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User Modeling, Adaptation, and Personalization

17th International Conference, UMAP 2009
formerly UM and AH
Trento, Italy, June 22-26, 2009
Proceedings

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Library of Congress Control Number: 2009928433

CR Subject Classification (1998): H.5.2, I.2, H.4, I.6, J.4, K.4, K.6

LNCS Sublibrary: SL 3 – Information Systems and Application, incl. Internet/Web and HCI

ISSN 0302-9743
ISBN-10 3-642-02246-4 Springer Berlin Heidelberg New York
ISBN-13 978-3-642-02246-3 Springer Berlin Heidelberg New York

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Printed in Germany

Typesetting: Camera-ready by author, data conversion by Scientific Publishing Services, Chennai, India
Printed on acid-free paper SPIN: 12693795 06/3180 5 4 3 2 1 0

Foreword

Research on user modeling (UM) and personalization can be traced back to the early 1970s, but it was not until the mid-1980s that the community of researchers working on user modeling and user-adaptive systems started its own series of international meetings on UM. After three international workshops in 1986, 1990, and 1992, User Modeling was transformed into an increasingly prominent biennial international conference. Its sustainability was ensured by User Modeling Inc. (<http://www.um.org>), a professional organization of researchers that has solicited and selected bids to run the conference, nominated program chairs, and provided financial backing to UM conferences. Between 1986 and 2007, 11 UM conferences were held (including the three workshops just mentioned), bringing together researchers from many areas and stimulating the development of the field.



Since the early 1990s, the rapid growth of the World Wide Web and other new platforms has populated the lives of an increasing number of people with a great variety of computing systems. This rampant growth has tended to increase the need for personalization, a topic that more and more researchers and practitioners are addressing and that has given rise to several new conferences. Among them, another biennial series on Adaptive Hypermedia and Adaptive Web-Based Systems (Adaptive Hypermedia or AH for short) quickly established itself as a major forum and sister event to UM, running on alternate years with it. Between 2000 and 2008, five AH conferences were held. During this period, the increasing complexity and prominence of Web systems prompted the enlargement of the list of topics covered by the AH series. Similarly, UM researchers had in the meantime quickly embraced the Web, developing many personalized Web systems. As a result, the original differences between the UM and the AH series faded away, and it became evident that their audiences, contributors, and topics largely overlapped. On the basis of many suggestions, the two conferences have now been merged into a new annual series. As a reflection of its continuity with the two parent series, the new conference series has been named User Modeling,

Adaptation, and Personalization (UMAP). By agreement of UM Inc. and the Steering Committee of the Adaptive Hypermedia series (AHSC), four members of AHSC have joined the board of UM Inc., which will therefore be in a position to continue providing support to the new conference series.

The merger took almost 2 years to realize, and now the proud parents, UM and AH, are happy to deliver their healthy baby: UMAP 2009. It seems fitting that the first UMAP conference was organized by FBK-irst, which hosted the first AH conference in the year 2000. And the beautiful town of Trento, surrounded by the Alps, provided an inspiring setting for the celebration.

With this merger, UMAP has become the largest and most prominent conference in the broad area of adaptation and personalization. Every year, it will provide a forum in which to present the most innovative and important research results, to meet with fellow researchers and practitioners from different fields, and to educate the next generation.

June 2009

Peter Brusilovsky
Anthony Jameson

Preface

The First International Conference on User Modeling, Adaptation, and Personalization (UMAP 2009) was held June 22-26, 2009, in Trento, Italy.

UMAP 2009 was not, however, the first conference on user modeling or adaptation. In fact, UMAP 2009 merged two vigorous biennial conference traditions—the User Modeling (UM) conference series and the Adaptive Hypermedia (AH) conference series—into one annual conference that is now the premier venue for research into all aspects of user modeling, adaptation and personalization. Hence UMAP 2009 was the 17th international conference on this subject, not the first. A companion foreword provides more insight into the rationale for integrating these two conference series and discusses the goals of the new merged conference.

For our part, as Program and General Chairs for UMAP 2009, we chose a diverse Program Committee (PC) to adjudicate the submissions to the Research Track. The PC members were selected from established leaders in both the AH and UM communities, as well as highly up-and-coming newer researchers. Each paper was reviewed by at least three PC members, and typically a fourth PC member acted as both reviewer and meta-reviewer to ensure full discussion of the strengths and weaknesses of the paper and to make sure that consistent and constructive feedback was provided to the authors. Papers were submitted in two categories: full and short. Full papers describe mature work in detail (up to 12 pages were allowed) and short papers describe new and promising research of interest to the community (up to 6 pages were allowed).

