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# Second Louhi Workshop on Text and Data Mining of Health Documents (Louhi-10)

**Proceedings of the Workshop** 

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# Preface

Welcome to the Second Louhi Workshop on Text and Data Mining of Health Documents, Louhi 2010, in Los Angeles, California, USA. We aim to bring together researchers and practitioners in a multidisciplinary conference on new uses of computer systems for data mining in the health care area. The very first Louhi Conference 2008 in Turku, Finland, showed the diversity and complexity of these issues. The increasing access to clinical data from health care systems and the progress of new methods and approaches in text and data mining results in a growing attention from the perspective of patient care as well as biomedical research and education. Improving performance in medical information retrieval is a challenge of complex nature requiring several approaches. Automatic indexing of clinical findings, observations, diseases and treatments is of high relevance for clinical work and research in general. Implementing decision support and guidelines to reach evidence-based practice is a specific area of interest (Fiszman et al. 2000). Detecting adverse event is another field that needs a high-quality system to detect findings and events in clinical documents (Griffin and Resar 2009). In several other areas indexing and mining in clinical text are of utmost importance - from everyday clinical work to translational biomedical research (Meystre et al. 2008). Health care consumer web sites as well as news web sites contain important information worthwhile monitoring to extract both information on specific diseases directed to the layman as well as epidemiological information. The papers presented in this workshop aim at exploring computational methods and tools to improve and support the work in these different fields. The Second Louhi workshop will continue to focus and reflect on computer use in every-day clinical work in hospitals and clinics such as electronic record systems, computer aided summaries, clinical coding, computerized clinical guidelines, computer decision systems, as well as related ethical concerns and security. Much of this work concerns itself by necessity with computer aided language use, and as such Louhi aims at providing an arena for report on development in a diversity of languages. In the papers presented at Louhi 2010 we can read about many of the challenges identified above.

A short description of each paper follows in order of appearance. In the first paper, Friberg Heppin describes the Swedish MedEval corpus, which has been annotated for the needs of both physicians and patients. The corpus has then been indexed with two different methods for an information retrieval experiment that aims to satisfy the requirements of both user groups. Bhatia et al. extracted information from English electronic health records containing diabetes information from a large number of patients, with the aim to detect populations at high risk of diabetes. Skeppstedt has ported the negation detection system NegEx, which is written for English clinical text, to Swedish, and describes the porting process in detail and finally evaluates the Swedish version of NegEx. Schreitter et al. describe a system for automatic speech recognition of dictated medical records in English. The aim of their work was to reduce errors in recognizing medication names, trademarks, dosages and strengths, and the authors use the Unified Medical Language System (UMLS) as a knowledge base for the recognition. von Etter et al. present an approach on monitoring epidemic information from online news articles, with epidemic intelligence officers as the intended user group. They have defined guidelines based on correctness and reliability together with the medical users and further annotated 1 000 articles that were then utilized in a machine learning based classification experiment. The paper by Martin is closely related to the work by von Etter et al. described above, but focuses on English web pages containing health care information directed to health care consumers. The author describes an annotation scheme based on type of information, applied by two students annotating 200 pages of health information documents.

Roque et al. present an overview of five open source visualization tools for electronic health records for medical practitioners. They describe the tools in the context of users, goals and tasks focusing on the temporal aspects of the visual presentation. *Melton et al.* present a system for identifying the long form of acronyms and abbreviations in biomedical text, using MetaMap applied on the UMLS to identify the long forms by expanding the acronyms. In Allvin et al. the authors have carried out both a qualitative and quantitative comparative study of Finnish and Swedish nursing narratives from two intensive care units. As the Swedish and Finnish languages belong to different language groups, while the countries are culturally closely related, this study explores how this might influence what is expressed in the narratives. *Halgrim et al.* describe a hybrid system for medical extraction based on both rule based and statistical classifiers. The system is applied on English narrative clinical records from the i2b2 challenge and uses several rule based processing steps where field detection is one significant step detecting if a medication occurs in narrative text or in a list of medications. Kokkinakis and Toporowska Gronostaj have carried out a pilot study to extract events from Swedish medical and clinical text, based on Frame Semantics and their methodology Swedish FrameNet++ (SFN++). Hirschman and Aberdeen have developed new metrics for the de-identification and the re-identification problem of clinical text. They emphasize that traditional information extraction metrics are not enough to address the real-world questions on "how good are current de-identification systems?". Medori and Fairon present a semiautomatic system for assigning ICD-9-CM codes to discharge summaries in French, and shows that stemmed and extracted specific encoding information gives better classification results than without pre-processing. Finally, Lin et al. present ongoing work using Conditional Random Fields to extract important information from clinical research articles, focusing on extracting formulaic information, metadata about the authors, longitudinal data and medical intervention methods.

