

# Towards a Personalized Blog Site Recommendation System: a Collaborative Rating Approach

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# The blogosphere

- A rich-in-semantics field of information
  - Many authors
  - A multitude of user-provided tags
  - High update rate
  - Time information attached to each post
  - An inherent connectivity between blogs and bloggers
  - Hyperlinks between posts, but also between bloggers (recommended blogs in the blog roll of a blogger)



# Blogs



MONDAY, AUGUST 3, 2009

## Monday Musette - San Sebastian and More...

Some fodder for your Monday:

1. Congratulations to Carlos Barredo for taking a terrific win in the Clasica San Sebastian on Saturday. In doing so, he made Quick Step relevant for the first time since April. This is the kind of win that starts new phases in riders' careers (Barredo's only 28). With a win like this under his belt, it will not be a surprise to see Carlos in the win column some more between now and the end of the season.
2. Yes, we too were disappointed to see Kreuziger lose. Are there any more doubts about this kid's talent? And is Filippo Pozzato this season's version of Michael "Bridesmaid" Boogerd?
3. Did anyone else notice [the abundance of Flemish flags at the finish line in San Sebastian?](#) No wonder a Quick Step rider won!
4. There was an interesting [article in Friday's NY Times](#) about the debate in Aspen surrounding whether or not to have a celebration in honor of its newest resident's 3rd place in the Tour. I'll let you form your own opinion, but it must be nice to live in a town where the biggest issue facing the mayor and city council involves planning a party.
5. Ryan at [The Service Course](#) explains [how to start a rumor](#). Hmm...this gives me an idea or two...

### ABOUT ME

WSY  
PHOENIXVILLE, PENNSYLVANIA,  
UNITED STATES

After several years racing domestically, I finally decided to give it a go overseas. Two years in Belgium were enough to prove to me that I was more suited to other things. But I stayed behind wheels so to speak--this time as an Assistant Director Sportif for Mercury-Viatel. Now I'm back stateside, happily married and feeling nostalgic for Northern Europe and its cycling traditions.

[VIEW MY COMPLETE PROFILE](#)

### FAVORITE BLOGS

[BIKEADELIC](#)  
[Belgium Knee Warmers](#)  
[Bianchista](#)  
[Boulder Report](#)  
[Competitive Cyclist: What's New](#)

Link to a newspaper article

Link to a blog post

Link to an affiliated blog



# Blogs

## Hotel en San Sebastian-Donostia

www.hotelzaragozaplaza.com

viernes 4 de diciembre de 2009

### Hotel en San Sebastián Sidrería Donostia



El [Hotel Zaragoza Plaza](#) le ofrece la oportunidad de disfrutar de una bonita estancia en el centro de la ciudad y conociendo el ambiente típico de una sidrería. La [Sidrería Donostiarra](#) está situada en plena Parte Vieja, a pocos minutos a pie de

nuestro hotel.

Nuestra oferta es la siguiente:

El paquete turístico incluye:

- 2 noches en habitación doble en régimen alojamiento y desayuno
- 2 menús sidrería
- iva incluido

Precio estancia: 185 euros

Para más información visite nuestra [página web](#)

Publicado por Pilar Legorburu en [0:03 0 comentarios](#)

Etiquetas: [sidrería](#) [dormir barato en donostia](#) [conciertos](#) [sleep saint sebastian](#) [hoteles san sebastian](#) [hoteles en san sebastian](#) [alojamiento san sebastian](#) [hotel en san sebastian](#) [hostales san sebastian](#)

martes 24 de noviembre de 2009

### Dormir barato en San Sebastián Concierto Mónica Naranjo



El próximo 15 de Enero visitará la ciudad Mónica Naranjo ofreciendo un [concierto](#) irrepetible con la Symphonic Film Orchestra de Madrid. , dentro de su [gira Adagio](#).

