Can GIS help provide better health ?



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Abstract

The need to provide better, personal health information and care at lower costs is opening the way to a number of digital solutions and applications designed and developed specifically for the healthcare. Under the mHealth (Health 2.0) umbrella we find web and mobile applications and services that can help manage chronic conditions or improve ones lifestyle; at the same time doctors, hospitals and health-services are using digital devices and solutions to improve quality of care, improve efficiency and reduce costs.

But what happens when we apply GIS techniques to health data?

MedsTrends: an analytical tool to map and analyze access to health-related information.

Summary



We are a Health 2.0 company

Health 2.0 - Ideal scenario



Health 2.0 - Realistic scenario



Health 2.0 - Reality



What is myHealthbox

Essentially a search engine, like Google but specialized in healthcare products, plus a huge database of information about those product.

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Login Sign up 🌣

Search information leaflets for human, veterinary and plants medications, drugs, supplements, herbal, nutritional and homoeopathic products; prescription and over-the-counter medicines and medical devices; beauty products and cosmetics, natural remedies and other pharmaceutical products

Search

browse by Product name

## myHealthbox – extended info

myHealthbox is a leading provider of health information services to consumers and healthcare professionals, our platform includes.

- a specialized search engine to find and retrieve information on how to use medicines and healthcare products
- A website where companies can add, update and publish information and documents about their products
- a set of Web-APIs providing access to our high-quality content to third parties (health web sites, web and mobile applications, company web sites)

For any company in the healthcare space joining the myHealthbox platform means being able to provide to the general public and to healthcare professionals high quality, guaranteed information that can be easily updated and is optimized for access via any web or mobile device.

# What information do we provide?

Official information on the use of medicines and any healthcare product (*human, animal and plants medications; herbal, homeopathic and natural remedies; prescription and over-the-counter; beauty products and cosmetics; supplements and medical devices*)

Targeted at the general public and healthcare professionals

Mainly PIL (like the paper leaflets you find in most medicines packaging) and SPC documents in digital format (pdf or eLeaflet)



Legga attentamente questo foglio prima di prendere questo medicinale perché contiene importanti informazioni per lei.

Conservi questo foglio. Potrebbe aver bisogno di leggerio di nuovo.

Se ha qualsiasi dubbio, si rivolga al medico o al farmacista.

Questo medicinale è stato prescritto soltanto per lei. Non lo dia ad altre persone, anche se i sintomi della malattia sono uguali ai suoi, perché potrebbe essere pericoloso

Se si manifesta un qualsiasi effetto indesiderato, compresi quelli non elencati in questo foglio, si rivolga al medico o al farmacista. Vedere paragrato 4.

#### Contenuto di questo foglio

Che cos'è Cardioaspirin e a cosa serve
 Cosa deve sapere prima di prendere Cardioaspirin
 Come prendere Cardioaspirin
 Possibili effetti indesiderati
 Come conservare Cardioaspirin
 Cone conservare Cardioaspirin
 Conencio della confezione e altre informazioni

#### 1. Che cos'è Cardioaspirin e a cosa serve

Cardioaspirin è un antitrombotico, cioè un medicinale che previene la formazione di coaguii di sangue (trombi) nei vasi sanguigri Cardioaspirin si usa nella:

- Prevenzione degli eventi atero-trombotici maggiori:
- dopo intarto del milocardio (attacco di cuore);
- o dopo lotus cerebrale (improvvisa interruzione del flusso di sangue al cervello) o attacchi ischemici transitori (TIA) (temporanea interruzione o riduzione del flusso di sangue al cervello);
- In pazienti con angina pectoris instabile (attacchi che si manifestano con doiore e senso di oppressione ai torace in corrispondenza dello sterno, a riposo);
- In pazienti con angina pectoris stabile cronica (o angina da storzo, che si manifesta con forte dolore toracico e senso di oppressione nella regione dietro lo sterno generalmente in seguito ad uno storzo).
- Prevenzione della riocclusione dei by-pass aorto-coronarici (la tecnica chirurgica che consente di ripristinare il corretto affusso di sangue al cuore) e nell'angiopiastica coronarica
  percutanea transluminale (PTCA) (la tecnica d'intervento non chirurgica che consente di ripristinare il corretto affusso di sangue al cuore).

