

- 
- Now that we are SMART about Influenza Outbreaks --

## What's the Next Opportunity?

- What are next steps for flu tracking w/ SMART?
  - Third season reliability/ validity vs. ILI
- Use by public and/or public health practitioners?
  - Marketing to practitioners:
    - Visits to CDC
    - International Soc. Disease Surveillance Abstract
    - Other Meetings? American Public Health Assoc.?
    - Emails to Flu stakeholders – Vaccine Manufactures?
- Feedback/Improvement - Link inviting user to:
  - Send email ? Take Survey ?
  - “User Forum / Chat room with staff feedback?



# Rationale for City ILI Focus

- “all public health is local”
- Other Flu Systems at national & state level
  - Google Flu Trends national, regional city?
  - FluNearYou --- uses crowdsourcing – state reports local maps
- Detecting an outbreak at the city/county level could make impact in reducing disease transmission or treatment
  - Neighboring cities could focus on prevention
  - Could guide resource allocation decisions
    - Anti-viral drugs
    - Hospital staffing , Elective admissions suspended



## What other Diseases or Health Issues to Track?

- Problem--
  - Fit problem to tool (twitter)
  - Fit tool to the problem (health condition)
- Finding Problems and Public Health Priorities
  - What are “needs of the market?”
    - Systematic reviews (1)
    - Policy/ Priority Documents (old)
    - White Papers / Plans ?
    - Expert Opinion Surveys ?
    - Governmental / Non-Governmental Organizations ?
    - Not too much Found --- yet



# Public Health ... big problems

## Look at gaps in reportable diseases?

- Foodborne Illness -- “tip of the iceberg”
  - Several Innovative Interactive Systems
    - See tweet on possible Foodborne illness
    - Health Dept Staff sends link to official case report website.
    - Health dept follow-up
- Sustainability issues



# Public Health Surveillance

- Definition: ongoing, systematic collection, analysis, and interpretation of data on specific health events
- Collection of Data
  - Pertinent, regular, frequent, prompt, timely
- Consolidation and Interpretation of Data
  - Orderly, descriptive, evaluative, prompt, timely
- Dissemination of Information
  - Prompt, timely, all who need to know
- Action to
  - prevent disease, control epidemics, improve health

# Velasco et al. (2014). "Social Media and Internet-Based Data in Global Systems for Public Health Surveillance: A Systematic Review."

TABLE 2  
List of Event-Based Systems Identified

No.	System Name (literature reference)	Category	Country	Year Started
3.1	Argus <sup>43,51</sup>	Moderated	USA	2004
3.2	BioCaster <sup>52</sup>	Automatic	Japan	2006
3.3	EpiSPIDER <sup>34,53</sup>	Automatic	USA	2006
3.4	EWRS <sup>54</sup>	Moderated	EU	1998
3.5	GOARN <sup>55</sup>	Moderated	Multiple <sup>a</sup>	2000
3.6	GODSN <sup>56</sup>	Automatic	USA	2006
3.7	GPHIN <sup>26,57</sup>	Moderated	Canada	1997
3.8	HealthMap <sup>58-62</sup>	Automatic	USA	2006
3.9	InSTEDD <sup>63</sup>	Moderated	USA	2006
3.10	MedISys and PULS <sup>64,65</sup>	Automatic	EU	2004
3.11	MiTAP <sup>66</sup>	Automatic	USA	2001
3.12	ProMED-mail <sup>13,67-69</sup>	Moderated	USA	1994
3.13	Proteus-BIO <sup>11</sup>	Automatic	USA	2000

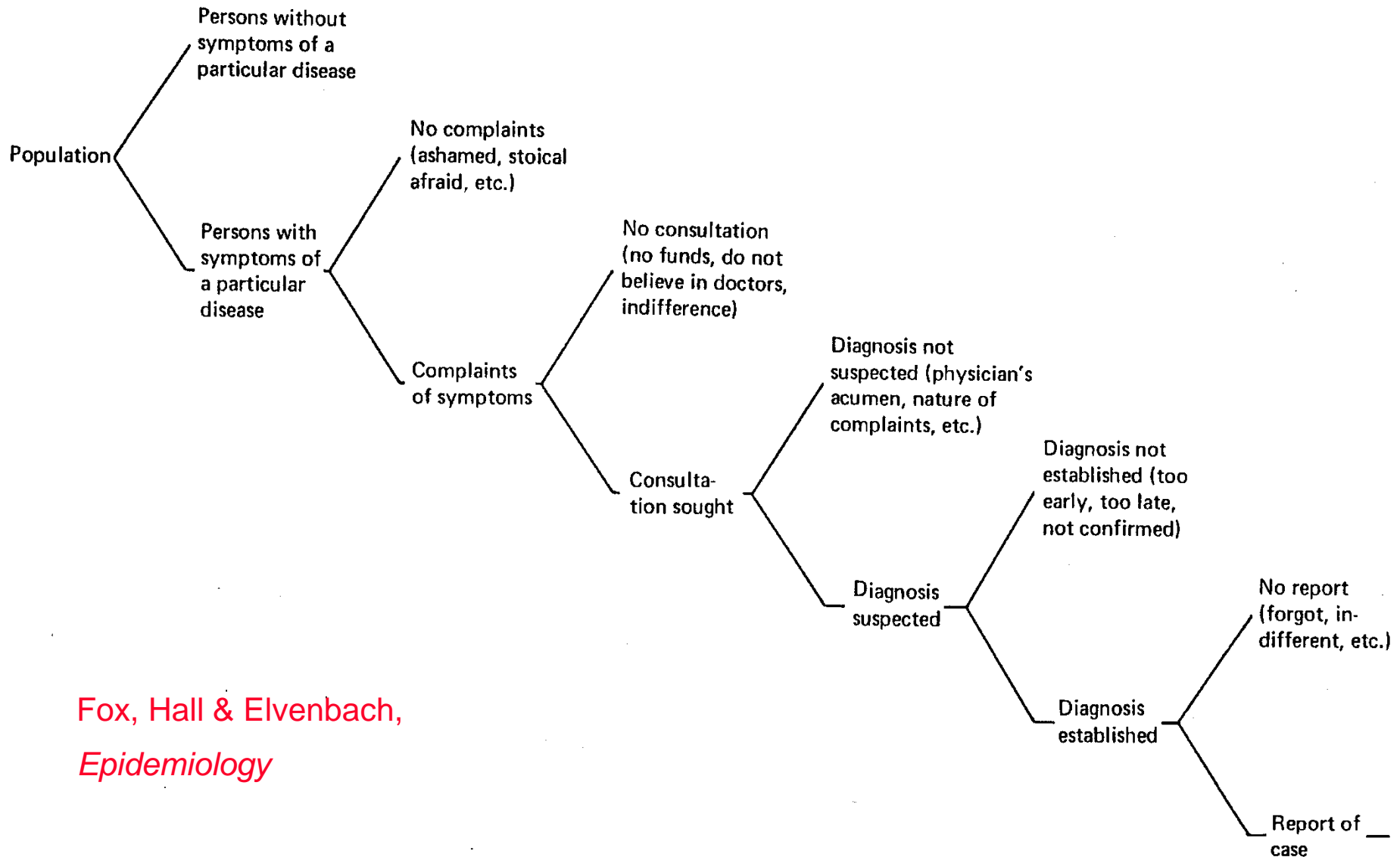
<sup>a</sup>GOARN is a WHO-coordinated network



## Velasco et al. (2014). Finding & Conclusions

- No comprehensive evaluations that show systems have been integrated into actual epidemiological work during real-time health events.
- Acceptability of Internet and social media in public health surveillance programs is limited
- **Circular challenge** willingness to integrate needs effectiveness studies but .... No structured evaluation of newer systems.
- Other non-technical issues are also barriers individual perceptions (epidemiologists)
- Dealing with personal health data and social media and other Internet data

# Contingencies of Morbidity Reporting



Fox, Hall & Elvenbach,  
*Epidemiology*

FIG. 13-2 Contingencies of morbidity reporting.