Para los visitantes que vengán al concierto, el [Hotel Zaragoza Plaza](#) ha preparado una [oferta especial](#):  
HABITACION DOBLE: 60 EUROS IVA Y DESAYUNO

INCLUIDO

Atención: Plan Renove -20%

<http://www.hotelzaragozaplaza.com/ofertas.asp>

LA BEHOBIA



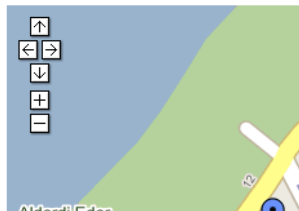
Created by [OnePlusYou](#)

¡Bravo!

El Hotel Zaragoza Plaza ha sido calificado como "Excelente" por 9 viajeros



Ubicación: en pleno centro, junto a la Concha



Link to a web site

Link to a web site

Link to a web site

Link to the same web site



# At a glance

- Our work proposes a personalized recommendation model for bloggers that want to increase their blog roll
- A collaborative rating mechanism, which exploits the hyperlinks between blogs is developed

Our model assumes that: *the intention of a blog owner who creates a link to another blog is to provide a recommendation to the blog readers and quantifies this intention in a local score for the blog being pointed*

- A set of implicit and explicit links between any two blogs affect the exchanged score
- The same model can be applied to other social networking applications, that use time information and implicit or explicit hyperlinks



# Related work

- Yu and Singh, propose a reputation mechanism for social networks based on four properties of trust: **symmetry**, **transitivity**, **self-reinforcement**, **propagation**
- Kale et al (2007) introduce the concept of link polarity in order to distinguish between positive links that point to "like-minded" blogs, negative and neutral ones
- Massa and Avesani (2005) conclude that local trust metrics are preferable in a controversial environment such as the blogosphere. They introduce a trust threshold and a *transitivity horizon*
- The same authors (2004) introduce the notion of trust and collaboration in recommender systems and present a trust aware recommender system. In this system:
  - the decision of a user A for an item X is affected by the opinion of a user B in two ways: the explicit trust of A towards B and the implicit similarity between A and B, as denoted by their common interests (i.e. common ratings for the same items)




# The model


- Blogosphere links' special features:
  - Difference between blogroll links, which denote a more permanent trust towards the blog being pointed, and post links, which represent a more transient reference to a blog
  - Timestamp information of a post, which can be employed as a timestamp for a hyperlink
- The personalized blog site recommendation system, exploits a decentralized and collaborative rating mechanism, which adaptively assigns scores to blogs based on the opinion of other blogs in the system

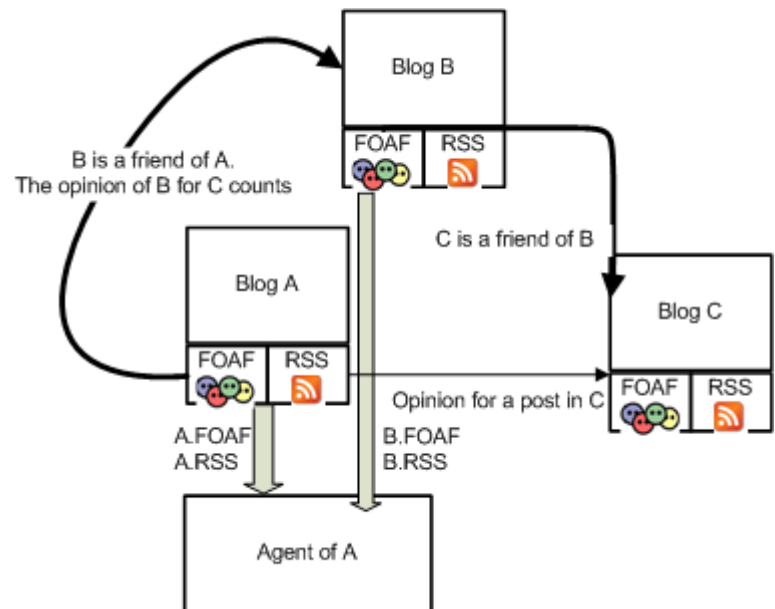




# Hyperlink information

 a FOAF extension adds properties to the domain of foaf:Person and assigns a level of trust ranging from 0 to 1, to each blog in the blogroll

