# Proceedings of the 

## 2004 Conference on

Empirical Methods in Natural Language Processing

A meeting of
SIGDAT, a Special Interest Group of the ACL held in conjunction with ACL 2004

## Preface

EMNLP 2004 represents the twelfth year of SIGDAT meetings, and reflects an unprecedented new scale that will doubtless impact heavily the future course to be charted by the community. We received a record 257 submissions, compared with approximately 140 in the two preceding years. In order to avoid dropping the $24 \%$ acceptance rate of preceding years, a record 58 papers were accepted (of which 2 were subsequently withdrawn) while 17 were committed to other conferences. This volume is over 450 pages - yet another record.

Even with fairly long days, two scheduling innovations have been necessary to accommodate the enlarged scale: twin parallel sessions run throughout the entire two-day event, and a poster format has been added (allowing more slots than "reserve papers").

The community deserves great credit for pitching in to meet this year's challenge of scaling up EMNLP within its traditional extremely tight submission-to-publication timeframe. To put this in perspective, the first pioneering meeting held in 1993 as the Workshop on Very Large Corpora (WVLC) featured 13 papers and a handful of reviewers. EMNLP was introduced in 1996 initially as a second annual event, then merged as EMNLP/VLC in 1999 and 2000 when empirical methodology penetrated the mainstream, after which the WVLC moniker was retired. In 2002 there were 53 reviewers. For EMNLP 2004 this year, there were $150+$, nearly half of whom committed on extremely short notice. Moreover, members on average undertook about $50 \%$ more reviews than they signed up for. We were fortunate still to receive at least three reviews on the vast majority of papers (though technical obstacles prevented some from being entered into the conference workflow database).

The unprecedented level of submissions has also led us to introduce an Area Chair systemperhaps yet another step toward maturity for SIGDAT. Much credit goes to the Area Chairs for their dedication and citizenship in taking on a great deal of additional work with conscientious attention to detail, again with fairly little warning, in a year when the community had already borne unusually heavy reviewing duties from the large number of conferences.

We are happy to observe that the resulting program reflects a healthy continuing diversification of empirical NLP work. Increased representation is found in areas including semantic role labeling, discourse, dialog, summarization, question answering, sentiment, boundary detection, and sentence processing, in addition to traditional strengths in machine translation, parsing and tagging, word sense disambiguation, morphology, IR, and speech. We have striven to respect the reviewers as much as possible, with careful readings of their commentary together with the papers and not just the numeric ratings; we sought primarily to compensate as much as possible for reviewing variances and idiosyncrasies. But once again there were simply too many good papers submitted, and we can only hope you do enjoy the selection that the constrained program permitted!

This year we are introducing, as an experiment, a best paper award selection mechanism based on a larger (and hopefully, more statistically significant) sample size, so as to offset the larger number of papers. Rather than relying on the judgment of a small number of chairs, we are inviting all of you, the registrants, to vote for the paper you believe will be seen ten years from now as having had the most impact. A decade may be a long time to wait for confirmation, but aren't all good things worth waiting for...?

Still another program innovation this year is the joint keynote address with Senseval-3. As kindred spirits in empirical methodology, we trust that the coordination between our overlapping meetings will strengthen the experience for participants of both, and we are grateful to Rada Mihalcea and Phil Edmonds for their cooperative efforts. We are especially grateful to our speaker, Ken Church, for accepting this challenge.