# Wanted: systematic assessment of emerging surveillance systems

Surveillance Methods/ Approaches -->>> Partial-listing	Social-Media "Twitter" tracking	Active/ Crowd-Sourcing	Syndromic/ Crowd-sourcing with Interaction	Surveillance/ Sentinel or "expert"-systems	Approaches/ Website- and-or-email-text-analysis/ Webcrawler	Or/ Retail-sales-databases	systems/ Existing- "event"-based- newer- approaches	/ Insurance- Claims- data	/ Electronic- records- &- regional- data- exchange	Traditional/ Mandated- disease/ -condition- reporting
Example(s) -->>>	SDSU- SMART- website- (San- Diego- State- University-2014)	FluNear/ gu- fluneano u.org - (FluNear You- 2014)	Foodbome/ Chicago/ www.foodbomechicago.org	Expert knowledge- sourcing- (Berrang-Ford- and-Garton-2013)	New-York- Health-Dept./ Yelp.com- Restaurant- complaint- review	This can be- considered- a- form-of- "event"- based- data	Multiple- established- systems- see- review-by- (Velasco- Agheneza- et- al.-2014)	Colorado- "all-payer- mandated- system"		
<b>System-Characteristics- Criteria-for-evaluation- ...-starter-list-</b>										
<b>General</b>										
Purpose-of-system										
Current-Status- &- availability										
Owner(s)										
Customers- or- stakeholders										
Access- -pubic- vs- private- membership										
<b>Logistical-Issues</b>										
Development-costs										
Sustainability- &- Costs										
Innovative- /Novel-Issues-										
Adaptable- /- useful- with- mobile- technology										
Operator-attention- Intensity- &- type- of- expertise- need										
Privacy- ,confidentiality- HIPPA-concerns										
<b>Big-Picture- - Strategic- &amp;- Policy- Issues</b>										
Public- health- significance- and- or- interest- in- disease- or- threat- or- issue										
Health- or- burden- Morbidity/ Mortality- etc										
Utility- - Fills- gap- vs- improving- existing- info?										
Public- , Policymaker- &- Funder- interest- in- disease- or- issue										



- **Surveillance Methods or Approaches -Partial listing**
- State Mandated disease/ condition reporting ( Public Health)
- Sentinel or “expert” systems (eg. ILI in selected cities)
- Retail sales data bases
- Insurance Claims data
- Website and or email text analysis “Webcrawler”
- Electronic medical records & regional data exchanges
- Crowd-sourcing social media with Interaction
- Social Media “Twitter” tracking
- Active Crowd Sourcing -- Flu Near You

- 
- System Characteristics
  - Criteria for evaluation ... starter list

- **General**

- Purpose of system
- Current Status & availability
- Owner(s)
- Customers or stakeholders
- Access – public vs private, membership



- Logistical Issues

- Development costs
- Sustainability & Costs
- Innovation vs incremental improvement
- Adaptable/ useful with mobile technology
- Operator attention
- Intensity & type of expertise need
- Privacy, confidentiality HIPPA concerns



# Big Picture -- Strategic & Policy & Political Issues

- Public health significance
  - Interest in disease or threat or issue
  - Health burden
    - Morbidity/Mortality
    - Costs lost school, worker productivity
- Fills gap vs. improving existing info?
- Public, Policymaker & Funder interest in disease or issue



# Surveillance (scientific) Characteristics /Issues

- Acceptability & Use by professionals / organizations/ policy makers
- Locus of analysis --
  - Local vs. state vs. national? E.g. granularity of data & information
- Case definition precise vs. vague
- Timeliness –
- Leading or Lagging indicator
- Sensitivity vs Specificity
- Action-ability for disease control or other purposes
  - -- direct or needs more analysis?
- Action-ability for Policy or Planning – and other less immediate uses

# Vaccine Information and Sentiment Over Space and Time

Anna C. Nagel, Ming-Hsiang Tsou, Li An, Jean Marc Gawron,  
Dipak K Gupta, Brian Spitzberg, Jiue-An Yang, Su Han, K.  
Michael Peddecord, Mark H. Sawyer, Suzanne Lindsay

Committee members;

Dr. Suzanne Lindsay (Chair)

Dr. Michael Peddecord

Dr. Ming-Hsiang Tsou



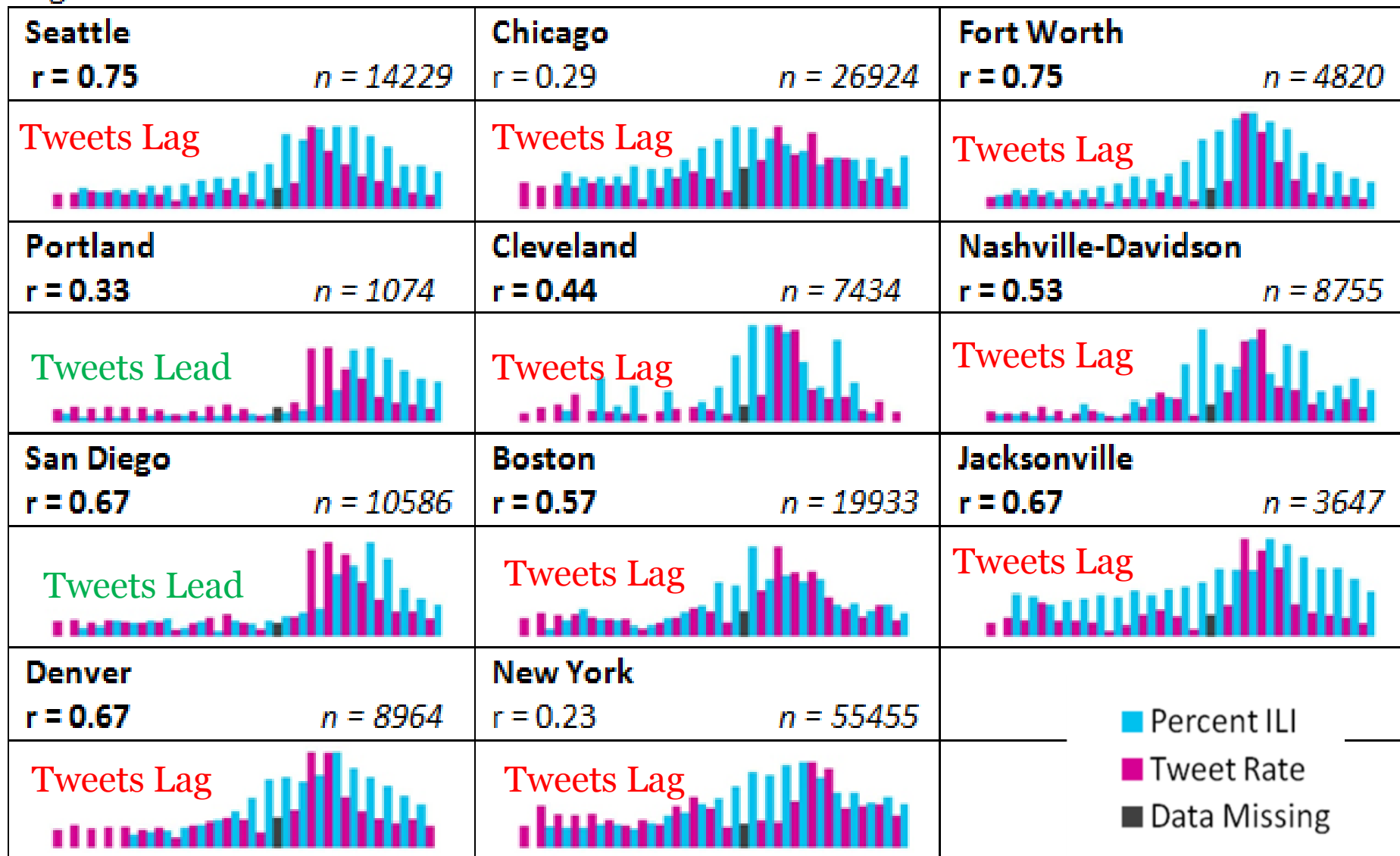
**Nagel et al The Complex Relationship of Realspace Events and Messages in  
Cyberspace: Case Study of Influenza and Pertussis Using Tweets.**

