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# Reading List for SI 583 -- Recommender Systems Winter 2009

## Lecture 1: Introduction and Design Space (1/8)

Recommender Systems, Resnick and Varian, CACM 1997  
<http://portal.acm.org/citation.cfm?id=245121>

## Lecture 2 : Eliciting Ratings (1/13)

Slash(dot) and Burn: Distributed Moderation in a Large Online Conversation Space, Lampe and Resnick, Proceedings of CHI 2004 <http://portal.acm.org/citation.cfm?doid=985692.985761>

### Optional Readings:

Social Comparisons and Contributions to Online Communities, by Chen, Harper, Konstan, and Li, working paper 2007, publication forthcoming in the *American Economic Review*.

## Lecture 3 : Implicit Feedback (1/15)

Information filtering based on user behavior analysis and best match text retrieval, Morita and Shinoda, Proceedings of ACM SIGIR 1994. **Read section 4 only!** <http://portal.acm.org/citation.cfm?id=188583>

Edit Wear and Read Wear, Hill, Hollan, Wroblewski and McCandless, ACM SIGCHI 2007.  
<http://portal.acm.org/citation.cfm?doid=142750.142751>

Modeling Information Content Using Observable Behavior, Oard and Kim, Proceedings of ASIST 2001 (available for purchase online).

## Lecture 4 Linear Algebra Techniques; Intro to User-User Algorithm (1/20)

SOS Math Online article on matrix algebra. Read up through the section on "Special Matrices".  
<http://www.sosmath.com/matrix/matrix.html>

Mathworld article on covariance and correlation (for reference). <http://mathworld.wolfram.com/Covariance.html>

## Lecture 5 : User-User Recommender Algorithm (1/22)

GroupLens: An Open Architecture for Collaborative Filtering of Netnews, Resnick, Iacovou, Suchak, Bergstrom, Riedl, in proceedings of CSCW'94. <http://portal.acm.org/citation.cfm?id=192844.192905>

### Optional Readings:

An Empirical Analysis of Design Choices in Neighborhood-Based Collaborative Filtering Algorithms, Herlocker, Konstan, and Riedl, Information Retrieval 5:287-310  
<http://www.springerlink.com/content/j01519q72736726u>

Social information filtering: algorithms for automating word of mouth, Shardanand and Maes, in Proceedings of CHI'95. <http://portal.acm.org/citation.cfm?id=223931>

Recommending and evaluating choices in a virtual community of use, Hill, Stead, Rosenstein, and Furnas, in Proceedings of CHI '95. <http://portal.acm.org/citation.cfm?doid=223904.223929>

### **Lecture 6: Some Applications, and Demo (1/27)**

Electronic Commerce Recommendation Applications, Schafer, Konstan, and Riedl, in Journal of Data Mining and Knowledge Discovery. (See Table 1 on page 16 of the PDF download.)

<http://www.springerlink.com/content/r24285574675qu7v/?p=c3148216b8a440d9afcead98921f5df&pi=1>

### **Lecture 7: Case Study (1/29)**

(Read this article after the class, to get a sense of what a consultant report should look like.) Sample Consultant Report on Message Recommending, by Paul Resnick.

### **Lecture 8: Item-Item Recommendations (2/3)**

Amazon.com Recommendations: Item-to-Item Collaborative Filtering Linden, Smith, and York, IEEE Internet Computing, 7:76--80, 2002. [http://ieeexplore.ieee.org/xpls/abs\\_all.jsp?tp=&arnumber=1167344&isnumber=26323](http://ieeexplore.ieee.org/xpls/abs_all.jsp?tp=&arnumber=1167344&isnumber=26323)

*Optional Readings:*

Mining Association Rules Between Sets of Items in Large Databases Agarwal, Imielinski, and Swami, Proceedings of ACM SIGMOD 1993 <http://portal.acm.org/citation.cfm?id=170072>