Prevenzione degli eventi cardiovascolari nei pazienti can malattia ateromasica conclamata (malattia che porta all'irrigidimento ed al deposito di grassi all'interno delle arterie), nei
pazienti sottoposti alla dalli dei sanque e nella prevenzione della trombosi durante circolazione extracorporea.

Prevenzione degli eventi cardiovascolari in pazienti ad elevato rischio.

The type of information that helps people use products in a safer way (dosage, excipients for allergies, therapeutic indications, side effects etc.)

"better information for better health"

# **Reach & numbers**



# What people do on our sites



# Logging access data

#### **Disclaimer**

For the sake of privacy rules and sensitive data handling: registration on our platform is optional, you do not have to provide any personal data if you do not want to.

We do log everything (and I really mean everything) that is done on our platform:

- what users search
- what they read
- how long they read a specific document for
- when
- where (down to zip code precision in some regions)

All this log data is collected and made available to our analytics tools,



## **The Data Problem**



## We have the answer

what is your question ?

# The Data problem

We have the 3 Vs (Big data ?)

Volume: The quantity of generated and stored data. The bigger the better, in our case millions of interactions
Variety: The type and nature of the data (several types of interactions to weight, several languages
Velocity: the speed at which the data is generated generated in real time 24/7, live data

The Data Problem is not a storage problem but, as typical with most big data problems, we need to find the answers (**value indicators**) that are hidden under millions and millions of records

## extract value from data

This should lead to more confident decision making and thus greater operational efficiency, cost reduction and reduced risk and ...

# End of part 1 - Questions ?

Before we move to part 2, are there any questions ?

# Some projects worth mentioning

- Google Flu Trends and Google Dengue Trends
- healthmap.org
- Columbia School of Public Health

and many more of course ...

# Google Flu Trends - Intro

Ended as a modeling and prediction tool in 2015

Still going as a data collection source

Data is available to third parties

"When a small team of software engineers first started working on Flu Trends in 2008, we wanted to **explore how real-world phenomena could be modeled using patterns in search queries**. Since its launch, Google Flu Trends has provided useful **insights** and served as one of the early examples for "**now-casting**" **based on search trends**, which is increasingly used in health, economics, and other fields.

Over time, we've used search signals to create prediction models, updating and improving those models over time as we compared our prediction to real-world cases of flu."

# Google Flu Trends - status

"Instead of maintaining our own website going forward, we're now going to empower institutions who specialize in infectious disease research to use the data to build their own models. Starting this season, we'll provide Flu and Dengue signal data directly to partners including Columbia University's Mailman School of Public Health (to update their dashboard), Boston Children's Hospital/Harvard, and Centers for Disease Control and Prevention (CDC) Influenza Division. We will also continue to make historical Flu and Dengue estimate data available for anyone to see and analyze."

# **Google Flu Trends - method**

Flu search activity **based on aggregated Google Search query data**, standardized to make data more comparable across regions. The '**baseline**' level for each region (shown as 0) is its **average flu search activity**, measured over many seasons. **Activity** levels for each region **represent how much flu search activity differs** from that region's 'baseline' level.

# **Google Flu Trends - Results**



# **Google Flu Trends - Results**

Flu search activity (standard deviation from baseline) ? Country - Descending order ?	k 🗉 🚱	🗘 - co
20		
18		
16		
14		
12		
10		
8		
6		
4 Chile		
2 New Z Arger Parag North Marian		
0	Canada	Bulga Boliviá Poru
2		Peru
-2		
-4		
		8/9/15

# **Google Flu Trends - Results**



# healthmap.org - Intro

HealthMap, a team of researchers, epidemiologists and software developers at **Boston Children's Hospital** founded in 2006, is an established global leader in utilizing on-line informal sources for disease outbreak monitoring and real-time surveillance of emerging public health threats.



