Mojisola Anjorin, Christoph Rensing, Ralf Steinmetz: Towards Ranking in Folksonomies for Personalized Recommender Systems in E-Learning. In: Marco de Gemmis, Ernesto William De Luca, Tommaso Di Noia, Aldo Gangemi, Michael Hausenblas, Pasquale Lops, Thomas Lukasiewicz, Till Plumbaum, and Giovanni Semeraro: 2nd Workshop on Semantic Personalized Information Management: Retrieval and Recommendation (SPIM 2011), October 2011.

# Towards Ranking in Folksonomies for Personalized Recommender Systems in E-Learning

Mojisola Anjorin, Christoph Rensing, and Ralf Steinmetz

Technische Universität Darmstadt, Multimedia Communications Lab, 64283 Darmstadt, Germany {Mojisola.Anjorin, Christoph.Rensing, Ralf.Steinmetz}@kom.tu-darmstadt.de

**Abstract.** Recommender systems offer the opportunity for users to no longer have to search for resources but rather have these resources offered to them considering their personal needs and contexts. Additional semantics found in a folksonomy can be exploited to enhance the ranking of resources. These semantics have been analyzed in the CROKODIL scenario and a concept is proposed describing how this semantic information can be integrated in a personalized recommender system for learning purposes.

### 1 Introduction

Recent research on personalized recommender systems has shown that the exploitation of semantic information found in folksonomy systems have led to improved recommendations [1]. Recommender systems have been applied to elearning scenarios to help provide personalized support to learners by suggesting relevant items for learning purposes [6]. This raises the challenge of identifying relevant resources which match the current personal context and needs of the learners. Recommender systems in learning scenarios pose new requirements such as exploring and identifying which attributes represent relevance in a learning context [6]. It is therefore an ongoing challenge to meet the requirements of recommender systems in an e-learning scenario such as CROKODIL¹. CROKODIL is a platform supporting the collaborative knowledge acquisition based on a pedagogical concept which focuses on activities as the central structure to organize knowledge resources. The platform offers collaborative semantic tagging (thereby creating a folksonomy), recommendations and social network functionality to support the learning community [3].

Section 3 gives a brief analysis of the semantic information which could be exploited for the context-specific ranking of learning resources in the CROKODIL scenario. Section 4 describes a preliminary concept of a personalized recommender system for CROKODIL considering context-specific ranking. This concept will be implemented and evaluated in future work.

The documents distributed by this server have been provided by the contributing authors as a means to ensure timely dissemination of scholarly and technical work on a non-commercial basis. Copyright and all rights therein are maintained by the authors or by other copyright holders, not withstanding that they have offered their works here electronically. It is understood that all persons copying this information will adhere to the terms and constraints invoked by each author's copyright. These works may not be reposted without the explicit permission of the copyright holder.

<sup>&</sup>lt;sup>1</sup> http://www.crokodil.de (online as of 15.08.2011)

### 2 Related Work

A survey of the state-of-the-art on social tagging systems and how they extend the capabilities of recommender systems is given in [7]. Abel [1] shows that it is worth exploiting additional context information which are found in folksonomies to improve ranking strategies. Approaches are introduced which extend FolkRank to a context-sensitive ranking algorithm exploiting the additional semantics relating to groups of resources in GroupMe! [1]. In technological enhanced learning, recommender systems have been deployed considering context variables such as user attributes and domain specific information to provide personalized recommendations [6]. The concept in this paper proposes to use contextual information in folksonomies to rank learning resources in a personalized recommender system for e-learning.

## 3 Context Feature Analysis in the CROKODIL Scenario

Contextual information in folksonomies can be categorized into four dimensions [1]: the user context, the tag context, the resource context and the tag assignment context (when a user attaches a tag to a resource). Considering the CROKODIL scenario, the available contextual information can be categorized as shown in Table 1. The user context comprises of: learner groups working together on a common task or activity, user roles such as the tutor role and friendships existing between individual learners. In future work, additional social information could be inferred from the learner's social network. When tagging resources in CROKODIL, tag types such as genre, topic, location, person and event can be assigned to the tags. For example, the tag "Beer" of type "Location" refers to the town in Devon, England and not to the alcoholic beverage "beer", thus providing contextual information to the individual tags as well as to the tag assignments. Activities provide contextual information to a resource. In CROKODIL, activities structure which tasks need to be performed to achieve a defined goal. For example, in order to get ready to hold a presentation on German Culture, a learner creates an activity called "Prepare a talk about the Oktoberfest in Germany" having a sub-activity "Describe popular brands of beer in Bavaria". The

Table 1. Context Dimensions Applied to the CROKODIL Scenario

User Context	Tag Context	Resource Context	Tag Assignment Context
learner groups,	tag types	activities	tag types,
user roles, friendships			activities

required knowledge for this presentation is sought mostly via resources on the Web, such as on blogs or in Wikipedia. The appropriate resources are then attached to the activity. This activity thus provides contextual information to the resources. The tag assignment context comprises of tag types and activities as these both give additional contextual meaning when tagging.