### **Lecture 9: PageRank; Other CF Algorithms (2/5)**

The PageRank Citation Ranking: Bringing Order to the Web, Page, Brin, Motwani, and Winograd, Stanford Digital Libraries Technology Project. <http://ilpubs.stanford.edu:8090/422/>

*Optional Readings:*

Netflix Update: Try This at Home, Simon Funk/B. Webb. For an implementation of this, see the Math::Preference::SVD Perl module on CPAN.org. <http://sifter.org/%7Esimon/journal/20061211.html>

Application of Dimensionality Reduction in Recommender Systems, Sarwar, Karypis, Konstan, and Riedl, Proceedings of ACM WebKDD 2001. <http://www.grouplens.org/papers/pdf/webKDD00.pdf>

### **Lecture 10: Evaluation Metrics (2/10)**

The Netflix Challenge prize rules. Read the "prize structure" section for the RMSE evaluation method.

<http://www.netflixprize.com/assets/rules.pdf>

*Optional Readings:*

Wikipedia article on ROC curve and related concepts  
[http://en.wikipedia.org/wiki/Receiver\\_operating\\_characteristic](http://en.wikipedia.org/wiki/Receiver_operating_characteristic)

### **Lecture 11: Explanations and Other Interface Extensions (2/12)**

Making Recommendations Better: An Analytic Model of Human-Recommender Interaction, McNee, Riedl, and Konstan, Extended Abstract in Proceedings of ACM CHI 2006.

<http://portal.acm.org/citation.cfm?id=1125451.1125660>

A Survey of Explanations in Recommender Systems, Tintarev and Masthoff, 2007 IEEE Data Engineering Workshop <http://www.ieeexplore.ieee.org/iel5/4400942/4400943/04401070.pdf>

Is seeing believing? How recommender Systems Influence Users' Opinions, Cosley, Lam, Konstan, Albert, Riedl, Proceedings of CHI 2003. <http://portal.acm.org/citation.cfm?id=642611.642713>

### **Lecture 12: Scalable Software; Manipulation (2/17)**

Shilling Recommender Systems for Fun and Profit, Lam and Riedl, Proceedings of WWW2004. <http://portal.acm.org/citation.cfm?id=988672.988726>

#### *Optional Readings:*

Google news personalization: scalable online collaborative filtering, Das, Datar, Garg, and Rajaram, Proceedings of WWW2007. <http://portal.acm.org/citation.cfm?id=1242572.1242610> *Don't worry if you can't follow all the math here -- try to understand the overall architecture.*

### **Lecture 13: Manipulation; Privacy (2/19)**

Shilling Recommender Systems for Fun and Profit, Lam and Riedl, Proceedings of WWW2004. <http://portal.acm.org/citation.cfm?id=988672.988726>

The Influence Limiter: Provably Manipulation-Resistant Recommender Systems, Resnick and Sami, Proceedings of ACM RecSys 2007 <http://portal.acm.org/citation.cfm?id=1297231.1297236>

#### *Optional Readings:*

Collaborative Filtering with Privacy via Factor Analysis, John Canny, Proceedings of SIGIR 2002. <http://portal.acm.org/citation.cfm?id=564376.564419>

### **Suggested further readings:**

Toward the next generation of recommender systems: a survey of the state-of-the-art and possible extensions, survey paper by Adomavicius and Tuzhilin, IEEE Transactions on Knowledge and Data Engineering [http://ieeexplore.ieee.org/xpls/abs\\_all.jsp?arnumber=1423975](http://ieeexplore.ieee.org/xpls/abs_all.jsp?arnumber=1423975)

The BellKor Solution to the Netflix Prize Bell, Koren, and Volinsky. (The winner of the first Progress Prize in the Netflix Challenge). <http://www.research.att.com/%7Evolinsky/netflix/ProgressPrize2007BellKorSolution.pdf>

Trust-aware collaborative filtering for Recommender Systems Massa and Avesani, in "On the move to meaningful internet systems 2004", Springer. <http://www.springerlink.com/content/8baj2bp1hatvfgkc/>