

# ISE 599

# Special Topics Applied

# Predictive Analytics

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# Graphs and knowledge graphs: brief introduction

# Where does the story begin?

- Koenigsburg!

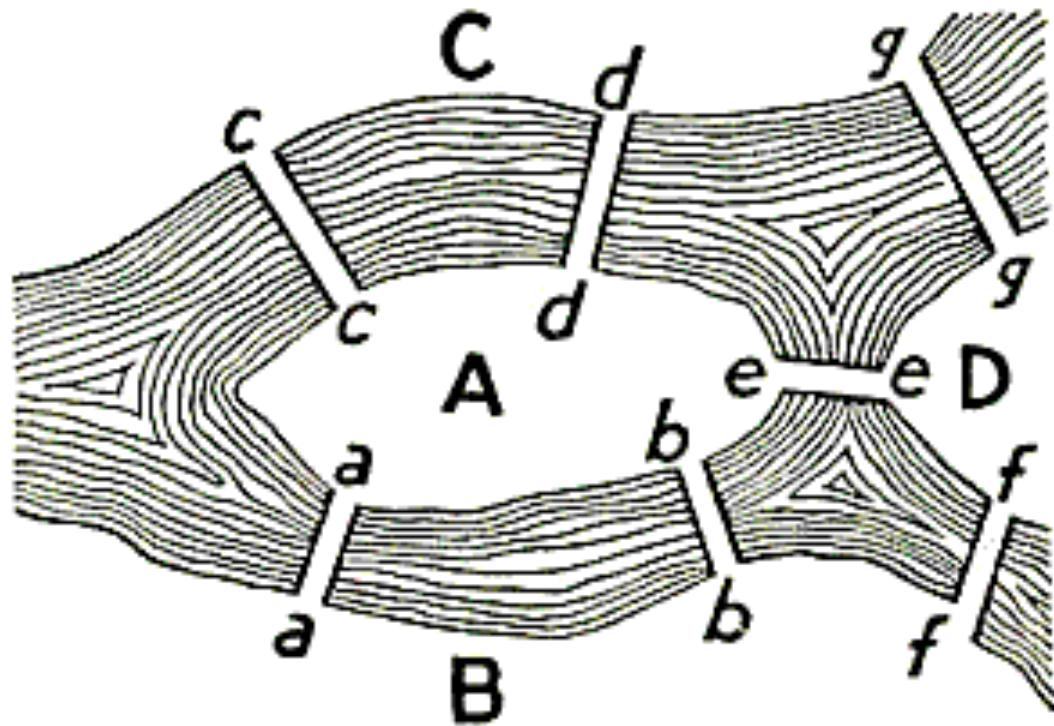
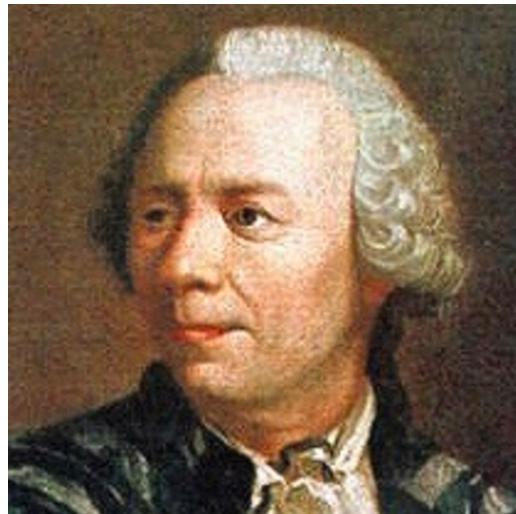
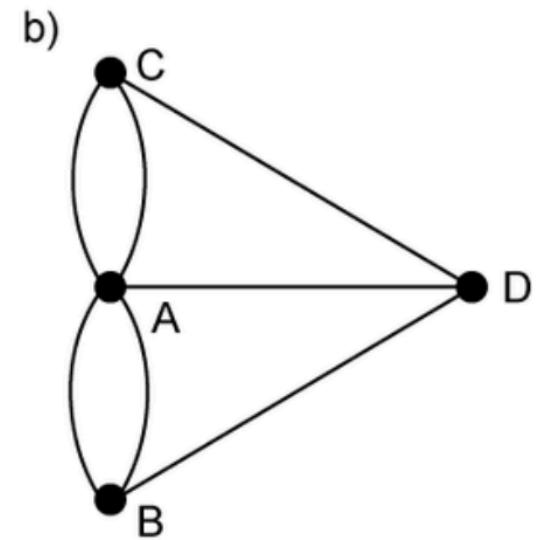
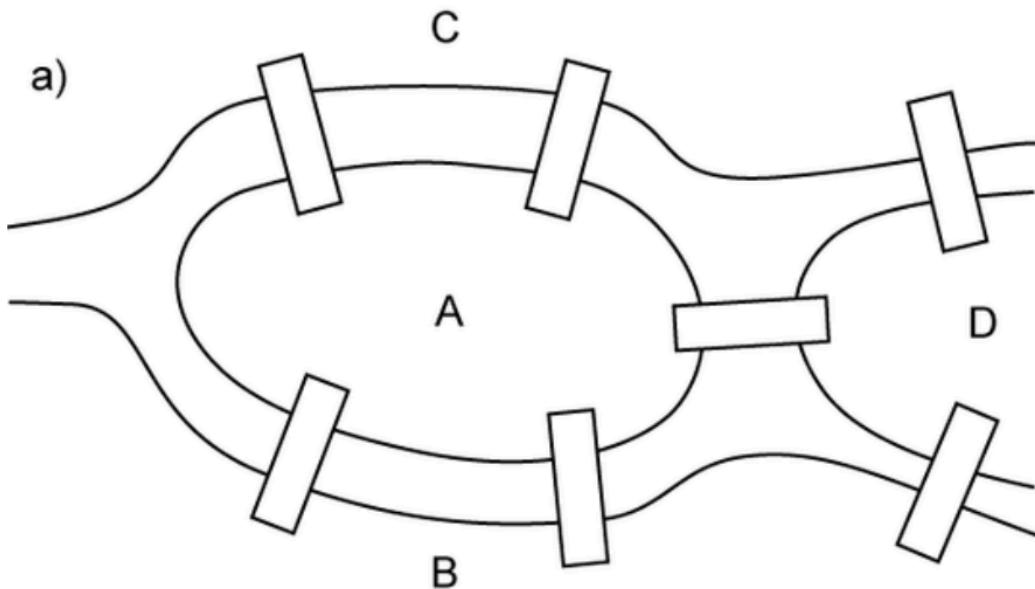