**J Med Internet Res 2013;15(10):e237. doi:10.2196/jmir.2705.**

**<http://www.jmir.org/2013/10/e237>**

# Tweets Leading or Lagging ILI? 2012-13 Flu Season

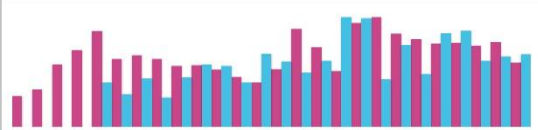





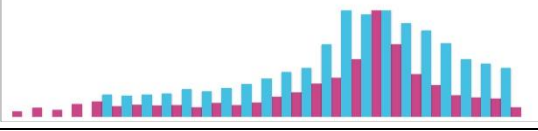
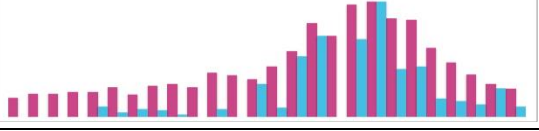
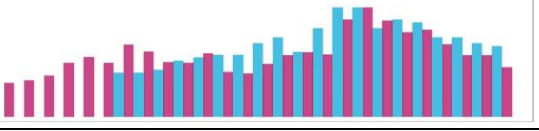
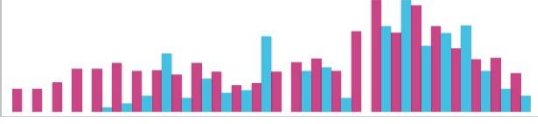
Nagel, et al. The Complex Relationship of Realspace Events and Messages in Cyberspace: Case Study of Influenza and Pertussis Using Tweets. *J Med Internet Res* 2013;15(10):e237.



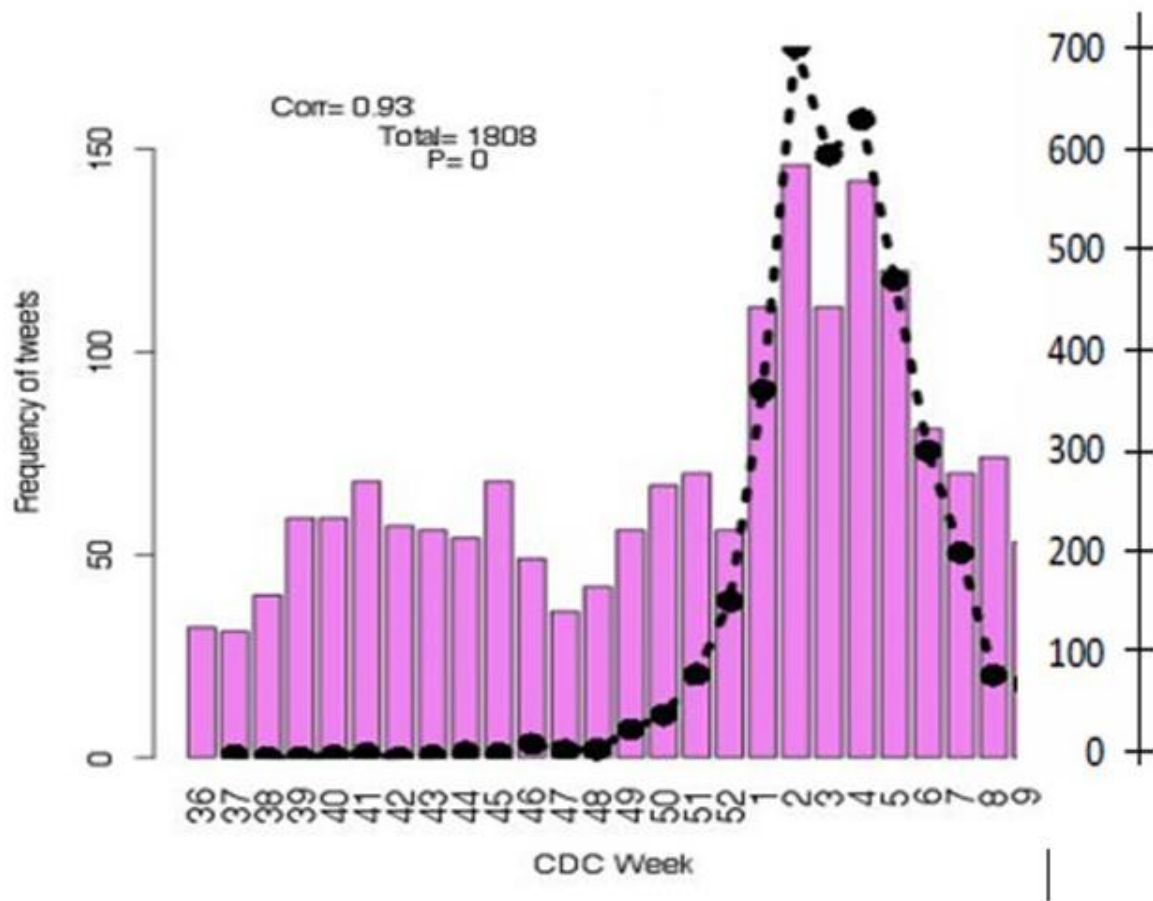


Aslam, Anoshe A. et al. "The Reliability of Tweets as a Supplementary Method of Seasonal Influenza Surveillance", under revision *J. Med. Internet Research*, Sept. 2014