We received in total 16 submissions from eleven countries and three continents, and after a rigorous double-blind peer-review process we could accept 14 of these submissions to be published in the Louhi 2010 proceedings.

Dear reader, most welcome to study this proceeding, which we hope will raise interest and open new perspectives in text and data mining of health documents.

Stockholm, April 2010

Hercules Dalianis, Martin Hassel and Gunnar Nilsson

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## **Invited Speaker:**

Eduard Hovy, Information Sciences Institute of the University of Southern California

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# **Workshop Program**

### Saturday, June 5, 2010

### Session I

- 8:45–9:00 Opening Remarks
- 9:00–10:00 Invited Talk: Creating Training Material for Health Informatics: Toward a Science of Annotation, Eduard Hovy
- 10:00–10:30 MedEval- A Swedish Medical Test Collection with Doctors and Patients User Groups Karin Friberg Heppin
- 10:30–11:00 Morning break

### **Session II: Paper presentations**

- 11:00–11:30 Extracting Information for Generating A Diabetes Report Card from Free Text in Physicians Notes
   Ramanjot Singh Bhatia, Amber Graystone, Ross A Davies, Susan McClinton, Jason Morin and Richard F Davies
- 11:30–12:00 Negation Detection in Swedish Clinical Text Maria Skeppstedt
- 12:00–12:30 Using Domain Knowledge about Medications to Correct Recognition Errors in Medical Report Creation Stephanie Schreitter, Alexandra Klein, Johannes Matiasek and Harald Trost
- 12:30–2:00 Lunch break

### Saturday, June 5, 2010 (continued)

### **Session III: Paper presentations**

- 2:00–2:30 *Assessment of Utility in Web Mining for the Domain of Public Health* Peter von Etter, Silja Huttunen, Arto Vihavainen, Matti Vuorinen and Roman Yangarber
- 2:30–3:00 Reliability and Type of Consumer Health Documents on the World Wide Web: an Annotation Study Melanie Martin
- 3:00–3:30 Afternoon break

### **Session IV: Poster presentations**

3:00–4:00 *Automated Identification of Synonyms in Biomedical Acronym Sense Inventories* Genevieve B. Melton, SungRim Moon, Bridget McInnes and Serguei Pakhomov

> Characteristics and Analysis of Finnish and Swedish Clinical Intensive Care Nursing Narratives

> Helen Allvin, Elin Carlsson, Hercules Dalianis, Riitta Danielsson-Ojala, Vidas Daudaravicius, Martin Hassel, Dimitrios Kokkinakis, Heljä Lundgren-Laine, Gunnar Nilsson, Øystein Nytrø, Sanna Salanterä, Maria Skeppstedt, Hanna Suominen and Sumithra Velupillai

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Francisco Roque, Laura Slaughter and Aleksandr Tkatšenko

### Saturday, June 5, 2010 (continued)

### **Session V: Paper presentations**

- 4:00–4:30 *Machine learning and features selection for semi-automatic ICD-9-CM encoding* Julia Medori and Cédrick Fairon
- 4:30–5:00 *Extracting Formulaic and Free Text Clinical Research Articles Metadata using Conditional Random Fields* Sein Lin, Jun-Ping Ng, Shreyasee Pradhan, Jatin Shah, Ricardo Pietrobon and Min-Yen Kan
- 5:00–5:15 Closing Remarks and information about the next Louhi workshop