FIGURE 98. *Geographic Map:  
The Königsberg Bridges.*

# Bridge problem as graph



# Social networks



# Twitter API

# Lots of ideas to work on if you're interested in social media

- <https://www.binghamton.edu/news/story/1983/new-algorithm-can-distinguish-cyberbullies-from-normal-twitter-users-with-90-perceraccuracy>

## The DARPA TWITTER BOT CHALLENGE<sup>1</sup>

V.S. Subrahmanian, University of Maryland, vs@cs.umd.edu

Amos Azaria, Carnegie Mellon University and Sentimetricx, amos.azaria@gmail.com

Skylar Durst

Aram Galstyan  
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## Sentiment Analysis of Twitter Data

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## Open Domain Event Extraction from Twitter

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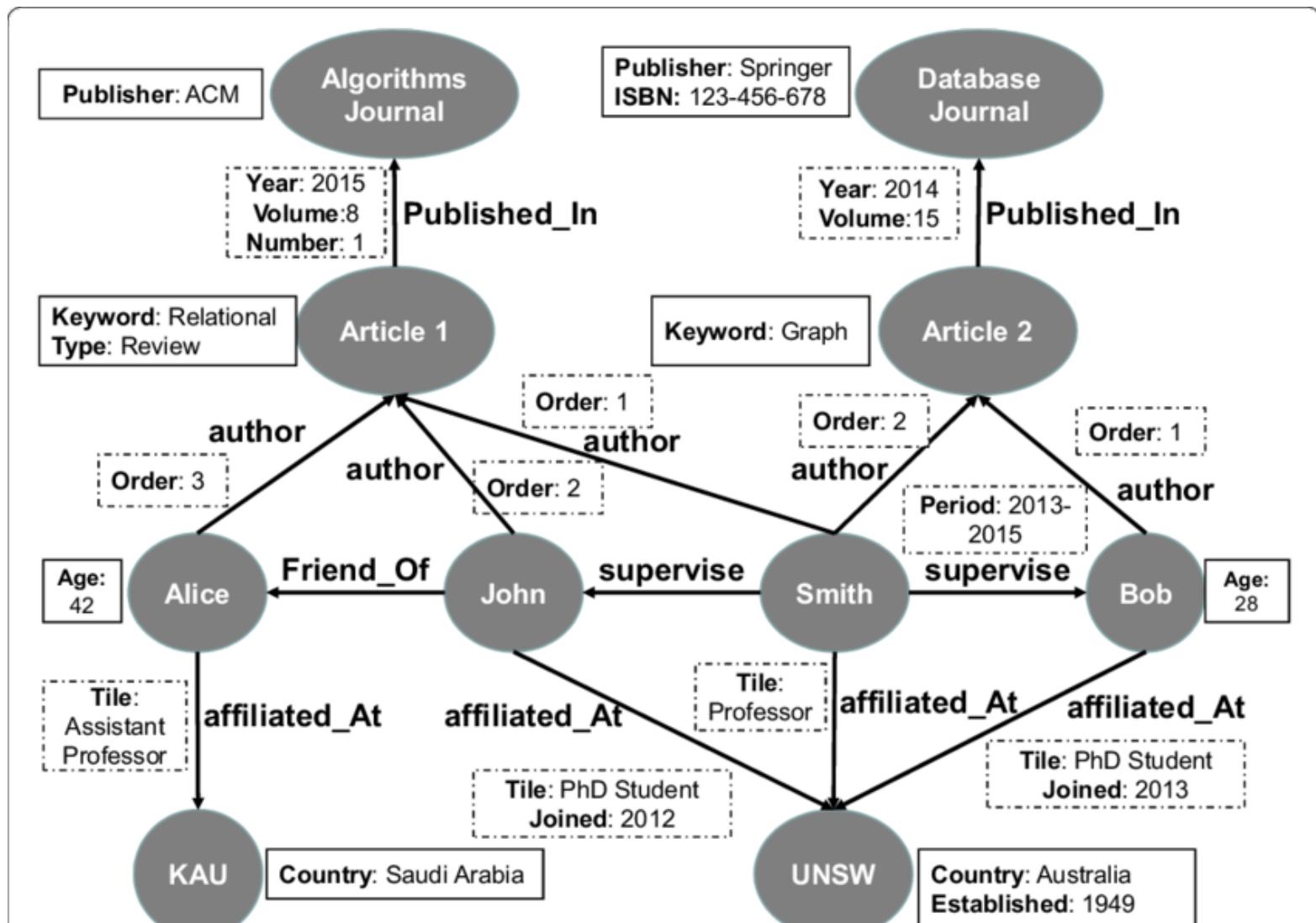
Sam Clark\*  
Decide, Inc.  
Seattle, WA  
sclark.uw@gmail.com

