

# ACL 2007

## Proceedings of the ACL-PASCAL Workshop on Textual Entailment and Paraphrasing

June 28-29, 2007 Prague, Czech Republic



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#### PREFACE

Recognizing and generating textual entailment and paraphrases are regarded as important technologies in a broad range of NLP applications, including, information extraction, summarization, question answering, information retrieval, machine translation and text generation. Both textual entailment and paraphrasing address relevant aspects of natural language semantics. Entailment is a directional relation between two expressions in which one of them implies the other, whereas paraphrase is a relation in which two expressions convey essentially the same meaning. Indeed, paraphrase can be defined as bi-directional entailment. While it may be debatable how such semantic definitions can be made well-founded, in practice we have already seen evidence that such knowledge is essential for many applications.

There have been two lines of workshops in this field. One is a series of three workshops on paraphrasing -- in Tokyo 2001, in Sapporo at ACL-2003 and in Jeju at IJCNLP-2005. The other is the Workshop on Empirical Modeling of Semantic Equivalence and Entailment (at ACL-2005), and two workshops of the previous PASCAL Recognizing Textual Entailment (RTE) Challenges (2005 and 2006). We combine those two lines of similar effort together at this workshop in order to see the convergence of the field and exchange ideas among a wider audience.

The workshop has two parts. The first is the general session where submission was open, which covers a wide variety of topics including knowledge formalisms and resources and techniques for acquiring and utilizing knowledge. The second part is the concluding workshop of the 3rd PASCAL RTE Challenge, the primary benchmark for textual entailment recognition systems (see the RTE-3 organizers paper). The workshop program includes the general session papers and selected presentations and a poster session of participating RTE-3 systems.

We appreciate the contributions of all presenters and participants.

Workshop Chairs,

General Session: Satoshi Sekine (New York University) Kentaro Inui (Nara Institute of Science and Technology)

PASCAL RTE-3 Challenge: Ido Dagan (Bar Ilan University) Bill Dolan (Microsoft Research) Danilo Giampiccolo (CELCT) Bernardo Magnini (ITC-irst)

#### Organizers

#### **Chairs:**

#### General Session:

Satoshi Sekine, New York University Kentaro Inui, Nara Institute of Science and Technology

#### PASCAL RTE-3 Challenge:

Ido Dagan, Bar Ilan University Bill Dolan, Microsoft Research Danilo Giampiccolo, CELCT Bernardo Magnini, ITC-irst

#### **Program Committee:**

Caroline Brun, Xerox Research Centre Europe, France Johan Bos, University of Rome "La Sapienza" Robert Dale, Macquarie University Mark Dras, Macquarie University Anette Frank, University of Heidelberg Ralph Grishman, New York University Sanda Harabagiu, University of Texas at Dallas Graeme Hirst, University of Toronto Yves Lepage, Universite de Caen Dekang Lin, Google Katja Markert, University of Leeds Chris Manning, Stanford University Rada Mihalcea, University of North Texas Dan Moldovan, University of Texas at Dallas Patrick Pantel, ISI Kiyonori Ohtake, ATR Ellen Riloff, University of Utah Dan Roth, University of Illinois at Urbana-Champaign Satoshi Sato, Nagoya University Hinrich Schuetze, University of Stuttgart Donia Scott, Open University Kentaro Torisawa, JAIST Lucy Vanderwende, Microsoft Research Kazuhide Yamamoto, Nagaoka University of Technology Fabio Zanzotto, University of Rome "Tor Vergata"