For the Research Track there were 125 submissions: 88 full papers and 37 short papers. Twenty-three of the full papers were accepted for oral presentation, as were six of the short papers. In addition, 18 papers (full and short) were accepted for poster presentation at the conference. This meant that 26.1% of the 88 papers submitted as full papers were accepted for full presentation, and 37.6% of the 125 overall submissions were accepted in some form.

In addition to the Research Track, UMAP 2009 also established an Industry Track, chaired by Peter Brusilovsky and Alejandro Jaimes. The Industry Track had its own Program Committee of internationally renowned researchers and practitioners. The Industry Track is an important acknowledgement of the increasing impact of UMAP research on many areas of application, as personalization and adaptation become key elements of many deployed software systems. Papers submitted to the Industry Track were reviewed by at least three members of the Industry Track PC to ensure both that they met high standards for UMAP research and that they were relevant to application. Overall, there were 12 papers submitted to the Industry Track, with 3 accepted for oral presentation and 1 accepted for poster presentation.

UMAP 2009 also had a Doctoral Consortium, chaired by Sandra Carberry, Brent Martin and Riichiro Mizoguchi, to provide constructive feedback to young

researchers. An exciting set of workshops and two informative tutorials were selected by a committee chaired by Milos Kravcik and Antonio Krüger.

The tutorials were:

- Constraint-Based Tutoring Systems, by Antonija Mitrovic and Stellan Ohlsson;
- New Paradigms for Adaptive Interaction, by Krzysztof Gajos and Anthony Jameson.

The workshops were:

- Adaptation and Personalization for Web 2.0, organized by Carlo Tasso, Antonina Dattolo, Rosta Farzan, Styliani Kleanthous, David Bueno Vallejo, and Julita Vassileva;
- Lifelong User Modelling, organized by Judy Kay and Bob Kummerfeld;
- Personalization in Mobile and Pervasive Computing, organized by Doreen Cheng, Kinshuk, Alfred Kobsa, Kurt Partridge, and Zhiwen Yu;
- Ubiquitous User Modeling, organized by Shlomo Berkovsky, Francesca Carmagnola, Dominikus Heckmann, and Tsvi Kuflik;
- User-Centered Design and Evaluation of Adaptive Systems, organized by Stephan Weibelzahl, Judith Masthoff, Alexandros Paramythis, and Lex van Velsen.

In addition to all of these events, UMAP 2009 had three keynote speakers:

- Susan Dumais, Microsoft Research: Thinking Outside the (Search) Box
- Alessandro Vinciarelli, Idiap Research Institute: Social Computers for the Social Animal. State-of-the-Art and Future Perspectives of Social Signal Processing
- Vincent Wade, Trinity College Dublin: Challenges for the Multi-Dimensional Personalized Web

We would like to thank the many people throughout the worldwide UMAP community who helped in putting on UMAP 2009. We deeply appreciate the hard work of the chairs responsible for the Industry Track, the Doctoral Consortium, the Workshops, Tutorials, and Demonstrations, and the conference publicity, as well as the conscientious work of the Program Committee members and the additional reviewers. We also gratefully acknowledge our sponsors who helped provide funding and organizational expertise: User Modeling Inc., Fondazione Bruno Kessler (FBK-irst), the U.S. National Science Foundation, Microsoft Research and the Japanese Society for Artificial Intelligence.

Finally, we want to acknowledge the use of EasyChair for management of the review process and the preparation of the proceedings.

June 2009

Geert-Jan Houben
Gord McCalla
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Supporting Personalized User Concept Spaces and Recommendations for a Publication Sharing System

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Abstract. Current publication sharing systems weakly support creation and personalization of customized user concept spaces. Focusing the attention on the user, SharingPapers, the adaptive publication sharing system proposed in this paper, allows users to organize documents in flexible and dynamic concept spaces; to merge their concept map with a social network connecting people involved in the domain of interest; to support knowledge expansion generating adaptive recommendations. SharingPapers presents a multi-agent architecture and proposes a new way of representing user profiles, their evolution and views of them.