Open Events

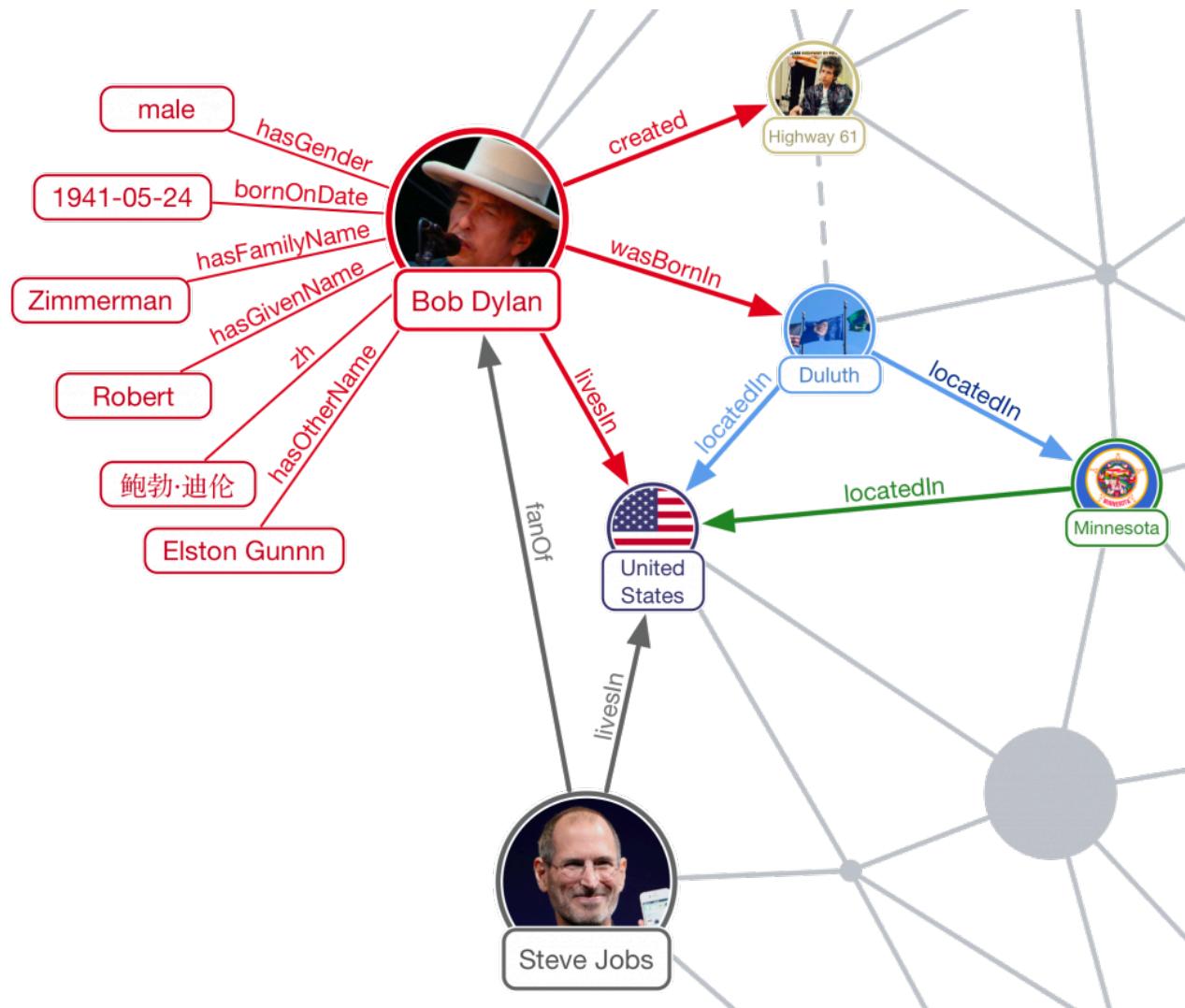
## Predicting the Political Alignment of Twitter Users

Michael D. Conover, Bruno Gonçalves, Jacob Ratkiewicz, Alessandro Flammini and Filippo Menczer  
Center for Complex Networks and Systems Research  
School of Informatics and Computing  
Indiana University, Bloomington

