## The Blogosphere at a Glance – Content-Based Structures Made Simple

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# Background

The blogosphere is goldmine of information
Dynamic repository of thoughts and opinions
Raw data semantically unstructured
Provide an overview of contents

### -We have blogs

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-We have blogs

-We have implicit (note) semantic relations



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-We have blogs

We have implicit (note) semantic relations
We have a network



A set (bag) of words
That's it — word order discarded
Collected during a certain time period

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Similarity quantified as the Jaccard index

### -Two blogs, $A = \{v_1, v_2, ..., v_m\}$ and $B = \{w_1, w_2, ..., w_n\}$

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Put differently,  $S(A,B) = |A \cap B| / |A \cup B|$ 

# Blog similarity network



### -Nodes are blogs

# Blog similarity network



Nodes are blogs
 Nodes are linked with edges with weights S
 S=0 ⇔ no edge



-Swedish blog data from 5-month period -Collected through *Twingly*\* blog search engine -About 20k blogs considered

\*www.twingly.com

# Minimal pre-processing

No stemming etc
Keep words that are uncommon, but not too uncommon
Info content per word likely to increase
Computationally more tractable





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Agglomerative clustering technique [Clauset, 2005]

-Partition that maximizes modularity







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#### Monte Carlo sampling

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#### Monte Carlo sampling

-Maximum likelihood





### Third observation

### -Spam blogs (splogs) are revealed as outliers







### Simple methods reveal valuable information

# Simple methods reveal valuable information —The signal in raw blog data is strong!

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Simple methods reveal valuable information The signal in raw blog data is strong! **Blogosphere highly structured** Applications on multiple granularity levels —Navigation and monitoring Splog detection