**Table 4. "Valid" Tweet Rates per 100,000 versus Sentinel Provided ILI Rates by City, 2013-14 Influenza Season**

<b>Boston</b> $r = 0.10$ <span style="float: right;"><math>n = 3813</math></span>	<b>Chicago</b> $r = 0.64$ <span style="float: right;"><math>n = 5116</math></span>	<b>Cleveland</b> $r = 0.60$ <span style="float: right;"><math>n = 1497</math></span>
		
<b>Columbus</b> $r = -0.24$ <span style="float: right;"><math>n = 1034</math></span>	<b>Denver</b> $r = 0.69$ <span style="float: right;"><math>n = 1942</math></span>	<b>Detroit</b> $r = 0.76$ <span style="float: right;"><math>n = 2195</math></span>
		
<b>Fort Worth</b> $r = 0.85$ <span style="float: right;"><math>n = 1236</math></span>	<b>Nashville-Davidson</b> $r = 0.83$ <span style="float: right;"><math>n = 1630</math></span>	<b>New York</b> $r = 0.55$ <span style="float: right;"><math>n = 12632</math></span>
		
<b>San Diego</b> $r = 0.88$ <span style="float: right;"><math>n = 1808</math></span>		
		

### Weekly Flu Tweets and Laboratory Confirmed Influenza Cases, San Diego 2013-2014



**Figure 1. Comparing weekly laboratory confirmed influenza cases (black line) and weekly flu tweeting rates (pink bars). Note: Total lab confirmed cases= 1808**

Anoshé A. Aslam, MPH Plan B Project: The Reliability of Tweets as a Supplementary Method of Seasonal Influenza Surveillance



<http://vision.sdsu.edu/hdma/smart/>

## Social Media Analysis & Research Testbed

About [Human Dynamics Center, San Diego State University](#)

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**Human Dynamics** is a transdisciplinary research field focusing on the understanding of dynamic patterns, relationships, narratives, changes, and transitions of human activities, behaviors, and communications.

The Center for Human Dynamics in the Mobile Age (HDMA) is a new research institute at SDSU to focus on research questions and analytical software development for human dynamics problems, such as disaster responses and disease outbreaks, urban problems, by monitoring information from mobile technologies and mobile devices (such as GIS, social media and GPS datasets).

---

Please select a topic

Flu

Whooping  
Cough

Wildfire

Drugs

Aztecs

vision.sdsu.edu/hdma/smart/flu

Human Dynamics in the Mobile Age

27 Tweets from Top 30 US Cities on 2014-09-09

4424 Tweets from Top 30 US Cities in past 7 days (2014-09-03 ~ 2014-09-09)

19131 Tweets from Top 30 US Cities in past 30 days (2014-08-11 ~ 2014-09-09)

34128 Tweets from Top 30 US Cities since 2014-07-12

Trend — Tweets Daily Weekly Monthly

Top Media All Past 30 Days Past 7 Days Yesterday

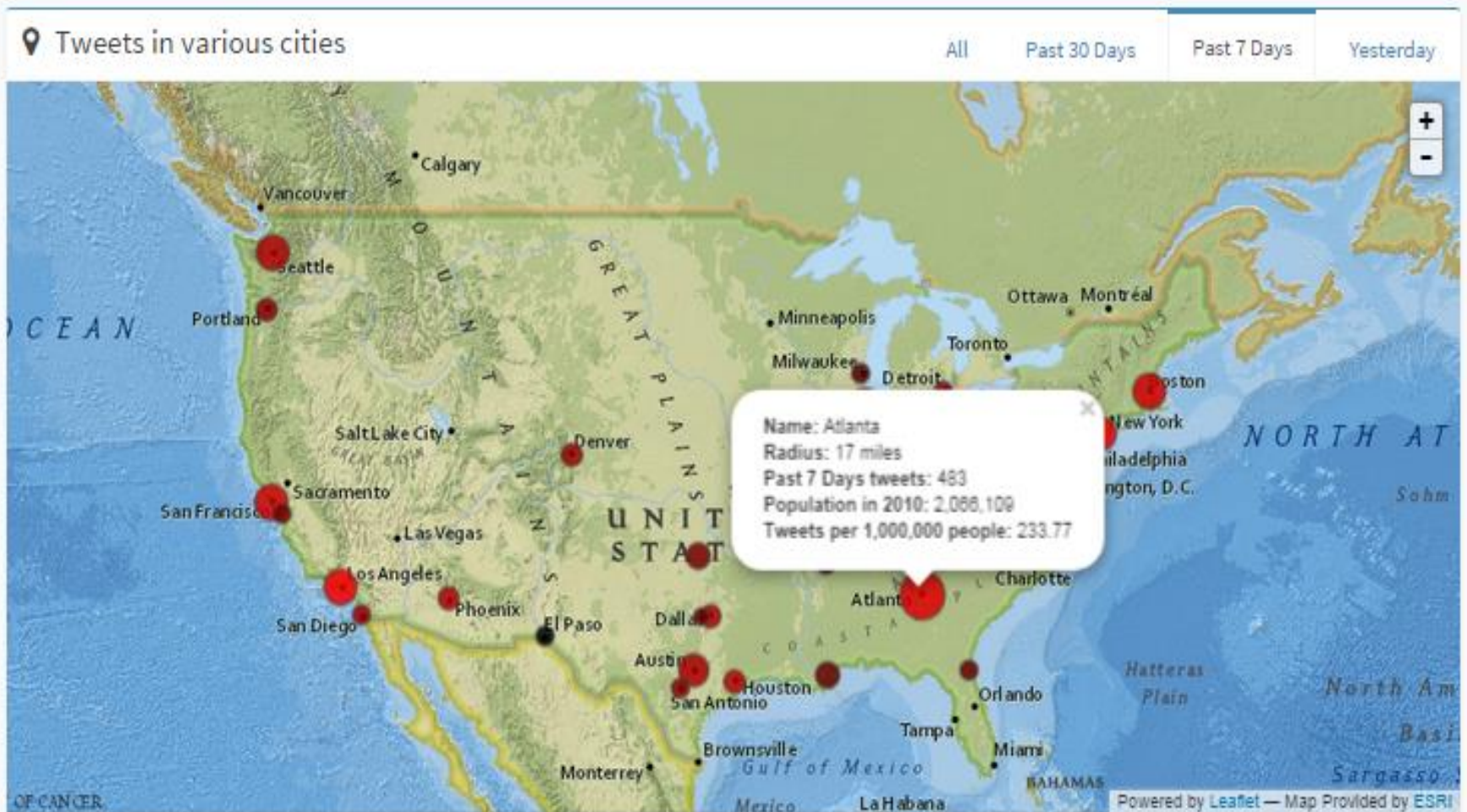
Word Cloud All Past 30 Days Past 7 Days Yesterday

Top URL (The Most Referred Web Pages)