Our thanks also go to David Yarowsky for assembling the proceedings, and to Toni Badia and
the local organizers for making possible the unexpected expansion of the conference.
The EMNLP special theme this year is Empiricism and Error Analysis, and we are happy to see a number of papers that made serious attempts to move forward on this front. We encouraged papers that apply existing or new methodology for meaningful empirical analysis of errors, independent of the application. The theme emphasizes that learning algorithms are not merely magic "black boxes". Corpus-based NLP has reached a stage of maturity where many competing models have reached comparable plateaus in performance. Merely reporting the aggregate accuracy or coverage percentages typically fails to uncover the model limitations that are fundamentally responsible for the plateaus. While reporting aggregate percentages remains essential, instructive research should also explain a model's limitations in more meaningful ways. This can be as simple as categorizing error statistics by finer-grained types of errors, to reveal specific areas of model limitations. Better yet, we seek deeper insight into the models' inherent representational biases, in the form of qualitative theoretical analyses that can be backed up by comparative quantitative measurements. We especially welcomed empirically verifiable implications arising for feature engineering or model selection, whether manual or automatic.

Welcome to EMNLP 2004—we hope you will find it thought-provoking and stimulating!

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## Table of Contents

Preface ..... iii
Table of Contents ..... vii
Conference Program ..... xi
Author Index ..... xv
Max-Margin Parsing
Ben Taskar, Dan Klein, Mike Collins, Daphne Koller and Christopher Manning ..... 1
Active Learning and the Total Cost of Annotation Jason Baldridge and Miles Osborne ..... 9
Induction of Greedy Controllers for Deterministic Treebank Parsers
Tom Kalt ..... 17
Unsupervised WSD based on Automatically Retrieved Examples: The Importance of Bias Eneko Agirre and David Martinez ..... 25
VerbOcean: Mining the Web for Fine-Grained Semantic Verb Relations Timothy Chklovski and Patrick Pantel ..... 33
Scaling Web-based Acquisition of Entailment Relations
Idan Szpektor, Hristo Tanev, Ido Dagan and Bonaventura Coppola ..... 41
Bilingual Parsing with Factored Estimation: Using English to Parse Korean David A. Smith and Noah A. Smith ..... 49
Mining Very-Non-Parallel Corpora: Parallel Sentence and Lexicon Extraction via Bootstrapping and EM
Pascale Fung and Percy Cheung ..... 57
Comparing and Combining Generative and Posterior Probability Models: Some Advances in Sentence Boundary Detection in Speech
Yang Liu, Andreas Stolcke, Elizabeth Shriberg and Mary Harper ..... 64
Automatic Paragraph Identification: A Study across Languages and Domains
Caroline Sporleder and Mirella Lapata. ..... 72
Mixing Weak Learners in Semantic Parsing
Rodney D. Nielsen and Sameer Pradhan ..... 80
Calibrating Features for Semantic Role Labeling
Nianwen Xue and Martha Palmer ..... 88
Unsupervised Semantic Role Labelling
Robert S. Swier and Suzanne Stevenson ..... 95
The Influence of Argument Structure on Semantic Role Assignment Sebastian Padó and Gemma Boleda ..... 103
Object-Extraction and Question-Parsing using CCG
Stephen Clark, Mark Steedman and James R. Curran ..... 111
A Phrase-Based HMM Approach to Document/Abstract Alignment Hal Daumé III and Daniel Marcu ..... 119
Automatic Analysis of Plot for Story Rewriting
Harry Halpin, Johanna D. Moore and Judy Robertson ..... 127
Mining Spoken Dialogue Corpora for System Evaluation and Modeling Frederic Bechet, Giuseppe Riccardi and Dilek Hakkani-Tur ..... 134
Monolingual Machine Translation for Paraphrase Generation
Chris Quirk, Chris Brockett and William Dolan ..... 142
