

endowed chair of the hertie foundation Knowledge and Data Engineering electrical engineering & computer science, university of kassel

## ECML PKDD Discovery Challenge 2009

## Tag Recommendations in BibSonomy

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Sponsored by:





- Task 1 = mostly unknown data
  - Keep it simple
  - Gather tags from various sources (title, content, external services, different spellings)
  - Re-order tags for personalization
  - Clever selection and combination strategies win
- Task 2 = user, resource, tags known
  - Sophisticated methods are useable and useful
  - Factor models, classification, graph-based, CF, etc.
  - Simple methods work, too



Since Task 1 is the >90% case, use simple methods (they're quick, too!)

### Online Tag Recommendations for Social Bookmarking Systems



I ➤ I → ibSonomy :: blue social bookmark and p ome ▼myBibSonom	edit bookmark ublication sharing system.	settings · logout · help · blog · about · 📰 🖼 4 picked in basket · edit tags	
	Feel free to edit your bookmark	filter:	
– general information url⁴ title⁴ description, comment	http://www.cmcrossroads.com/content/view/7657/120/ The Basics: Getting environment variables into GNU Make The most basic rule of GNU Make and the environment is that any variable set in the environment when GNU Make is started will be available as a GNU Make macro inside the Makefile. For example, if FOO is set in CM Crossroads, the configuration management community, The most basic rule of GNU Make and the environment is that any variable set in the environment when GNU Make is started will be available as a GNU Make is started will be available as a GNU Make is started will be available as a GNU Make is run then the following Makefile: \$(warning \$(FOO))	■ relations (show all   hide all) ↓ author ← newman ↓ conference ← ecai ecmlpkdd gvd iccs icdm icfca recsys ↓ folksonomy ← bookmarking tagging ↓ geo ← gps map utm ↓ howto ← manual reference tutorial ↓ location ← anhalt berlin bitterfeld bled celle dresden europe frankfurt hannover kassel london magdeburg ort sachsen sachsen_anhalt toulouse tübingen wittenberg	
-tags*	environment export gnu make makefile programming	↓ ort ← location ↓ programming ← ada c fortran java lisp perl ruby ↓ protocol ← ftp http smtp	
recommendation	linux software opensource gnu	↓ researcher ← devadze shannon turing ↓ science ← chemistry math	
viewable for*	relevant for	↓ software ← apache beagle cocoa debian eclipse firefox haystack nextstep photoshop protege	
	tag recommendations for the use time constraints (!)	er in a live setti	

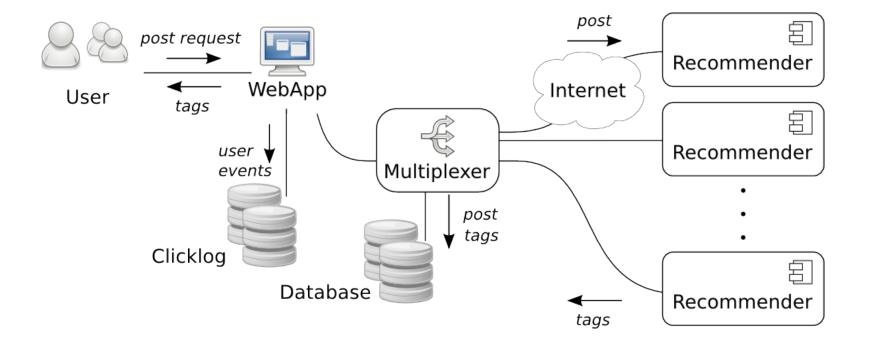
3

- Participants:
  - 13 Different Recommender Systems
  - 10 Participants
  - 7 Countries



- BibSonomy:
  - 1500 active users
  - >28.000 posting processes, >2000 per recommender system
  - For evaluation only public non-spam posts are considered
  - → ~410 relevant posting processes per recommender system