#### **Invited Speaker:**

Oren Etzioni, University of Washington

#### Website:

http://nlp.cs.nyu.edu/WTEP

## **Table of Contents**

The Third PASCAL Recognizing Textual Entailment Challenge    Danilo Giampiccolo, Bernardo Magnini, Ido Dagan and Bill Dolan    1
A Semantic Approach To Textual Entailment: System Evaluation and Task Analysis Aljoscha Burchardt, Nils Reiter, Stefan Thater and Anette Frank
Precision-focused Textual Inference Daniel Bobrow, Dick Crouch, Tracy Halloway King, Cleo Condoravdi, Lauri Karttunen, Rowan Nairn, Valeria de Paiva and Annie Zaenen
COGEX at RTE 3 Marta Tatu and Dan Moldovan
A Corpus of Fine-Grained Entailment Relations Rodney D. Nielsen and Wayne Ward
Recognizing Textual Entailment Using Sentence Similarity based on Dependency Tree SkeletonsRui Wang and Günter Neumann36
Learning Textual Entailment using SVMs and String Similarity Measures Prodromos Malakasiotis and Ion Androutsopoulos
<i>Entailment and Anaphora Resolution in RTE3</i> Rodolfo Delmonte, Antonella Bristot, Marco Aldo Piccolino Boniforti and Sara Tonelli
<i>On the Role of Lexical and World Knowledge in RTE3</i> Peter Clark, Phil Harrison, John Thompson, William Murray, Jerry Hobbs and Christiane Fellbaum
Machine Learning with Semantic-Based Distances Between Sentences for Textual Entailment    Daniel Ferrés and Horacio Rodríguez
A Perspective-Based Approach for Solving Textual Entailment Recognition Óscar Ferrández, Daniel Micol, Rafael Muñoz and Manuel Palomar
Shallow Semantic in Fast Textual Entailment Rule Learners    Fabio Massimo Zanzotto, Marco Pennacchiotti and Alessandro Moschitti
Combining Lexical-Syntactic Information with Machine Learning for Recognizing Textual Entailment Arturo Montejo-Ráez, Jose Manuel Perea, Fernando Martínez-Santiago, Miguel Ángel García- Cumbreras, Maite Martín Valdivia and Alfonso Ureña-López
Dependency-based paraphrasing for recognizing textual entailment Erwin Marsi, Emiel Krahmer and Wauter Bosma

Experiments of UNED at the Third Recognising Textual Entailment Challenge Álvaro Rodrigo, Anselmo Peñas, Jesús Herrera and Felisa Verdejo
Textual Entailment Using Univariate Density Model and Maximizing Discriminant Function    Scott Settembre  95
The Role of Sentence Structure in Recognizing Textual Entailment    Catherine Blake  101
Semantic and Logical Inference Model for Textual Entailment      Dan Roth and Mark Sammons    107
SVO triple based Latent Semantic Analysis for recognising textual entailment Gaston Burek, Christian Pietsch and Anne De Roeck
<i>Textual Entailment Through Extended Lexical Overlap and Lexico-Semantic Matching</i> Rod Adams, Gabriel Nicolae, Cristina Nicolae and Sanda Harabagiu
<i>Hypothesis Transformation and Semantic Variability Rules Used in Recognizing Textual Entailment</i> Adrian Iftene and Alexandra Balahur-Dobrescu
Semantic Inference at the Lexical-Syntactic Level for Textual Entailment Recognition Roy Bar-Haim, Ido Dagan, Iddo Greental, Idan Szpektor and Moshe Friedman
An Extensible Probabilistic Transformation-based Approach to the Third Recognizing Textual Entailment Challenge
Stefan Harmeling
Mutaphrase: Paraphrasing with FrameNet    Michael Ellsworth and Adam Janin  143
A Compositional Approach toward Dynamic Phrasal Thesaurus Atsushi Fujita, Shuhei Kato, Naoki Kato and Satoshi Sato
Machine Learning Based Semantic Inference: Experiments and Observations at RTE-3    Baoli Li, Joseph Irwin, Ernest V. Garcia and Ashwin Ram
Learning Alignments and Leveraging Natural Logic Nathanael Chambers, Daniel Cer, Trond Grenager, David Hall, Chloe Kiddon, Bill MacCartney, Marie-Catherine de Marneffe, Daniel Ramage, Eric Yeh and Christopher D. Manning
A Discourse Commitment-Based Framework for Recognizing Textual Entailment Andrew Hickl and Jeremy Bensley
Biology Based Alignments of Paraphrases for Sentence Compression João Cordeiro, Gaël Dias and Guillaume Cleuziou
A first order semantic approach to adjectival inference Marilisa Amoia and Claire Gardent

Natural Logic for Textual Inference	
Bill MacCartney and Christopher D. Manning	

### **Conference Program**

#### Thursday, June 28, 2007

2:00–2:05 Introduction

#### **RTE SESSION**

2:05–2:30 *The Third PASCAL Recognizing Textual Entailment Challenge* Danilo Giampiccolo, Bernardo Magnini, Ido Dagan and Bill Dolan

#### Linguistic-Semantic Systems

- 2:30–2:55 *A Semantic Approach To Textual Entailment: System Evaluation and Task Analysis* Aljoscha Burchardt, Nils Reiter, Stefan Thater and Anette Frank
- 2:55–3:20 *Precision-focused Textual Inference* Daniel Bobrow, Dick Crouch, Tracy Halloway King, Cleo Condoravdi, Lauri Karttunen, Rowan Nairn, Valeria de Paiva and Annie Zaenen
- 3:20–3:45 *COGEX at RTE 3* Marta Tatu and Dan Moldovan

