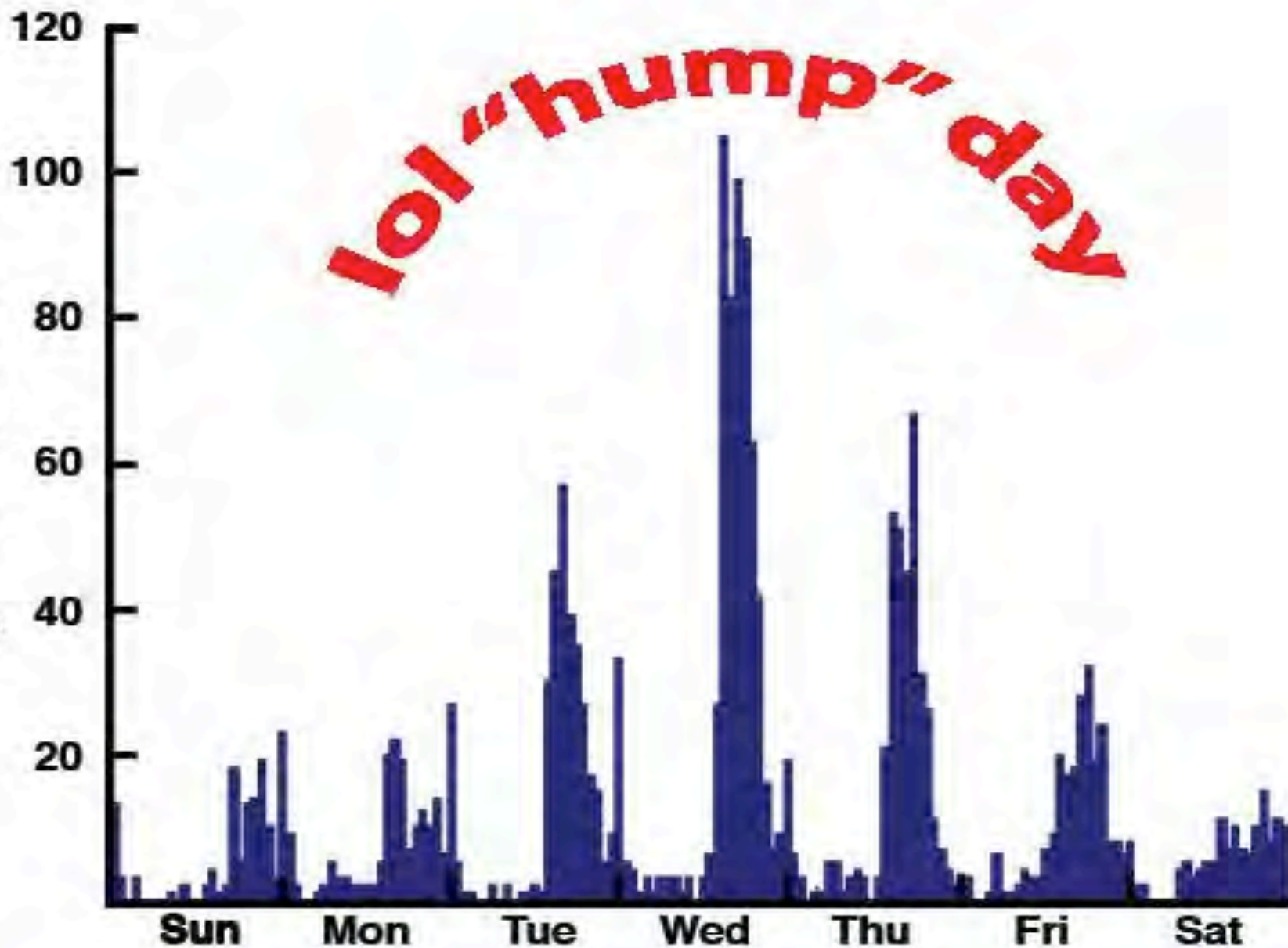


3. Your tool won't tell the whole story.



4. Context is key.

Prostitution crimes
by week-hour



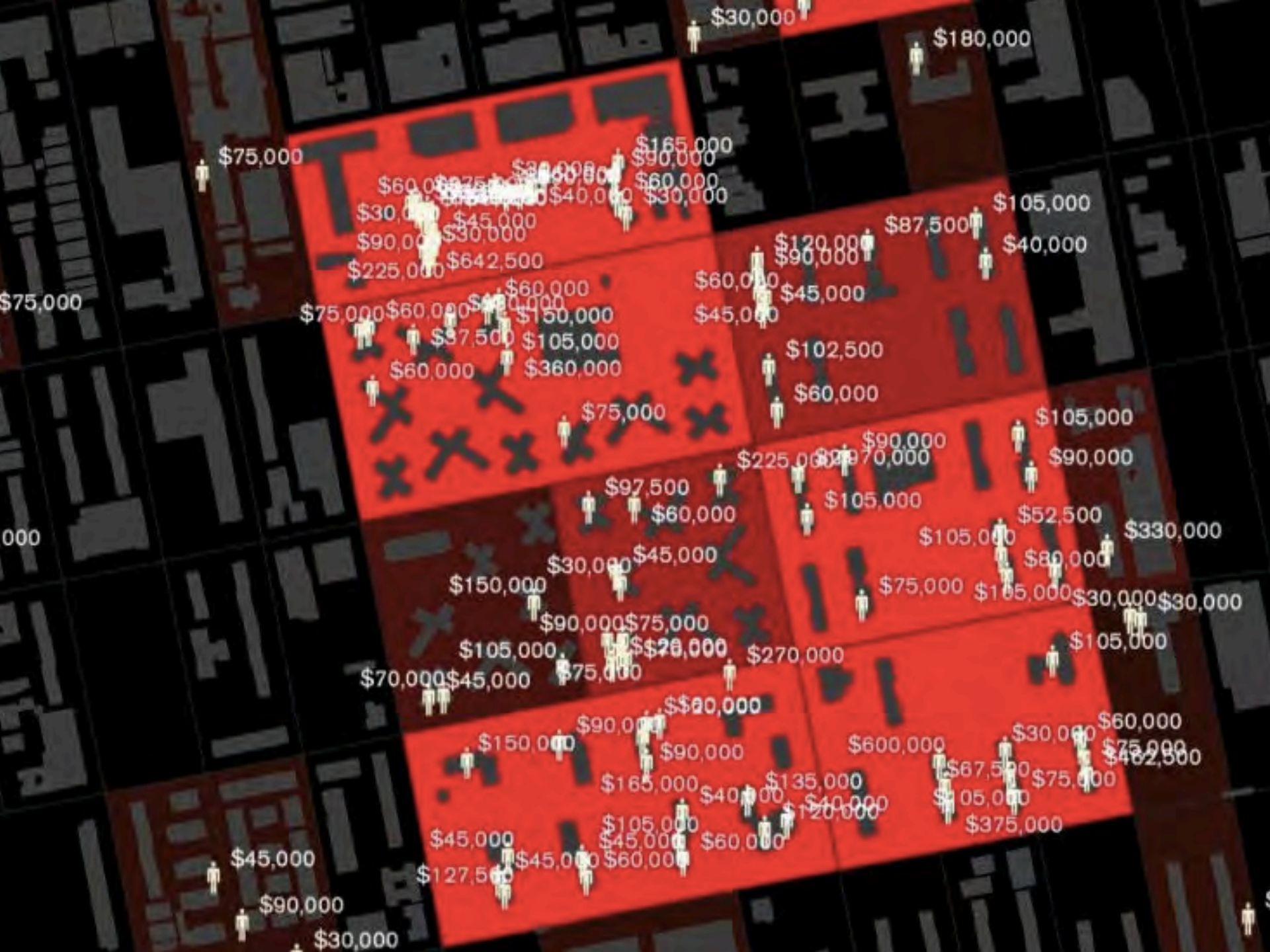
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TELLING GREAT STORIES WITH DATA

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INNOVATION ^{Review}





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Hack Your Way To Scientific Glory

You're a social scientist with a hunch: **The U.S. economy is affected by whether Republicans or Democrats are in office.** Try to show that a connection exists, using real data going back to 1948. For your results to be publishable in an academic journal, you'll need to prove that they are "statistically significant" by achieving a low enough p-value.

1 CHOOSE A POLITICAL PARTY

☒ Republicans

☐ Democrats

2 DEFINE TERMS

Which politicians do you want to include?

- ☐ Presidents
- ☐ Governors
- ☒ Senators
- ☐ Representatives

How do you want to measure economic performance?