# healthmap.org - Projects

#### Projects



Crowd Clinical HealthMap Flu Trends DengueMap MedWatcher PREDICT Thermia Flu Near You HealthMap Vaccine Finder ProMED mail

# healthmap.org - Method

Data from **several sources**:

- The **US Centers for Disease Control** (CDC) continuously records the percentage of patients seen in clinics who exhibit influenza-like illnesses (ILI) according to physicians' reports.
- Search data provided by Google
- Flu Near You (FNY) is a crowd-sourced participatory disease surveillance system. It gathers information from users about their health in real-time.
- Athenahealth (ATH) is a company specialized in medical practices management and electronic health records management.

Produce a **forecast** by combining data from CDC, Google, athenahealth, and FNY, flu activity is estimated for last week, current week, next week, and the week after next.

# healthmap.org – Results flu activity



### **Columbia School of Public Health - Intro**

# Similar to healthmap but different model (added lab tests to confirm cases of flu)

"We construct local estimates of influenza incidence at the state and municipal levels using Centers for Disease Control and Prevention (CDC) ILINet weekly regional reports of influenza like illness (ILI), WHO/NREVSS collaborating laboratory influenza positive tests and Google search activity."

### **Columbia School of Public Health - Results**





#### Peak Intensity $\equiv$ 1 0.75 0.5 0.25 Data for Lubbock, TX, week ending: Sun Apr 17 2016 0 Using observations through week 67 3000 <1000 1000 -2000 - 3000 6000 - 7000 7000 8000 - 9000 4000 - 5000 5000 - 6000 9000 - 10,000 >10,000 - 8000 4k 2000 Peak Timing Date: 13 Mar 2016 StDev: 0.45 weeks, Expected Accuracy: 100% Expected Cases Peak Intensity: 2594 cases: 3k StDev: 189, Expected Accuracy: 96% Probability Onset: 21 Feb Duration: 8.0 Sunday, Dec 20, 05:00 2k Observations from Week 67: 98 Cases (error range: 72--124 cases 1k 0k -1k Oct '15 Nov '15 Dec '15 Jan '16 Feb '16 Mar '16 Apr '16 May '16 Jun '16 Observations from Week 67 -O- Forecasts for Week 67 — Week 66 fcast - Week 65 fcast - Week 64 fcast - Week 63 fcast — Week 62 fcast — Week 61 fcast

### **Columbia School of Public Health - Forecasts**

# Limitations of these approaches

Search data proven to be high unstable and unreliable if used by itself

"... Google Flu Trends massively inaccurately predicted the number of flu cases at the end of 2012, as first reported by Nature Magazine..."

"... A comparison with traditional surveillance data showed that Google Flu Trends, which estimates prevalence from flu-related Internet searches, had drastically overestimated peak flu levels. The glitch is no more than a temporary setback for a promising strategy, experts say, and Google is sure to refine its algorithms. But as flu-tracking techniques based on mining of web data and on social media proliferate, the episode is a reminder that they will complement, but not substitute for, traditional epidemiological surveillance networks...."

"...Google Flu Trends had missed last season by quite a lot, over 100 percent ..."

# Limitations of these approaches

- Disease centric, large epidemics (i.e. flu, Ebola)
- Spatial granularity (state/region level)
- Easily put off by media campaigns (like in the Google case)
- Signal-to-noise ratio is usually very low
- Demographic bias (most active web users are young adults and so are not representative of the general public)

Without context or other strong complementary signals it is very difficult to tell if a tweet message indicates that the tweeter is actually ill rather than simply pointing to news articles about flu.