#	Content	Count
1	<b>New Drug Could Fight Flu in One Dose - ABC News</b> Doctors may have a new weapon to fight one of the deadliest viruses in the United States after researchers announced a new drug to treat the flu.	93
2	<b>Pregnant Women &amp; Influenza (Flu)   Seasonal Influenza (Flu)   CDC</b> Fact sheet provides an overview about the impact of flu on pregnant women, and emphasizes the importance of flu vaccination for pregnant women and their unborn babies - CDC	83
3	<b>Home   Flu - CDC</b>	40

http://vision.sdsu.edu/hdma/smart/

# Map for top 30 cities 9/14/14



City	Radius	Past 7 Days Tweets	Population 2010	Tweets per 1,000,000 people
New York	17 miles	903	10,659,590	84.71
Washington DC	17 miles	773	3,174,706	243.49
Los Angeles	17 miles	649	5,424,122	119.65
Atlanta	17 miles	483	2,066,109	233.77



## Crowd Sourcing to Track Influenza Outbreaks

<https://flunearyou.org>

Flu Near You is a free, real-time ILI surveillance system

- Uses anonymous crowd-sourced symptom reporting
- Gives public health community & practitioners a new tool
- Early warning system that identifies outbreaks
- May aid targeting of disease prevention and treatment
- Better analysis and visualization disease spread
- Direct public engagement in combating communicable disease
- Possible insight into vaccine effectiveness

a project of **HealthMap.org** Boston



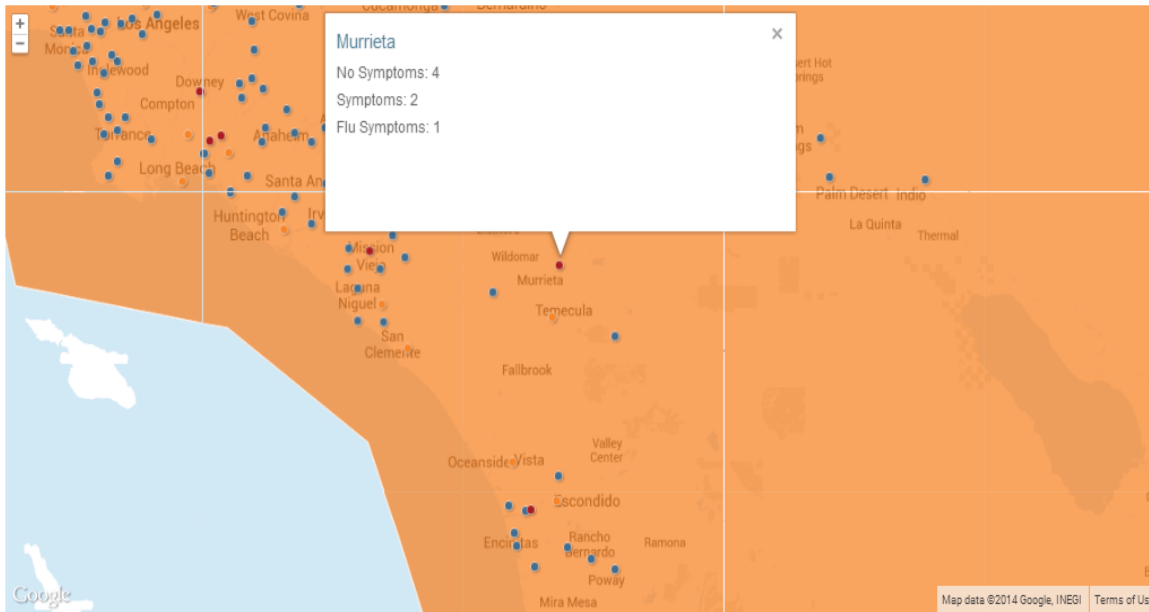
# FluNearYou

## Crowd Sourcing to Track Influenza Outbreaks

a project of HealthMap.org Boston

[About](#) [Video](#) [Press](#) [FAQ](#) [f](#) [t](#)

[Map](#) [Chart](#) [Settings](#) Jump to  [Go!](#)



User Contributed Data • No Symptoms • Symptoms • Influenza-like Illness

User Contributed Flu Activity  CDC Flu Activity  Google Flu Trends ILI



Welcome back!

We have your most recent survey. [Log out](#)

### Reporting in CA

Week ending 9/7/2014

**28 (2.1%)** Influenza-like Illness

**142 (10.9%)** Symptoms

**1161 (89.1%)** No Symptoms

[f share](#)

[tweet](#)

### User Profile

**58** Weeks eligible to report

**50** Weeks reported

**0** Weeks since last report

**86%** Participation rate

Get Vaccinated

Search by address or zip code

<https://flunearyou.org/> screen capture 9/10/14



# FluNearYou Weekly Report

## Health Status Report ✕

👍 Thank you! Please report symptoms for **Monday, September 01 2014 - Sunday, September 07 2014.**

I experienced:

<input type="checkbox"/> Fever	<input type="checkbox"/> Fatigue
<input type="checkbox"/> Cough	<input type="checkbox"/> Nausea or vomiting
<input type="checkbox"/> Sore throat	<input type="checkbox"/> Diarrhea
<input type="checkbox"/> Shortness of breath	<input type="checkbox"/> Body aches
<input type="checkbox"/> Chills/night sweats	<input type="checkbox"/> Headache

**I did not have any of the listed symptoms**

Did you receive the flu vaccine after July 31, 2014?

Yes  No  Don't Know

Did you receive the flu vaccine last year (between July 31, 2013 - July 31, 2014)?