 The latest RSS version supports the Platform for Internet Content Selection (PICS) rating for channels. We suggest the enhancement of the item element with a postlink subelement comprising: *id*, *url*, *rating* and *lastupdated*



# Local score

- What blog  $BS_j$  thinks of blog  $BS_i$  at a certain period (ignoring all previous periods) is subject to the number of links towards  $BS_i$  posts and to whether  $BS_i$  is on  $BS_j$ 's blogroll

$$LSBSR_{t_p=k}^{BS_j}(BS_i) = w_{BR} \cdot BR_{t_p=k}^{BS_j}(BS_i) + w_{EP} \cdot EP_{t_p=k}^{BS_j}(BS_i)$$

- What blog  $BS_j$  thinks of blog  $BS_i$  at  $t_p=c$  is subject to what  $BS_j$  thought of  $BS_i$  for several periods before  $c$

$$LABSR_{t_p=c}^{BS_j}(BS_i) = \sum_{\substack{k=c-n+1 \\ k > 0}}^c w_{t_p=k} \cdot LSBSR_{t_p=k}^{BS_j}(BS_i)$$

- The more recent periods stronger affect the local score



# Collaborative local score

- In order to estimate the rating of a target Blog Site  $BS_i$ , the evaluator Blog Site  $BS_j$  needs to contact a set  $WBS$  of  $N$  witness Blog Sites ( $WBS \ni BS$ ) in order to get feedback reports on  $BS_i$

$$CLBSR_{tp=c}^{BS_j}(BS_i) = w_{tp=c}^{BS_j}(BS_j) \cdot LABSR_{tp=c}^{BS_j}(BS_i) + \sum_{k=1, k \neq i}^N w_{tp=c}^{BS_j}(BS_k) \cdot LABSR_{tp=c}^{BS_j}(BS_i)$$

- Witness blogs may comprise the blogs in the blogroll of  $BS_j$  (1<sup>st</sup> level neighbors) but also blogs in their blogrolls (2<sup>nd</sup> level neighbors) and so on...
- A maximum horizon of trust propagation should be defined, or else all blogs can act as witnesses



# Experiments –Data set

- In the absence of an appropriate dataset for evaluation we used
- *Extended epinions dataset*, provided by Epinions and is available through the Trustlet wikipedia (<http://www.trustlet.org/wiki>)
- 132,000 users who issued 841,372 statements user ratings
  - which users are trusted or distrusted (1, -1 respectively) by which users – Trust=1 is similar to blogroll (717,667 positive trust ratings)
  - article ratings (ranging from 1 to 6), which represent how much a certain user rates the review of another user – Similar to postlink
- The dataset contains information about the author and subject of each review, thus, giving us evidence on the interests of each author
- two subsets of equal size (≈ 5,000 users) that contain user:
  - with a short blogroll (setA: between 5 and 10 links) and
  - with an extended blogroll (setB: more than 10 links)



