

# Web Mining: Blogspace and Folksonomies

A Guide to Web Research: Lecture 3

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## Outline

- 1 Introduction to Blogspace
- 2 Introduction to Folksonomies
- 3 Algorithmic Challenges
  - Personal News Aggregation
  - Structure Discovery in Folksonomies

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## Talk Objective

### Today:

- Short description of technology
- Technological challenges
- Algorithmic problems

### To do:

- Adding assumptions to the problems
- Constructing (approximate) algorithms

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## Part I Blogspace

What is blogspace?

What related technologies are supposed to appear in nearest future?

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## Blogspace: Overview

**Blogspace** (Blogosphere) is a set of all weblogs

**Every blog consists of:**

- Profile
- Posts: title, content, time-stamp, comments, tags
- Subscribers

**Prominent technologies in the field:**

Blogger, Livejournal, Wordpress, Technorati

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## Technological Challenges in Blogspace

- Blog search and blog ranking
- Personal newspaper: every user every day receives personal digest of all posts in the world
- Advertising in blogspace, in particular, understanding information propagation in blogspace
- Tracking blogspace reflections of real life events

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## Part II Folksonomies

What is folksonomy?

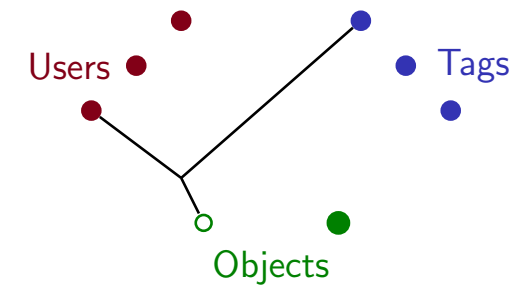
What related technologies are supposed to appear in nearest future?

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## Folksonomy: Overview

**Folksonomy** is a set of triples  $\langle user, object, tag \rangle$

**Primary purpose:** memory assistance



**Prominent technologies in the field:**

Del.icio.us, Flickr.com, tags in blogspace, Gmail labels

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## Technological Challenges in Folksonomies

- Tag-based file system
- Utilizing folksonomies in web search
- Tag subscriptions and other folksonomy-based recommendations
- Second layer challenge: discover and visualize relations between tags
- Automatic labelling

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## Part III Algorithmic Challenges

Personal news aggregation

Structure discovery in folksonomies

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## Personal News Aggregation: Informally

### Personal news aggregation:

Every user has a preference profile:  
specified information sources, keywords,  
tags(topics), popularity,  
references to the preferences of others

Every news item has its own description:  
text, votes and recommendations, tags,  
author reputation, comments

### All-to-all filtering:

To find, say, ten most appropriate news items  
for every user

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## Personal News Aggregation: Solutions

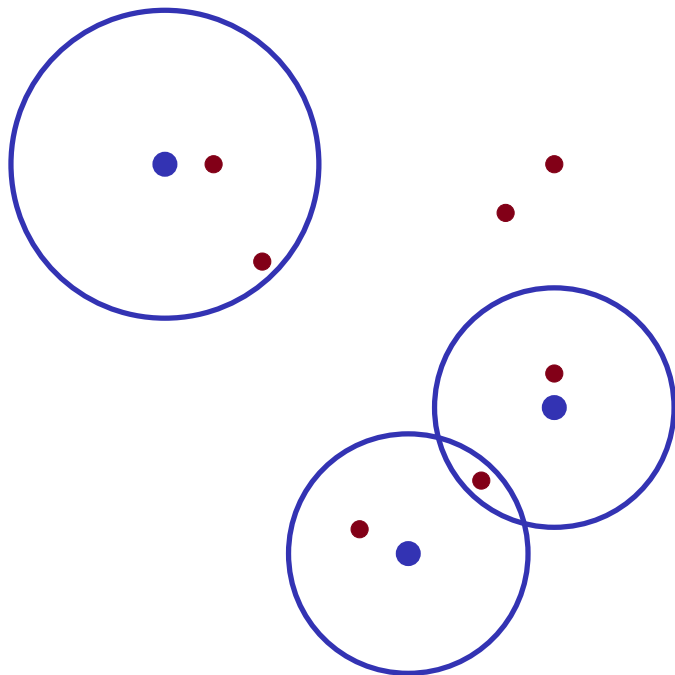
### Personalized news delivery:

Google News  
Google Reader  
Bloglines  
Livejournal Friends  
Feedburner

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## Formalization

- Every news is represented by a sparse vector
- Every user profile is represented by a sparse vector
- Similarity is defined as cosine between two vectors
- **Simplification:** 0/1 vectors, similarity proportional to the size of intersection



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## Large Scale All-to-All Nearest Neighbors

- $N$  **blue** vectors in  $d$ -dimensional space, every vector has at most  $k$  nonzero components
- $M$  **red** vectors in  $d$ -dimensional space, every vector has at most  $k$  nonzero components
- To find 10 nearest (according to cosine similarity) **red** vectors to every **blue** vector
- Desired time complexity

$$(N + M) \text{polylog}(N + M) \text{poly}(k)$$

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## All-to-All Nearest Neighbors in Set Notation

- $N$  **blue** sets, each of size at most  $k$
- $M$  **red** sets, each of size at most  $k$
- To find 10 nearest (according to intersection-size similarity) **red** sets to every **blue** one in time

$$(N + M) \text{polylog}(N + M) \text{poly}(k)$$

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## Structure Discovery in Folksonomies

**Problem:** finding similar tags in folksonomy

**Evidences of similarity:**

- Inner co-occurrence: some user applied both tags to some object
- Outer co-occurrence: one user applied the first tag, another user applied the second tag to the same object

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## Discovering Related Tags

- Bipartite graph tags-objects,  $F$  edges
- Task 1: for every tag find 10 nearest tags
- Task 2: for a given  $\alpha$  find all tag pairs that have similarity above  $\alpha$
- Desired time complexity:  $F \cdot \text{polylog}(F)$

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## Tag similarity

**Projection to bipartite graph:**

Removing users from folksonomy

Notation:  $Q(t)$  is the set of all objects tagged by  $t$

**Three formulas for tag similarity:**

$$\text{Sim}(t_1, t_2) = |Q(t_1) \cap Q(t_2)|$$

$$\text{Sim}(t_1, t_2) = \frac{|Q(t_1) \cap Q(t_2)|}{|Q(t_1)| + |Q(t_2)|}$$

$$\text{Sim}(t_1, t_2) = \frac{|Q(t_1) \cap Q(t_2)|}{\min\{|Q(t_1)|, |Q(t_2)|\}}$$

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## Discussion

Which of these two problems do you like more?

Changes to presented formalization?

Ideas and approaches?

Relevant work?

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## Call for participation

Know a relevant reference?  
Have an idea?  
Find a mistake?  
Solved one of these problems?

- Knock to my office 1.156
- Write to me [yura@logic.pdmi.ras.ru](mailto:yura@logic.pdmi.ras.ru)
- Join our informal discussions
- Participate in writing a follow-up paper

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## References (1/2)

### Course homepage

<http://logic.pdmi.ras.ru/~yura/webguide.html>

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## Highlights


### Three problems to think about:

- All-to-all nearest neighbors in sparse vector model
- All-to-all nearest neighbors in set notation with intersection-size similarity
- Finding all over-threshold similarities between tags in folksonomy

Vielen Dank für Ihre Aufmerksamkeit!  
Fragen?

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