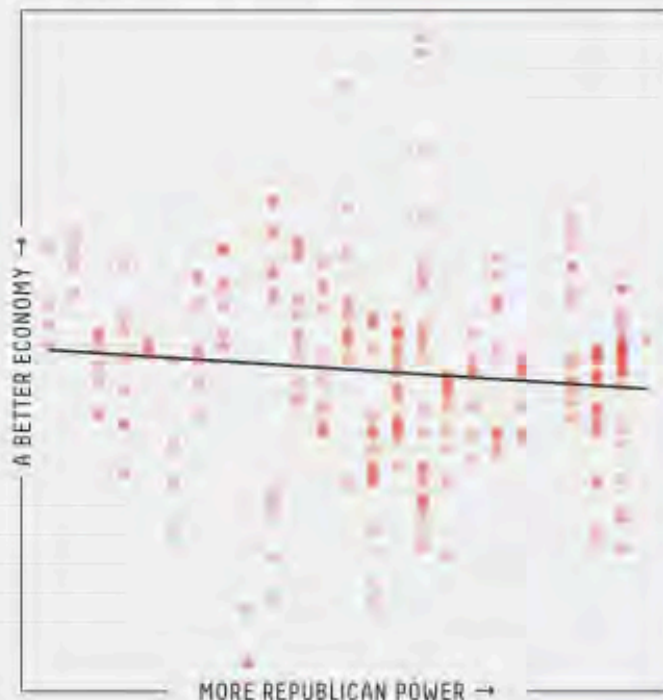
- ☒ Employment
- ☐ Inflation
- ☒ GDP
- ☐ Stock prices

Other options

- ☒ Factor in power
Weight more powerful positions more heavily.
- ☐ Exclude recessions
Don't include economic recessions.

3 IS THERE A RELATIONSHIP?

Given how you've defined your terms, does the economy do better, worse or about the same when more Republicans are in power? Each dot below represents one month of data.



4 IS YOUR RESULT SIGNIFICANT?

If there were no connection between the economy and politics, what is the probability that you'd get results at least as strong as yours? That probability is your p-value, and by convention, you need a **p-value of 0.05 or less** to get published.



Result: Almost

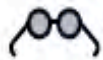
Your **0.06** p-value is close to the 0.05 threshold. Try tweaking your variables to see if you can push it over the line!

If you're interested in reading real (and more rigorous) studies on the connection between politics and the economy, see the work of Larry Bartels and Alan Blinder and Mark Watson.

Data from The @unitedstates Project, National Governors Association, Bureau of Labor Statistics, Federal Reserve Bank of St. Louis and Yahoo Finance.

One Report, Diverging Perspectives

Friday's jobs report is the second-to-last of the presidential campaign. Each party will interpret the numbers in a way to convince voters that its policies will help economic growth. [Related Article »](#)



How a **Democrat**
Might See Things



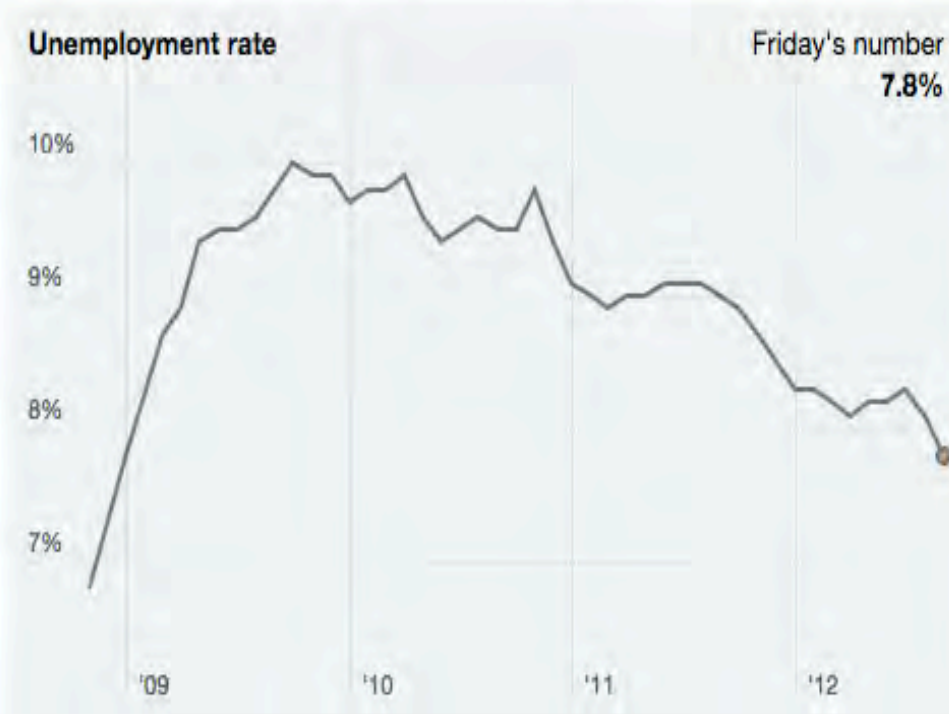
September Jobs Report



How a **Republican**
Might See Things

The U.S. economy added 114,000 jobs in September.

The unemployment rate fell to 7.8%.



By MIKE BOSTOCK, SHAN CARTER, AMANDA COX and KEVIN QUEALY | [Send Feedback](#)

Source: Bureau of Labor Statistics







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Audience Questions



Jake Porway

Founder and Executive
Director, DataKind

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