Yes  No  Don't Know

**Report**

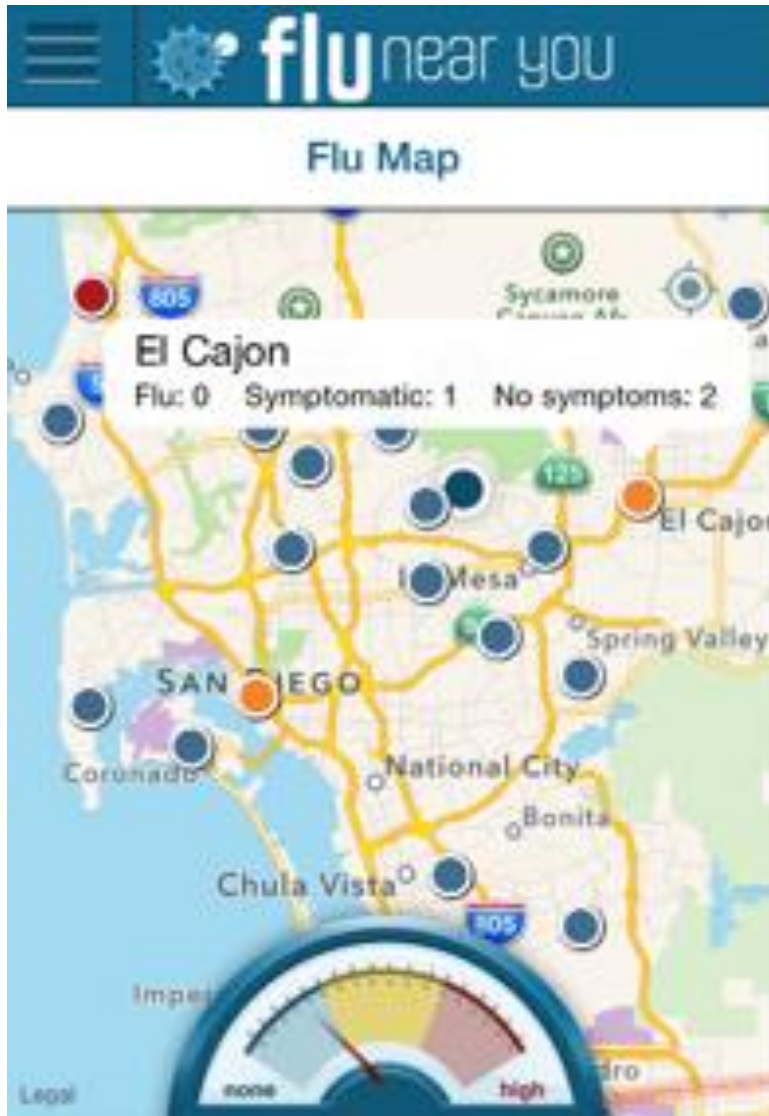




# FluNearYou    Android or iPhone App



# FluNearYou iPhone or Android App



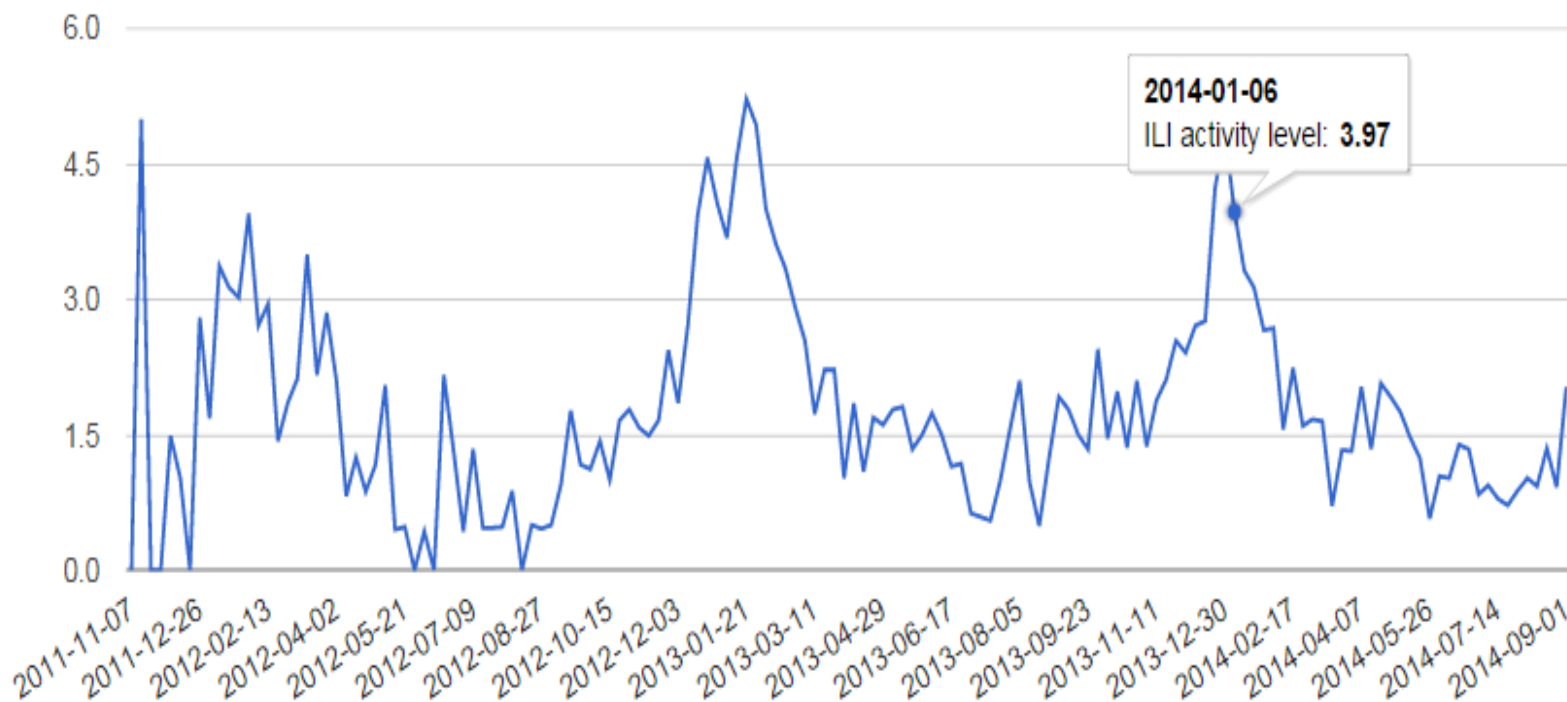
Map

Chart

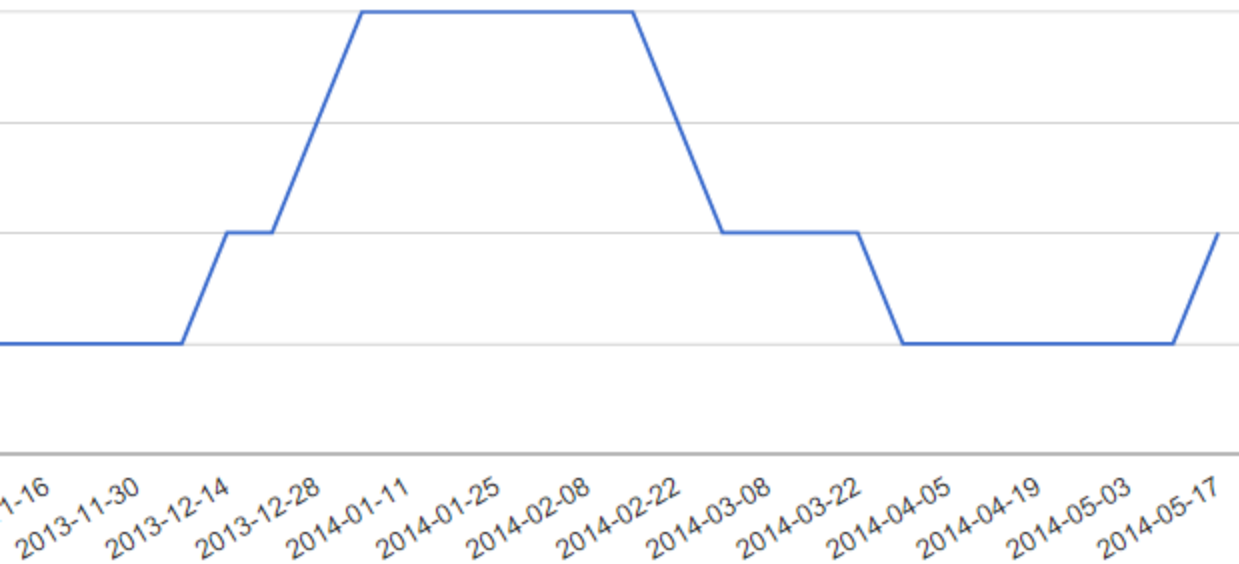
Settings

Jump to

% users who reported ILI in CA



● User Contributed Flu Activity ● CDC Flu Activity ● Google Flu Trends ILI



Flu activity level

User Contributed Flu Activity CDC Flu Activity Google Flu Trends ILI

1 = No Report 2 = No Activity 3 = Sporadic 4 = Local  
5 = Regional 6 = Widespread

Data supplied by CDC weekly flu reports

Welcome back!

