



# A Case Study on Emergent Semantics in Communities

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- Folksonomies
  - What are they?
- Comparison to taxonomies
  - Methodology
  - On the data level
- Folksonomies and peer-to-peer networks
  - User behaviour
  - Usable as test data?
- Related work
- Summary

- Multi-user web applications that provide a simple categorization system

- Items

- Web pages (Deli.cio.us, Furl, ...)
- Images (Flickr)
- Citations (Connotea, CiteULike)

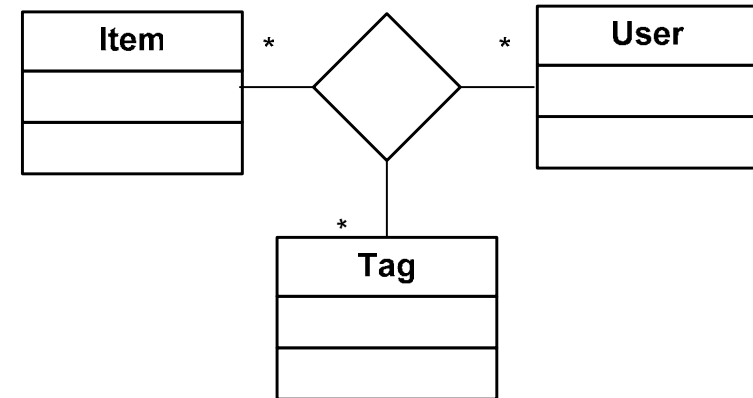
- Tags = keywords

- Can be chosen freely

- Every user has a web page with a list of own items

- Sorted in reverse-chronological order
- Can be filtered by tag(s)

- Public access to item collections and meta-data



# Example: del.icio.us user interface

del.icio.us/cancer - Mozilla Firefox

Datei Bearbeiten Ansicht Gehe Lesezeichen Extras Hilfe

http://del.icio.us/cancer?v=3&url=http%3A%2F%2F... Go

Google Scholar Google HTTPS SqWebMail - ... LEO Deutsch-Englisc... post to del.icio.us

**del.icio.us / cancer** popular | about  
your bookmarks | inbox | for | post logged in as **cancer** | settings | logout

url

description

notes  optional

tags  space separated

suggestions **semanticweb**

▼ **your tags (click to add)** » sort: alphabetically | [by frequency](#)  
academia autosuggestion career cognitive **delicious** documentation engine english flickr folksonomies  
games google graph help links management mysql **network** nintendo ontology performance psychology  
science search shirky social taxonomy time tools visionen visualisation

▼ **popular tags (click to add)**  
**semanticweb**

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# “Bottom-up” approach to categorization

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- No pre-defined model or hierarchy
- Inconsistencies
  - Synonyms, homonyms
  - Singular and plural versions of a tag
  - Keywords that consist of two terms
    - i.e., semantic web, semantic\_web, semanticweb
- Relies on aggregation of meta-data
  - Tag frequency distribution
    - Tags most often used to annotate an item categorize it best
    - No need to reach consensus
  - Relationships between tags evolve from meta-data
- Amount of meta-data crucial!
  - Number of users, lifetime of folksonomy

- Lots of discussions about taxonomies vs. folksonomies, e.g., Clay Shirky 2005
- Experiment: compare meta-data from two big community projects that categorize Web pages to find out about the differences
  - DMOZ open directory project <http://dmoz.org/>
    - Taxonomy for Web pages
    - ~600000 concepts and ~5000000 instances
    - Available in RDF format (two big files)
  - Social bookmarking site <http://del.icio.us/>
    - No official numbers, ~100000 users
    - RDF file for each collection and for each item

## ■ Procedure

- Use only items from del.icio.us that were annotated by more than 100 users (= popular items)
- Download random popular items from del.icio.us
- Lookup if items are present in the DMOZ collection
  - ~25 % of the items were also present in DMOZ