1 Introduction

Over the last decade, the Web has undergone great changes; there is a growing evidence of two parallel worlds, the traditional world constituted by expert and selected contributors and the new Web 2.0-based world, in which each user may become author, tag and share documents with a world wide community.

In this new context, an interesting example is provided by the publication sharing systems [1,2]; unfortunately, these systems weakly support creation and personalization of customized user concept spaces [3], representing them in a static and flat way. This problem has been partly analyzed in Bibsonomy [1], that allows users to organize the tags into hierarchies by exploiting an *if...then* relation; this approach enhances the manual tagging activity, but it does not offer either support for organizing knowledge or for personalized recommendations.

On the other hand, collaborative [4], content [5] and hybrid [6] recommendation frameworks improve searches over the available information bases, but few works (such as [7,8,9]) use the tags for recommending new resources: in [7], the authors use an extension of the PageRank algorithm for ranking resources, tags and users in a folksonomy; in particular, in [8], the authors use hierarchical clustering of tags for personalizing navigational recommendations; in [9], the authors measure the users' similarity considering their past tag activity and inferring tags' relationships based on their association to content.

Nevertheless, such recommendation systems consider only the tags and not the goals and the context of the user's tagging activity.

that allows users: to organize documents in flexible and dynamic concept spaces, using innovative and dynamic data structures (the Nelson's zz-structures [10]); to merge their concept map with a social network connecting people involved in the domain of interest; to support knowledge expansion generating adaptive recommendations. These recommendations are generated analyzing the user's concept space, and evaluating the similarities among them in order to reveal the similarity among goals and perspectives of each user. The paper is organized as follows: in Section 2 we describe the architecture of SharingPapers; then we deepen the discussion about the organization of user concept spaces in Section 3, and we propose a simple schema of recommendations in Section 4. Finally, Section 5 concludes the paper.

2 SharingPapers

SharingPapers presents an agent-based architecture shown in Figure 1.

The main modules are:

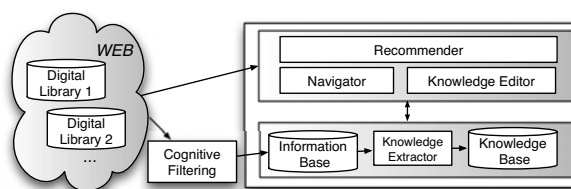


Figure 1. System architecture

- the *Cognitive Filtering* module uses the IFT algorithm [11] and specialized agent classes for browsing and accessing a set of external sources (Web sites and digital libraries), looking for relevant documents. The filtering operation is performed according to a set of defined information needs and populates the *Information Base*.
- The *Knowledge Extractor* module is specialized in extracting, from documents present in *Information Base*, attributes (such as the title of a paper, its authors, its year of publication) and relations (such as the network constituted by co-authors, or by people having a same affiliation, etc.), in order to populate the *Knowledge Base* (see Section 3);
- The *Navigator* module provides views on the *Knowledge Base*, enabling users to navigate among documents and social networks. Examples of views have been proposed in [12].
- The *Knowledge Editor* module implements the features users can invoke in order to manually modify and re-arrange their personal space, defined as concept space (see definition in Section 3); more specifically, each agent keeps track of the interaction of each user and translates the actions performed by himself into

a set of operations on his/her concept space: users can create new entities, add them to their concept spaces, or connect them with existing entities.

- The *Recommender* module suggests tags, recommends to visit parts of concept spaces (belonging to other users) and calculates personalized rankings on papers.

3 Organizing the knowledge base

In our system, the users are represented by their *concept space*: it contains a collection of *papers* and a *social network*.

Papers are connected in an innovative structure by links (indicating, for example, common keywords or tags), while the social network is constituted by users sharing interests and/or contents. A user concept space presents a dynamic structure, evolving in accordance to user behavior (new searches, adding-deleting new contents or tags, etc.).

The **concept space** (Map) related to the user u is formally defined by $M_u = (S_u, En_u, Re_u, Ac_u)$ where: S_u represents its *topological structure*; $En_u = \{\eta_{1_u}, \eta_{2_u}, \dots\}$ defines its local *environment*; $Re_u = \{\rho_{1_u}, \rho_{2_u}, \dots\}$ is the finite set of incoming *requests*; $Ac_u = \{\alpha_{1_u}, \alpha_{2_u}, \dots\}$ is the discrete, finite set of possible *actions*.