We have your most recent

Reporting in CA

Week ending 9/7/2014

29 (2.1%) Influenza-like illness

147 (10.8%) Symptomatic

1219 (89.2%) No symptoms

share

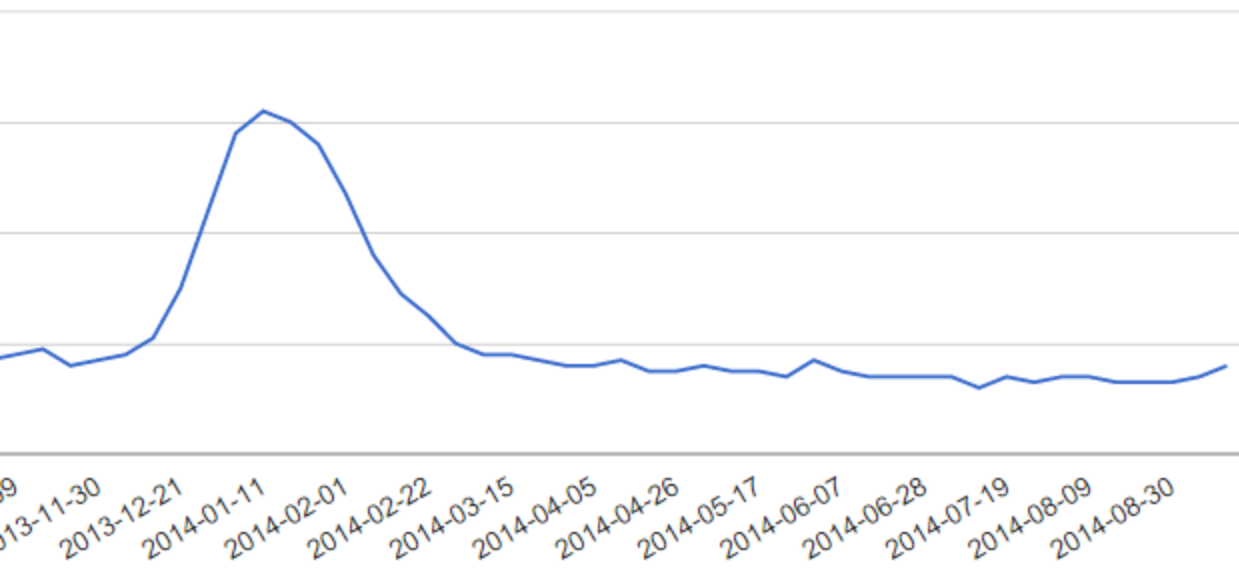
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ILI activity level

User Contributed Flu Activity CDC Flu Activity Google Flu Trends ILI

Google Flu Trends

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Thank you!



Questions?



# Evolution of Health Surveillance

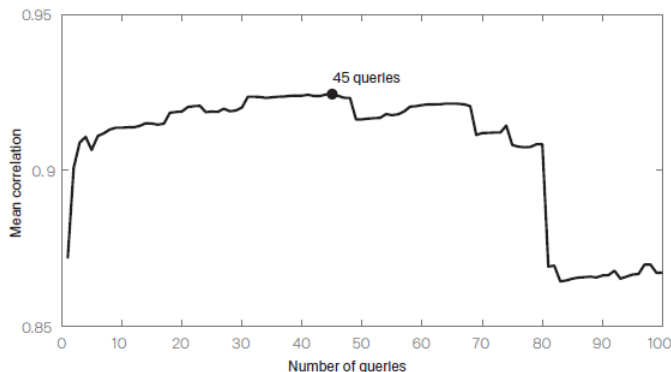
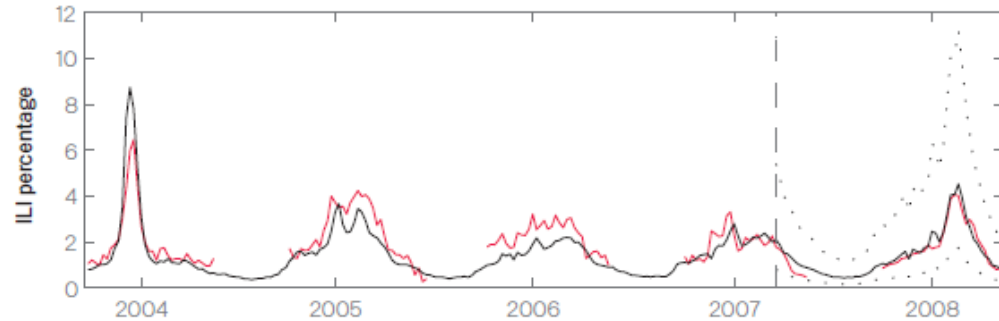
- Classical: Communicable Disease Reporting Cycle:
  - Providers >> Local >> State >> Federal >> Users
- Sentinel Surveillance
  - Selected organizations and providers
- Syndromic Surveillance
  - Mining of electronic data
    - Examples: Electronic Medical Records, Pharmacy sales
- Emerging concepts
  - **Infodemiology** - study of the distribution and causal factors using information in cyberspace
  - **infoveillance** – monitoring online texts for surveillance



# Previous works - Google Flu Trends

[www.google.org/flutrends/us/#cities](http://www.google.org/flutrends/us/#cities)

- Compared search queries with ILI
  - Mean correlation = .9
- Used 45 different search queries



Search Query Topic	Top 45 Queries	
	N	Weighted
Influenza Complication	11	18.15
Cold/Flu Remedy	8	5.05
General Influenza Symptoms	5	2.60
Term for Influenza	4	3.74
Specific Influenza Symptom	4	2.54
Symptoms of an Influenza Complication	4	2.21
Antibiotic Medication	3	6.23
General Influenza Remedies	2	0.18
Symptoms of a Related Disease	2	1.66
Antiviral Medication	1	0.39
Related Disease	1	6.66
Unrelated to Influenza	0	0.00
	<b>45</b>	<b>49.40</b>