## 4 Concept of a Personalized Recommender System in E-Learning

Fig.1 shows the conceptual design of a personalized recommender system considering the CROKODIL learning scenario. This concept incorporates the ranking of learning resources considering the context features discussed in Section 3 resulting from CROKODIL's social and knowledge network. Resources from friends, group members or the tutor will be given a higher weight than other resources. The tag types have different weights according to the popularity of the tag type [2]. For example, a topic tag "Oktoberfest" is weighted higher than a genre tag "blog". Considering the activity the learner is presently working on, for example, "Prepare a talk about the Oktoberfest in Germany", resources belonging to activities nearer in the hierarchy will be weighted higher than resources belonging to an activity further away. Therefore, resources belonging to its direct sub-activity "Describe popular brands of beer in Bavaria" are weighted higher than resources belonging to other activities further down the hierarchy.

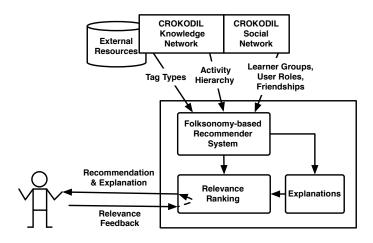


Fig. 1. Conceptual Design of a Personalized Recommender System

The results from the folksonomy-based recommender system will be offered to the learner in the form of a ranked list. The learner is given the opportunity to give explicit feedback regarding these recommendations via a simple like/dislike binary rating. This feedback is integrated into the ranking algorithm by applying Rochio's relevance feedback approach [5]. The feedback is thus used to further adapt and fit the recommendations to the learner's present learning context. In addition, explanations will be made about the recommended item, giving reasons why this item was recommended [4]. This will help to give a better understanding and stimulate the learner to reflect about the recommended

learning resources. The learner is then able to give qualified feedback about whether this recommendation is appropriate to the current learning needs or not. Finally, in order to enrich the variety of resources suggested by the recommender system, external learning resources from existing learning repositories such as ARIADNE [8] or the Open University's OpenLearn <sup>2</sup> will be considered.

## 5 Conclusion

In this paper, a conceptual design of a personalized recommender system for e-learning is described applying context-specific ranking of resources. A concept for a graph-based recommender system using semantic tag types has already been proposed [2]. Next steps will be to implement these concepts and integrate them in CROKODIL. The impact of the various semantic information sources will be evaluated by considering several variants of the ranking algorithm. This will then show which context features or combinations thereof are suitable to the CROKODIL learning scenario. In addition, the effectiveness of relevance feedback will be evaluated with learners in a CROKODIL usability study. The relevance and acceptance of recommendations from external learning resources will be evaluated as well.

**Acknowledgements** This work is supported by funds from the German Federal Ministry of Education and Research and the mark 01 PF 08015 A and from the European Social Fund of the European Union (ESF). The responsibility for the contents of this publication lies with the authors.

#### References

- 1. Abel, F.: Contextualization, User Modeling and Personalization in the Social Web. Phd thesis, Gottfried Wilhelm Leibniz University Hannover (2011)
- 2. Anjorin, M., Böhnstedt, D., Rensing, C.: Towards graph-based recommendations for resource-based learning using semantic tag types. To be published: DeLFI (Sept 2011)
- 3. Anjorin, M., Rensing, C., Bischoff, K., Bogner, C., Lehmann, L., Reger, A.L., Faltin, N., Steinacker, A., Lüdemann, A., Garcia, R.D.: Crokodil a platform for collaborative resource-based learning. To be published: EC-TEL (Sept 2011)
- Jannach, D., Zanker, M., Felfernig, A., Friedrich, G.: Recommender Systems An Introduction. CUP (2011)
- Manning, C.D., Raghavan, P., Schütze, H.: Introduction to Information Retrieval: Relevance-Feedback und Query-Expansion. CUP (2009)
- 6. Manouselis, N., Drachsler, H., Vuorikari, R., Hummel, H.G.K., Koper, R.: Recommender systems in technology enhanced learning. In: Recommender Systems Handbook. Springer (2011)
- 7. Milicevic, A., Nanopoulos, A., Ivanovic, M.: Social tagging in recommender systems: a survey of the state-of-the-art and possible extensions. Artificial Intelligence Review 33, 187–209 (2010)
- 8. Neven, F., Duval, E.: Reusable learning objects: a survey of lom-based repositories. Proceedings of the tenth ACM int. conf. on Multimedia (2002)

<sup>&</sup>lt;sup>2</sup> http://openlearn.open.ac.uk (online as of 15.08.2011)