## ■ 788 items with meta-data from both sources

- ~50 % of them are instances of DMOZ concept Top/Computers

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URL http://arxiv.org/
DMOZ Top/Science/Physics/Publications
DMOZ Top/Science/Math/Publications
DMOZ Top/Science/Math/Publications/Online_Texts/Collections
DMOZ Top/Science/Publications/Archives/Free_Access_Online_Archives
ID 19aa8ff1e9e2a06677ab34f3f2a5b0c8
TITLE arXiv.org e-Print archive
TAGS physics:43;science:41;research:27;math:23;papers:19;reference:18;ma
thematics:15;journal:10;articles:10;archive:9;biology:8;eprint:7;library
:7;preprint:6;books:6;programming:6;cs:5;article:5;academic:5;computer:4
;arxiv:4;literature:4;toread:4;computerscience:4;ai:3;study:3;
```

## ■ Preparations

- Convert to lower case, remove underscores and hyphens
- Remove last character s because of singular/plural tags
- Don't consider Top/World (multi-lingual categories)
- Remove all categories with one character only (/A - /Z)
- Remove Top category
- Sort category names in reverse to put most specific entry first
- Rank tags by number

## ■ Example

- Top/Science/Math/Publication -> publication math science

## ■ How to compare?

- Avg. DMOZ hierarchy length: 4,67
- Avg. deli.cio.us tags per item: 24,59



- Lookup for each DMOZ category
  - Is it included in the del.icio.us tags?
- Take top 1, 3, 5, 10, 15, all tags into account
  - Top tag is included in ~50% of the cases
  - Top 5 is the fairest comparison
  - Top tags match more often than the less popular ones

	1st	2nd	3rd	4th	5th	6th	7th to 11th
Top tag	9,44 %	15,94 %	12,67 %	4,72 %	3,28 %	1,72 %	0,81 %
Top 3 tags	20,37 %	27,55 %	21,58 %	14,29 %	12,23 %	6,21 %	2,30 %
Top 5 tags	28,32 %	34,81 %	27,72 %	19,75 %	16,42 %	11,03 %	3,69 %
Top 10 tags	37,38 %	44,53 %	35,94 %	27,08 %	25,91 %	18,28 %	6,25 %
Top 15 tags	44,30 %	52,45 %	43,17 %	34,16 %	32,12 %	26,55 %	8,93 %
All tags	52,99 %	62,55 %	52,48 %	46,34 %	44,34 %	40,34 %	14,73 %

- Architectures are very different
  - Folksonomies are centralized systems, aggregation is easy
  - Peer-to-peer networks are distributed, aggregation is hard
- User behaviour is comparable
  - Act autonomously
  - No central authority
  - Want to share information
- Data from a folksonomy can be used to model peers and content distribution
  - No data about queries available
- Experiment
  - Can subsets of the del.icio.us data be selected in such a way that the principle of interest-based locality be observed in these subsets?

# Can interest-based locality be observed?

## ■ Interest-based locality

- "If peer A has a particular piece of content peer B is interested in, it is likely the case that the other information items stored by peer A are also of interest to peer B."

## ■ Method

1. Retrieve all users from del.icio.us that store a random bookmark
2. Retrieve all their collections

## ■ Retrieved 4 test sets

- 155, 248, 280, 551 users
- Distribution of items among users nearly equal in the test sets
- Avg.: 84% of items are not shared!

Not shared	84 %
By 2 users	8.9 %
By 3 users	2.92 %
By 4 users	1.49 %
5-10 users	2.18 %
> 10 users	0.51 %

- Adam Mathes, 2004: *Folksonomies – Cooperative Classification and Communication Through Shared Metadata*
  - Very good introduction
- Clay Shirky, 2005: *Ontology is Overrated: Categories, Links and Tags*
  - Controversial discussion of taxonomies vs. folksonomies
- Scott Golder and Bernardo Huberman, 2005: *The structure of Collaborative Tagging Systems*
  - Cognitive aspects
  - Data analysis: Tag frequency distribution for an item is stable over time

- Investigated the properties of meta-data provided by a folksonomy
- Compared it to DMOZ data collection
- Tried to find interest-based locality
- Paper contains some other experiments I did not have time to tell you about
- Open questions
  - Is there a way to combine the bottom-up and top-down approach for creating metadata?
  - How much could the semantic web benefit from it?