In particular, $S_u = (MG_u, T_u, t)$ is a zz-structure, an *edge-colored multigraph* where $MG_u = (V_u, E_u, f)$ ¹ is a multigraph, in which the set of vertices $V_u = \{P_u, U_u\}$. P_u is the collection of papers of the user u , U_u the set of users connected to u ; T_u is a set of colors (T refers to Tag), and $t : E_u \rightarrow T_u$ is an assignment of colors (tags) to edges of the multigraph; $\forall x \in V_u, \forall k = 1, 2, \dots, |T_u|, deg^k(x) = 0, 1, 2^2$. Interested readers will find a deeper discussion about zz-structures in [10], [3], and [12]. In Figure 2 (left) is shown a graphical example of a generic M_u .

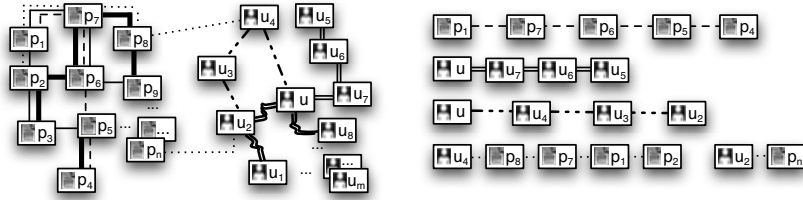


Figure 2. An example of user concept space (left) and four dimensions of it (right).

$P_u = \{p_1, \dots, p_n\}$ contains papers of interest for u , while $U_u = \{u, u_1, \dots, u_m\}$ contains his/her social network; 7 different colors-tags (identified with different

¹ Multigraph definition: $MG_u = (V_u, E_u, f)$ is a multigraph composed of a set of vertices V_u , a set of edges E_u and a surjective function $f : E_u \rightarrow \{\{v, v'\} \mid v, v' \in V_u, v \neq v'\}$.

² $deg^k(x)$ denotes the degree (that is, the number of edges incident to x) of color t_k .

types of line style - normal, thick, dashed, double, etc.) are associated to the edges. Each tag identifies a link among vertices; for example, the tag (dashed line) connecting p_1, p_7, p_6, p_5, p_4 represents papers sharing a same tag or topic; the tag (double line) connecting u, u_7, u_6, u_5 indicates co-authors of one or more papers; the tag (long dashed line) connecting users u, u_4, u_3, u_2 groups members of the same research group; the tag (dotted line) connecting users and papers in u_4, p_8, p_7, p_1, p_2 and u_2, p_n identifies the author and a set of his/her papers.

For each color t_k , we may isolate a specific sub-graph of M_u , constituted by the set of vertices V_u and edges $E_u^k \in E_u$, containing edges of the unique color t_k . Each sub-graph of M_u is called *dimension* of color t_k and is denoted by D_u^k . Formally, a dimension $D_u^k = (V_u, E_u^k, f_u, \{t_k\}, t_u)$, with $k = 1, \dots, |T_u|$, is a graph such that (1) $E_u^k \neq \emptyset$; (2) $\forall x \in V_u, deg_u^k(x) = 0, 1, 2$.

Using dimensions, the topological structure of M_u can be seen as $S_u = \bigcup_{k=1}^{|T_u|} D_u^k$. In this way, a dimension is defined in terms of one or more connected components, that is, some paths and a set (eventually empty) of isolated cells. For example, four paths present in M_u are shown in Figure 2 (right).

When the user enters in the system for first time, his/her concept space is automatically initialized by a set of dimensions. Papers that the user wrote, cited or tagged are imported in specific dimensions, as well as the papers presented in the events (conferences, journal, workshop) that (s)he attended. Similarly, co-authors and other people involved in the user research activity are also imported in the social network considering common publications, events and organizations. As second step, users can invoke the Knowledge Editor in order to manually modify and re-arrange their concept spaces. In this way, users can create new entities, add them to their concept spaces or connect them with existing entities. In its entirety, the concept space represents the user and model him/her; the interaction with the system is stored in it, generating new dimensions or updating the existing ones. Each dimension groups the resources labelled by the same tag and specifies a user interest, while sets of dimensions are used to identify his/her goals and perspectives. Specialized classes of agents manage the user model and calculate personalized recommendations, as described in the next Section.