# Attributed graphs



# Knowledge Graphs



# Google Knowledge Graph



# Where have I seen it before?



places to visit san jose



All Maps Images News Shopping More Settings Tools

About 77,800,000 results (1.02 seconds)

## Top things to do in San Jose



Winchester Mystery House  
Quirky mansion with odd design details



The Tech Interactive  
Interactive displays & an IMAX theater



Mission Peak  
Mountain with an iconic summit pole



Happy Hollow Park & Zoo  
Animals, activities & conservation focus

[More things to do](#)

## Things To Do & Places To See in San Jose | Visit San Jose

<https://www.sanjose.org/things-to-do> ▾

Vibrant, diverse and accessible, San Jose shines with 300+ days of sunshine that assures indoor and outdoor activities for every inclination. Whether it's nightlife ...

[Attractions and Amusement](#) · [Kids and Family](#) · [San Jose Wineries](#) · [Nightlife](#)

## Complete List of San Jose Attractions | Visit San Jose

<https://www.sanjose.org/things-to-do/attractions-and-amusement> ▾

Find a complete list of San Jose attractions and things to do - perfect for tourists and ... Browse the best places to see in San Jose and the surrounding Bay Area.

## 25 Best Things to Do in San Jose (CA) - The Crazy Tourist

<https://www.thecrazytourist.com> › ... › United States › California (CA) ▾

25 Best Things to Do in San Jose (CA): Winchester Mystery House: Flickr. Tech Museum Of Innovation: Flickr. Children's Discovery Museum: Flickr. Rosicrucian Egyptian Museum: Flickr. San



## San Jose

City in California

San Jose is a large city surrounded by rolling hills in Silicon Valley, a major technology hub in California's Bay Area. Architectural landmarks, from the 1883 Italianate-style Oddfellows building to Spanish Colonial Revival structures, make up the downtown historic district. The downtown area is also home to the Tech Museum of Innovation, devoted to the exploration of science and technology.

**Weather:** 64°F (18°C), Wind NW at 10 mph (16 km/h), 85% Humidity

**Population:** 1.035 million (2017)

## Plan a trip

[San Jose travel guide](#)