#### **COFFEE BREAK**

#### **GENERAL SESSION-Resources for Entailment**

- 4:15–4:40 *A Corpus of Fine-Grained Entailment Relations* Rodney D. Nielsen and Wayne Ward
- 4:40–5:10 RTE Poster Booster (2 min presentation each)
- 5:10–6:15 RTE Poster Session

Recognizing Textual Entailment Using Sentence Similarity based on Dependency Tree Skeletons Rui Wang and Günter Neumann

*Learning Textual Entailment using SVMs and String Similarity Measures* Prodromos Malakasiotis and Ion Androutsopoulos

#### Thursday, June 28, 2007 (continued)

*Entailment and Anaphora Resolution in RTE3* Rodolfo Delmonte, Antonella Bristot, Marco Aldo Piccolino Boniforti and Sara Tonelli

#### On the Role of Lexical and World Knowledge in RTE3

Peter Clark, Phil Harrison, John Thompson, William Murray, Jerry Hobbs and Christiane Fellbaum

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*Shallow Semantic in Fast Textual Entailment Rule Learners* Fabio Massimo Zanzotto, Marco Pennacchiotti and Alessandro Moschitti

# Combining Lexical-Syntactic Information with Machine Learning for Recognizing Textual Entailment

Arturo Montejo-Ráez, Jose Manuel Perea, Fernando Martínez-Santiago, Miguel Ángel García-Cumbreras, Maite Martín Valdivia and Alfonso Ureña-López

Dependency-based paraphrasing for recognizing textual entailment Erwin Marsi, Emiel Krahmer and Wauter Bosma

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#### Thursday, June 28, 2007 (continued)

*Textual Entailment Through Extended Lexical Overlap and Lexico-Semantic Matching* Rod Adams, Gabriel Nicolae, Cristina Nicolae and Sanda Harabagiu

#### Friday, June 29, 2007

#### **RTE-Transfromation-based systems**

- 9:00–9:25 *Hypothesis Transformation and Semantic Variability Rules Used in Recognizing Textual Entailment* Adrian Iftene and Alexandra Balahur-Dobrescu
- 9:25–9:50 *Semantic Inference at the Lexical-Syntactic Level for Textual Entailment Recognition* Roy Bar-Haim, Ido Dagan, Iddo Greental, Idan Szpektor and Moshe Friedman
- 9:50–10:15 An Extensible Probabilistic Transformation-based Approach to the Third Recognizing Textual Entailment Challenge Stefan Harmeling
- 10:15–10:45 Hoa Trang Dang, Ellen Voorhees, Christopher Manning, Dan Moldovan: Pilot Task Overview

#### **COFFEE BREAK**

#### **GENERAL SESSION–Paraphrase Generation**

- 11:15–11:40 *Mutaphrase: Paraphrasing with FrameNet* Michael Ellsworth and Adam Janin
- 11:40–12:05 *A Compositional Approach toward Dynamic Phrasal Thesaurus* Atsushi Fujita, Shuhei Kato, Naoki Kato and Satoshi Sato
- 12:05–1:00 Invited Talk–Oren Etzioni: Machine Reading and Open Information Extraction

#### Friday, June 29, 2007 (continued)

#### LUNCH BREAK

#### **RTE-Other Approaches**

- 2:30–2:55 *Machine Learning Based Semantic Inference: Experiments and Observations at RTE-3* Baoli Li, Joseph Irwin, Ernest V. Garcia and Ashwin Ram
- 2:55–3:20 *Learning Alignments and Leveraging Natural Logic* Nathanael Chambers, Daniel Cer, Trond Grenager, David Hall, Chloe Kiddon, Bill Mac-Cartney, Marie-Catherine de Marneffe, Daniel Ramage, Eric Yeh and Christopher D. Manning
- 3:20-3:45 A Discourse Commitment-Based Framework for Recognizing Textual Entailment Andrew Hickl and Jeremy Bensley

#### **COFFEE BREAK**

#### **GENERAL SESSION–Entailment and Paraphrase Acquisition**

- 4:15–4:40 *Biology Based Alignments of Paraphrases for Sentence Compression* João Cordeiro, Gaël Dias and Guillaume Cleuziou
- 4:40–5:05 *A first order semantic approach to adjectival inference* Marilisa Amoia and Claire Gardent
- 5:05–5:30 *Natural Logic for Textual Inference* Bill MacCartney and Christopher D. Manning
- 5:30–6:15 Open discussion–what next?