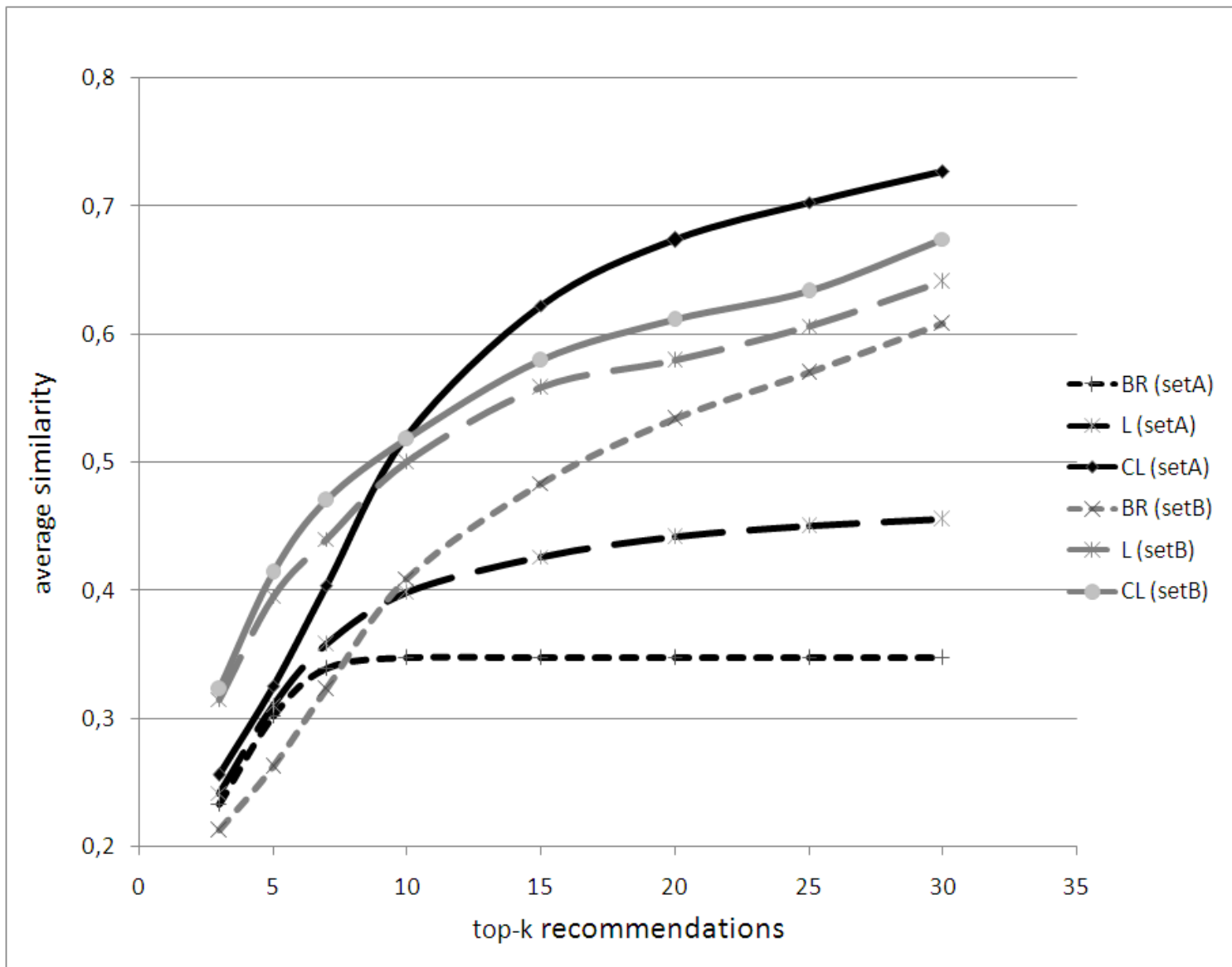
# Experiments - Evaluation

- we generate for each user X (in each set) a list of recommended users, using the local accumulative (L) and the collaborative local (CL) formation
- We measure an average similarity between X and her top-K users recommended using (L) and (CL) and compare to the similarity (ratio of articles rated by X that have been also rated by Y) between X and the top-K users in her blogroll (BR)

## Results

- Users with short blogroll are benefited the most
- Collaborative local rating improves results more than Local rating
- ***A collaborative rating scheme is preferable for users with small blogrolls since can assist them in finding resources of interest***





The average similarity values for the top-K matches (k=3,5,7,10,15,20,25,30) for each subset (setA, setB) and method (L, CL, BR)

# Conclusions and future work

- An iterative collaborative process to provide a local rating for a set of blogs using information from the blogroll and post hyperlinks
- The rating model is mathematically formulated to combine local accumulative and collaborative local scores and exploit timestamp and weight information of links

## **Next steps**

- Study how propagation of trust and negative recommendation can be incorporated to the model
- Expand the mechanism to apply to other social networking applications such as twitter, product reviewing etc.



Thank you

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