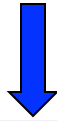


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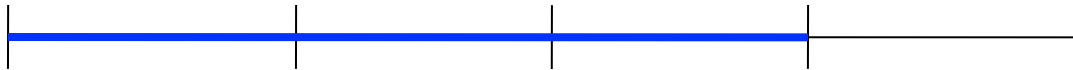
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del.icio.us Hotlists Experiment

- **116,177 del.icio.us users**
 - who tagged 175,691 distinct URLs
 - using 903 tags
 - for a total of 2,322,458 tagging actions
 - for 1 month in 2006
- **Evaluate how networks predict user's interest**
 - *J. Stoyanovich, S. Amer-Yahia, C. Yu, C. Marlow: Leveraging Tagging Behavior to Model Users' Interest in del.icio.us (AAAI Workshop on Social Information Processing 2008)*



A/B testing: user behavior in first 3 weeks to predict 4th week

Data Model

- users $u \in U$, tags $t \in T$, items $i \in I$
- $friends(u)$ directional
- $tags(u)$
- $items(u)$ & $items(u,t)$
- $taggers(i)$ & $taggers(i,t)$

Tagging data has a long tail

- we have to clean it for efficiency (relational processing)
- we removed unpopular tags (< 4 uses) & URLs (< 10 uses), reduced to 27% of original size

Global

10 URLs that are tagged most often over-all

Performance

coverage (global) = 3%

scope (global) = 100%

Global Top-10

Rank	URL	Votes
1	<i>google.com</i>	980
2	<i>facebook.com</i>	820
3	<i>iTunes.com</i>	729
4	<i>twitter.com</i>	720
5	<i>jonasbrothers.com</i>	680
6	<i>cnn.com</i>	678
7	<i>amazon.com</i>	620
8	<i>yahoo.com</i>	525
9	<i>youtube.com</i>	524
10	techcrunch.com	492



Items(Chris)

URL	Tag
<i>jars.com</i>	<i>java</i>
<i>java.sun.com</i>	<i>java</i>
techcrunch.com	<i>news</i>
<i>devshed.com</i>	<i>tutorial</i>



Items(Ben)

URL	Tag
<i>bbc.co.uk</i>	<i>news</i>
<i>pbs.org</i>	<i>news</i>
<i>tomwaits.com</i>	<i>music</i>
<i>nick-cave.com</i>	<i>music</i>
<i>loureed.com</i>	<i>music</i>

Tag-based

- If a user tags with *sports*, he is interested in sports-related content
 - $\text{interest}(u,t) = |\text{items}(u,t)| / |\text{items}(u)|$

Top-10 for “news”

Rank	URL	Votes
1	<i>cnn.com</i>	610
2	<i>bbc.co.uk</i>	503
3	<i>npr.org</i>	427
4	<i>nytimes.com</i>	414
5	<i>slashdot.org</i>	392
6	<i>reuters.com</i>	330
7	<i>news.cnet.com</i>	290
8	<i>msnbc.msn.com</i>	250
9	<i>news.yahoo.com</i>	180
10	<i>digg.com</i>	149

Top-10 for “music”

Rank	URL	Votes
1	<i>iTunes.com</i>	542
2	<i>eMusic.com</i>	420
3	<i>pandora.com</i>	350
4	<i>thebeatles.com</i>	330
5	<i>jonasbrothers.com</i>	215
6	<i>madonna.com</i>	175
7	<i>rhapsody.com</i>	148
8	<i>rollingstones.com</i>	133
9	<i>lastfm.com</i>	120
10	<i>beyonce.com</i>	107

Items(Ben)

URL	Tag
<i>bbc.co.uk</i>	<i>news</i>
<i>pbs.org</i>	<i>news</i>
<i>tomwaits.com</i>	<i>music</i>
<i>nick-cave.com</i>	<i>music</i>
<i>rollingstones.com</i>	<i>music</i>

Build one global hotlist per tag, use in one of two ways

- **best_tag**
hotlist = top-10 for tag for which user has highest interest
- **dominant_tags**
hotlist is a combination of up to 3 top-10 lists s.t. $\text{interest}(u,t) \geq 0.3$ (user has *strong interest* for these tags)

Performance of Tag-based

`best_tag`

coverage = 9%

scope = 100%

`dominant_tags`

1 tag coverage = 10%

scope = 32%

2 tags coverage = 14%

scope = 14%

3 tags coverage = 18%

scope = 6%

Network-based

Choose 10 most popular URLs from those tagged by a user's friends.

coverage (friends) = 43%

scope (friends) = 31%

Common Interest Networks: URL-interest

Identify the seed -- a set of users who tag many of the same URLs as the user u (“agree with u ”). Hotlist = 10 most popular URLs tagged by users in seed.

$$\text{agr}(u, f) = |\text{items}(u) \cap \text{items}(f)| / |\text{items}(u)|$$

$$U_{\text{scope}} = \{u \in U \mid \exists f \in U, \text{agr}(u, f) > \text{threshold}\}$$

$$U_{\text{seed}} = \{f \in U \mid \text{agr}(u, f) > \text{threshold}\}$$

$$\text{thresh} = 0.3 \text{ coverage} = 61\%$$

$$\text{scope} = 1.2\%$$

$$\text{thresh} = 0.5 \text{ coverage} = 71\%$$

$$\text{scope} = 0.7\%$$

Common Interest Networks: Tag-URL-Interest

Agreement across the board is rare, let's look at agreement per-tag: may agree with adviser on research, but with mom on cooking.

$$\text{agr}(u, f, t) = |\text{items}(u, t) \cap \text{items}(f, t)| / |\text{items}(u, t)|$$

U_{scope} , U_{scope} defined as for url-interest, combined as in dominant-tags.

$$\text{scope}(\text{tag-url-interest}) = 7\%$$

Tag/Interest-based Methods: a Comparison

Users in the intersection of `dominant-tags`, `url-interest` and `tag-url-interest`, with a strong interest in 2 tags, all thresholds = 0.3

	$ U_{scope} $	avg ($ U_{seed} $)	coverage
<code>dominant-tags</code>	1235	26,856	17%
<code>tag-url-interest</code>	1235	227	82%
<code>url-interest</code>	205	203	85%