4 Recommendations in SharingPapers

An important feature of the *zz*-structures is the intrinsic simplicity to contextualize information and to retrieve all documents and info related to a given resource, starting from the resource itself. On this feature is based our collaborative approach for recommendations: starting from the set of tags (that is, dimensions), that identify the current user's interests, we apply a four steps process: (1) expanding the set of tags for similarity; (2) comparing the collections of documents, associated to the set of tags; (3) ordering similar collections, assigning them a score of similarity; (4) ordering similar papers, assigning them a score of similarity. Each step enables the system to provide intermediate specific types of recommendation: (1) new tags for selected resources; (2) new similar users; (3) new collections of resources; (4) new specific resources.

In order to simplify our discussion, we identify with t_i a generic topic (tag or set of tags), and with D_u^i the dimension related to the user u , containing only the papers tagged also with t_i . Here, we propose the application of the recommendation mechanism to a specific user dimension D_u^k .

(1) *Expanding the set of similar tags.* In order to obtain a high recall, we are interested to find tags similar to the starting tag t_k ; for this reason, we apply a non-adaptive reasoning for stating tag similarity considering the frequency of association to a certain paper.

Let $w^k(p)$ be the number of times that t_k has been associated to the paper p :

$$w^k(p) = \sum_{u' \in U} w_{u'}^k(p) \text{ where } w_{u'}^k(p) = \begin{cases} 1 & \text{if } deg_{u'}^k(p) \neq 0 \\ 0 & \text{otherwise} \end{cases}$$

$w^k(p)$ is expressed in terms of $w_{u'}^k(p)$, which represents the number of times that t_k has been associated to the paper p from each generic user u' ; in particular, $deg_{u'}^k(p) \neq 0$ indicates that the paper p has been tagged with t_k in the concept space of user u' .

Now, we consider a set P of papers, and the vector $\bar{w}^i = (w^i(p_1), \dots, w^i(p_N))$ if $N = |P|$, specified for the generic tag t_i .

In order to measure the similarity between a chosen tag t_k , and another generic t_j , we apply the cosine similarity on related vectors \bar{w}^k and \bar{w}^j .

$$tag_sim(t_k, t_j) = \cos(\bar{w}^k, \bar{w}^j) = \frac{\bar{w}^k \cdot \bar{w}^j}{\|\bar{w}^k\| * \|\bar{w}^j\|}$$

This measure allow us to assign a score of similarity to each $t_j \in T$ in respect to t_k . So, we consider top scored tags, T^k , as the most similar tags to the input t_k .

(2) *Comparing user dimensions.* As second step we compare the dimensions labelled by tags in T^k , evaluating the number of resources that they share; in fact, as stated from traditional collaborative techniques, if two users share a lot of resources (in our system, if their concept spaces contain a common set of resources), there is a greater probability that they have a common information need. The Jaccard similarity coefficient is applied as user similarity metric, $\forall t_j \in T^k, \forall u' \in U$:

$$user_sim(D_u^k, D_{u'}^j) = \frac{|V_u^k \cap V_{u'}^j|}{|V_u^k \cup V_{u'}^j|}$$

This metric compares the dimension of interest for u (that is, D_u^k) with the dimensions of other users and allows us to assign them a score of similarity.

(3) *Ordering dimensions.* For obtaining an order, which considers both tag and user similarities, we define, $\forall t_j \in T, \forall u' \in U$, the following metric:

$$score_u^{t_k}(t_j, u') = tag_sim(t_k, t_j) * (user_sim(D_u^k, D_{u'}^j) + 1)$$

This value can be used for suggesting, to the user u , personalized navigation paths on dimensions defined from other users.

(4) *Ordering papers.* Finally, we associate a score to each paper present in the chosen dimensions:

$$score_u^{tk}(p) = \sum_{\forall t_j: deg_{u'}^j(p) \neq 0 \quad \forall u' \in U} score_u^{tk}(t_j, u')$$

Top scored resources are suggested.

5 Conclusion

Web 2.0 users share a huge size of user generated content and assign them tags for simplify new searches, but current systems do not provide users with tools for organizing own concept spaces, allowing only a flat organization of them. This paper proposed a concept model focused on a dynamic and flexible organization of user concept spaces, and an adaptive and customized recommendation mechanism. Implementation is currently ongoing and experimental evaluation is planned for the next future.

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