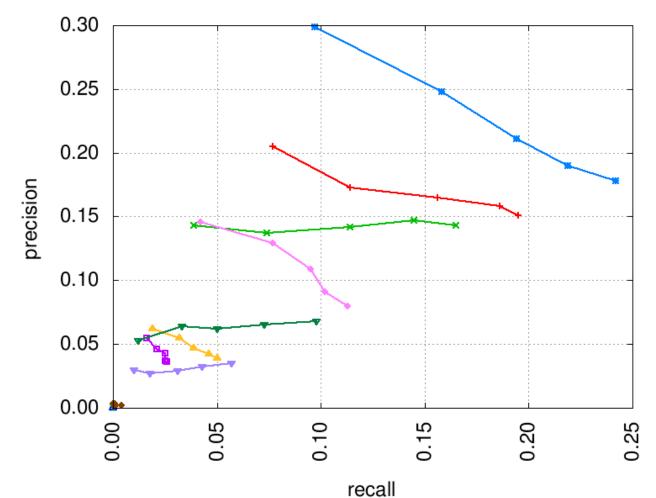
Website: http://www.kde.cs.uni-kassel.de/ws/dc09/



- Each *post request* is sent to every recommender system
- One of which is *randomly selected* (without replacement)
- Only responses within a 1000 ms timeout are considered
- Recommended tags are presented to the user

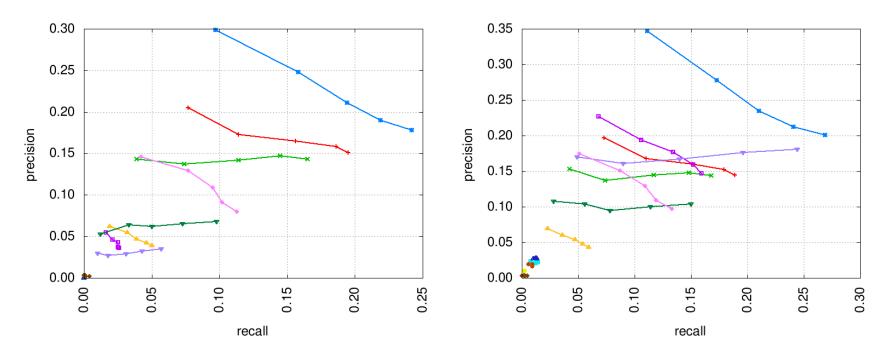
#### Some Results

- **Precision:** "How many recommended tags where adequate"?
- **Recall**: "How many of the true tags where recommended?"



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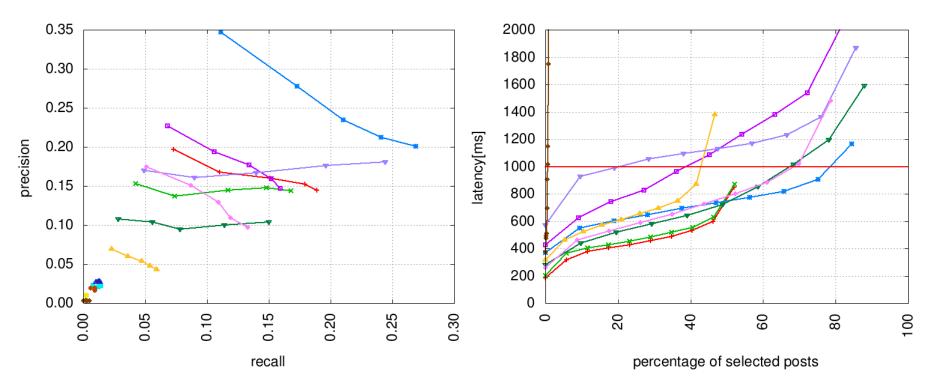
With timeout constraints

Without timeout constraints

#### Some Results



- **Precision:** "How many recommended tags where adequate"?
- **Recall:** "How many of the true tags where recommended?"



*P*/*R* with timeout constraints

Latency, ordered ascending



# (will be announced this evening)

Precision	Recall	F1-Measure
0.178	0.242	0.205
0.151	0.195	0.171
0.143	0.165	0.154



CONGRATULATIONS !!!