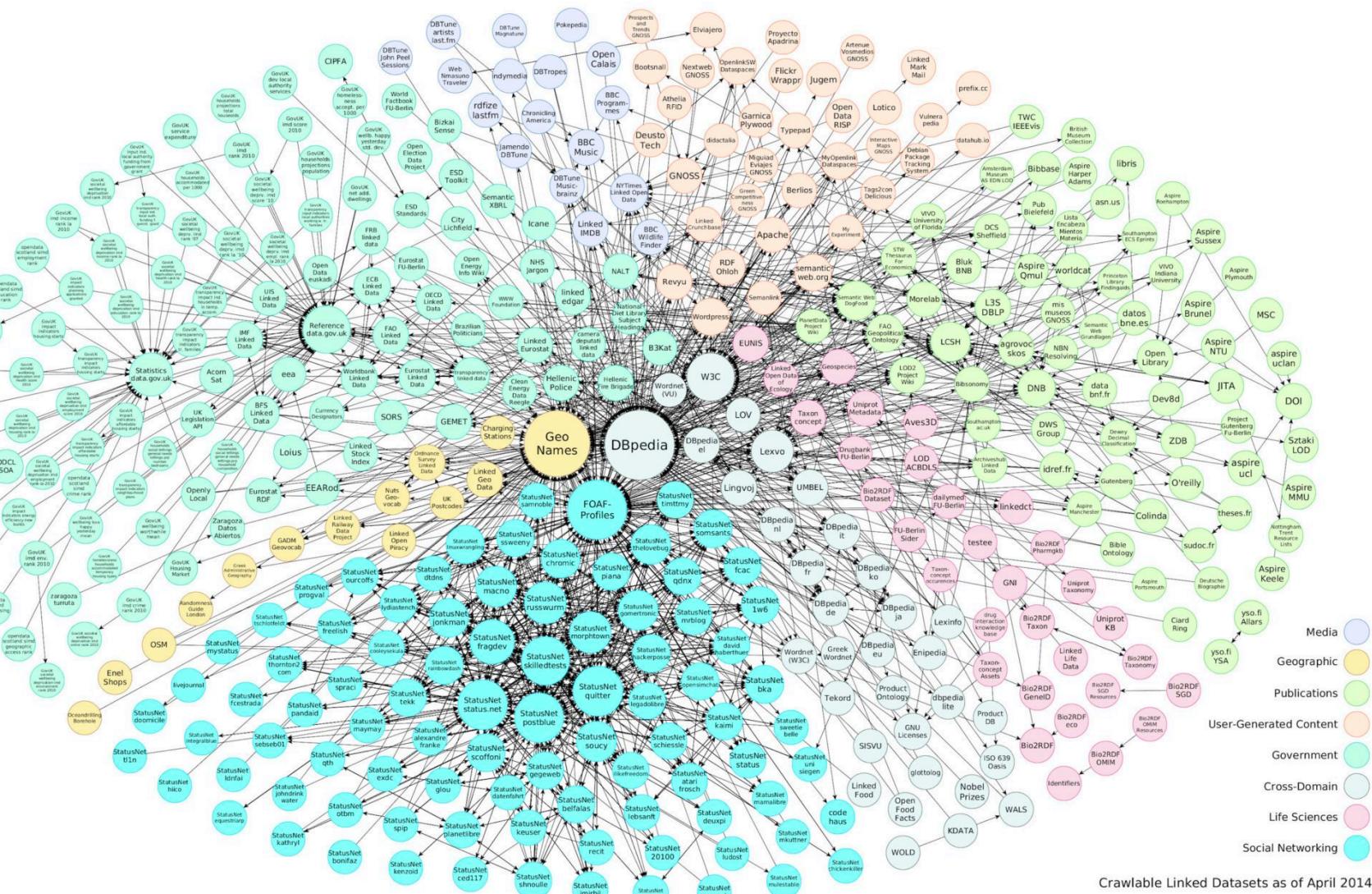
[3-star hotel averaging \\$206](#)

[1 h 5 min flight, from \\$97](#)

**Did you know:** San Jose, California has the largest Vietnamese-American population (106,000) among all U.S. cities with a Vietnamese American population of 5,000 or more.

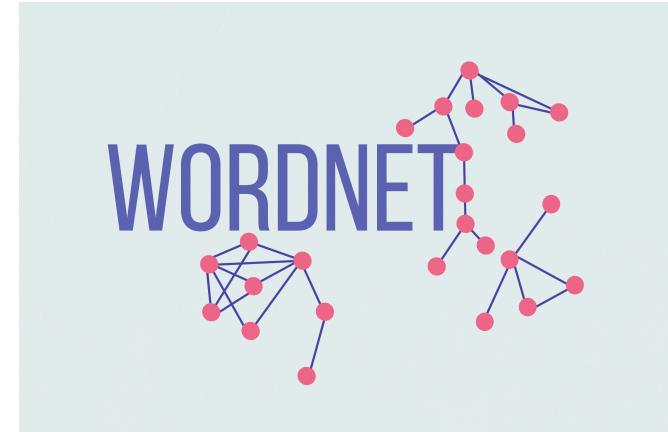
# Lots of interest from industry

- KG-focused companies/startups
  - --Diffbot, Semantic Web Company, OntoText, Capsenta...
- Companies like Thomson Reuters
- Lots of anecdotal evidence that big tech companies are investing internally
- Finance could be the next big ecosystem for KGs (if not already)



Crawlable Linked Datasets as of April 2014

# Some resources



Showcase: wikidata, dbpedia,  
geonames...