Ginsberg et al. *Nature* Vol 457, Feb 2009

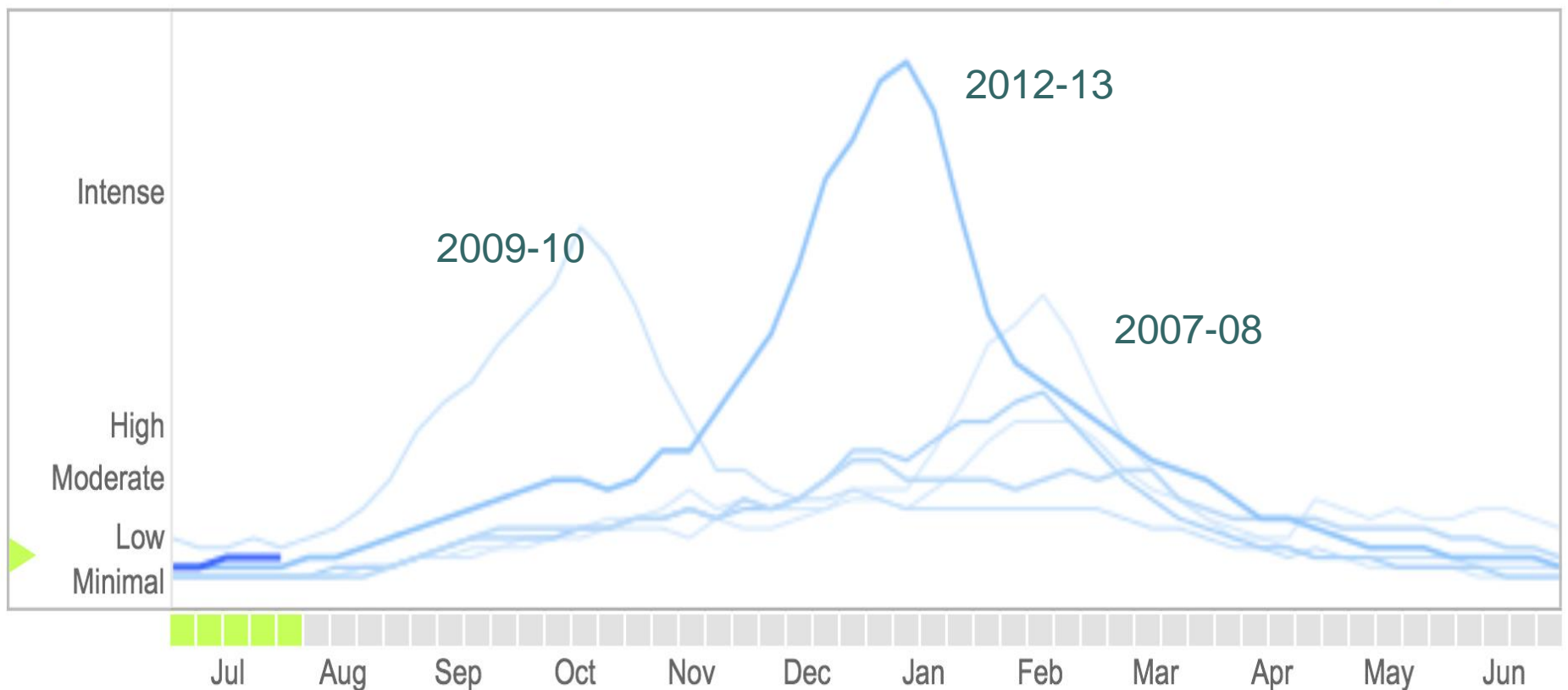


# Google Flu Trends last 6 seasons

We've found that certain search terms are good indicators of flu activity. Google Flu Trends uses aggregated Google search data to estimate flu activity. [Learn more »](#)

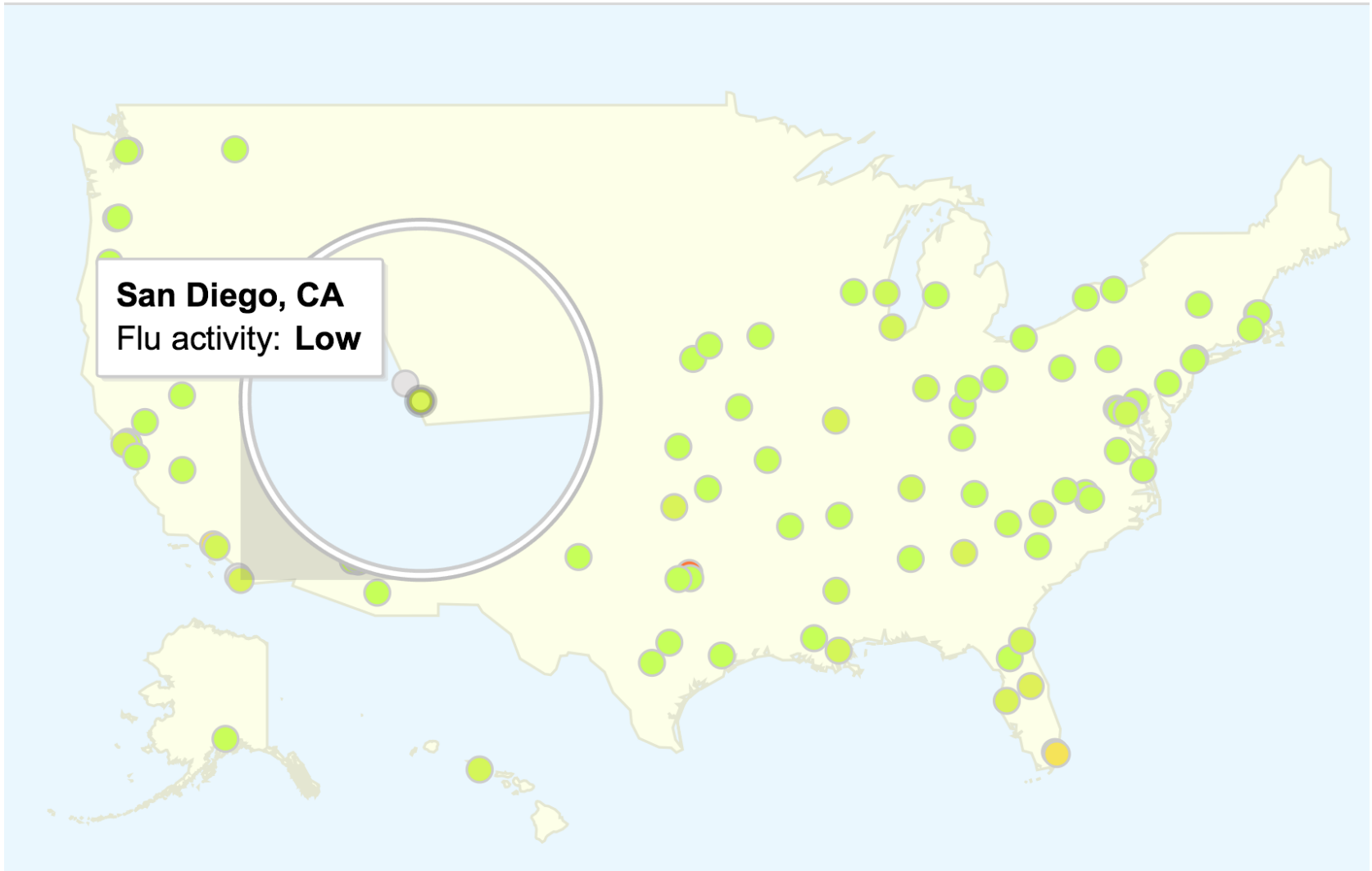
## National

● 2013-2014 ● [Past years ▼](#)



# Google Flu Trends

[States](#) | **Cities** (Experimental) - Click on a city below to chart the flu trend above.



# Google Flu Trends Cities