# Why does it matter ?

- So we can time vaccine production and distribution
- Resource planning
- Emergency plans
- Health policies and investments
- More confident decision making
- Greater operational efficiency
- Cost reduction
- Reduced risk

Overall ... Big money is involved

# End of part 2 - Questions ?

Before we move to part 3, are there any questions ?

# What we are doing

# MedsTrends - intro

An analytical tool to monitor and predict health patterns related to healthcare products use based on **health-related queries** and **information consumption**.

**Status** 

Currently in alpha mode (development, debugging, testing...)

# MedsTrends - signals

Data points:

- queries (like the Google Flu data) low weight
- information access (documents) high weight

We believe our signal-to-noise ratio is high as it is not based just on search queries but on the actual reading of information related to a product.

Weights are added depending on the duration of the interaction and the sequence of events.

Typical search engines record what you search and where you go next but NOT what you do at your destination.

## MedsTrends – ATC code analysis

Data points:

**Clustering:** 

- time
- location
- product information access

• by ATC code

The Anatomical Therapeutic Chemical (**ATC**) Classification System is used for the classification of active ingredients of drugs according to the organ or system on which they act and their therapeutic, pharmacological and chemical properties.

For example: acetylsalicylic acid (aspirin), has A01AD05 as a drug for local oral treatment, B01AC06 as a platelet inhibitor (heart disease) and N02BA01 as an analgesic and antipyretic.

Great method to overcome language and name differences.

Compare the use of aspirin (acetylsalicylic acid) as an analgesic and antipyretic Versus platelet inhibitor (*myocardial infarction, atrial fibrillation,* following coronary bypass, angioplasty and stenting. It is also used as prophylaxis to prevent myocardial infarction and stroke).

ATC code: (A01AD05 + N02BA01) vs B01AC06

Therapeutic main groups: A01 STOMATOLOGICAL PREPARATIONS N02 ANALGESICS B01 ANTITHROMBOTIC AGENTS

Time: Jan-Apr 2015 Location: Italy - Hungary

Use of aspirin (acetylsalicylic acid) as analgesic and antipyretic

ATC code: A01AD05 + N02BA01

Time: Jan-Apr 2015 Location: Italy vs Hungary



Use of aspirin (acetylsalicylic acid) as platelet inhibitor

#### ATC code: B01AC06 Time: Jan-Apr 2015 Location: Italy vs Hungary



Use of anti-acne products

ATC code: D10

Identify areas of interest for anti-acne products

Use of anti-acne products ATC code: D10 ANTI-ACNE Time: Jan 2014 to Dec 2015 Location: Africa



Use of anti-acne products ATC code: D10 ANTI-ACNE Time: Jan 2015 to Dec 2015 Location: World



Use of anti-acne products ATC code: D10 ANTI-ACNE Time: Jan 2015 to Dec 2015 Location: Middle East



Use of products for diabetes ATC code: A10 (DRUGS USED IN DIABETES) Identify areas of interest for diabetes-related products



## MedsTrends Other questions we can try to answer

Most "popular" product in each country, region by week/month/year

Most "popular" active ingredient in each country, region by week/month/year

Time lapse of seasonal healthcare products

Time lapse of seasonal healthcare illnesses

etc...

# Next steps

### Limitations

- Strong population density bias (more people=more searches?)
- Geographical coverage

Integrate population density data to work with (events/user) instead of total events.

Spot anomalies in data

Make our big data bigger with:

- other open datasets (Google trends data, Hospital data, Disease Centers data)
- actual product sales and usage

Find more interesting questions to answer (collaboration with epidemiology centers)

Partnerships with healthcare solutions providers

# **Conclusions and take away points**

• 175 million daily searches on Google are health related (every day !)

- Huge interest from companies (producers, insurance etc...) and governments in health data
- With health data it is difficult to find good answers but a lot more difficult to find the good questions

• Education in healthcare is a big problem area: more and more people self diagnose through the Internet more and more products freely available (no doctor consultation required)

It is an incredibly interesting, innovative and growing area to work on !



### Last chance ...

## Contacts



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