Verb Sense and Subcategorization: Using Joint Inference to Improve Performance on Complementary Tasks
Galen Andrew, Trond Grenager and Christopher Manning ..... 150
Attribute-Based and Value-Based Clustering: An Evaluation
Abdulrahman Almuhareb and Massimo Poesio ..... 158
The Leaf Path Projection View of Parse Trees: Exploring String Kernels for HPSG Parse Selection
Kristina Toutanova, Penka Markova and Christopher Manning. ..... 166
Incremental Feature Selection and l1 Regularization for Relaxed Maximum-Entropy Modeling
Stefan Riezler and Alexander Vasserman ..... 174
A Distributional Analysis of a Lexicalized Statistical Parsing Model Daniel M. Bikel ..... 182
Adaptive Language and Translation Models for Interactive Machine Translation Laurent Nepveu, Guy Lapalme, Philippe Langlais and George Foster ..... 190
Improving Word Alignment Models using Structured Monolingual Corpora Wei Wang and Ming Zhou ..... 198
Phrase Pair Rescoring with Term Weighting for Statistical Machine Translation Bing Zhao, Stephan Vogel, Matthias Eck and Alex Waibel ..... 206
Dependencies vs. Constituents for Tree-Based Alignment Daniel Gildea ..... 214
A Resource-light Approach to Russian Morphology: Tagging Russian using Czech resources
Jiri Hana, Anna Feldman and Chris Brew ..... 222
Applying Conditional Random Fields to Japanese Morphological Analysis Taku Kudo, Kaoru Yamamoto and Yuji Matsumoto ..... 230
A Hybrid Model for Morpho-Syntactic Annotation of German with a Large Tagset Julia Trushkina and Erhard Hinrichs ..... 238
Identifying Broken Plurals in Unvowelised Arabic Text
Abduelbaset Goweder, Massimo Poesio, Anne De Roeck and Jeff Reynolds ..... 246
NP Bracketing by Maximum Entropy Tagging and SVM Reranking Hal Daumé III and Daniel Marcu ..... 254
Trained Named Entity Recognition using Distributional Clusters Dayne Freitag ..... 262
Error Measures and Bayes Decision Rules Revisited with Applications to POS Tagging Hermann Ney, Maja Popović and David Sündermann ..... 270
Chinese Part-of-Speech Tagging: One-at-a-Time or All-at-Once? Word-Based or Character-Based?
Hwee Tou Ng and Jin Kiat Low ..... 277
Adaptation of Maximum Entropy Capitalizer: Little Data Can Help a Lot Ciprian Chelba and Alex Acero ..... 285
Spelling Correction as an Iterative Process that Exploits the Collective Knowledge of Web Users
Silviu Cucerzan and Eric Brill ..... 293
A Boosting Algorithm for Classification of Semi-Structured Text Taku Kudo and Yuji Matsumoto ..... 301
Learning to Classify Email into "Speech Acts"
William W. Cohen, Vitor R. Carvalho and Tom M. Mitchell ..... 309
The Entropy Rate Principle as a Predictor of Processing Effort: An Evaluation against Eye-tracking Data
Frank Keller ..... 317
Random Forests in Language Modeling
Peng Xu and Frederick Jelinek ..... 325
On Log-Likelihood-Ratios and the Significance of Rare Events Robert C. Moore ..... 333
Learning Nonstructural Distance Metric by Minimum Cluster Distortions Daichi Mochihashi, Genichiro Kikui and Kenji Kita ..... 341
From Machine Translation to Computer Assisted Translation using Finite-State Models Jorge Civera, Elsa Cubel, Antonio L. Lagarda, David Picó, Jorge González, Enrique Vidal, Francisco Casacuberta, Juan M. Vilar and Sergio Barrachina ..... 349
Learning Hebrew Roots: Machine Learning with Linguistic Constraints Ezra Daya, Dan Roth and Shuly Wintner ..... 357
LexPageRank: Prestige in Multi-Document Text Summarization Günes Erkan and Dragomir R. Radev ..... 365
A New Approach for English-Chinese Named Entity Alignment
Donghui Feng, Yajuan Lv and Ming Zhou ..... 372
Unsupervised Domain Relevance Estimation for Word Sense Disambiguation Alfio Gliozzo, Bernardo Magnini and Carlo Strapparava ..... 380
Statistical Significance Tests for Machine Translation Evaluation Philipp Koehn ..... 388
Instance-Based Question Answering: A Data-Driven Approach Lucian Vlad Lita and Jaime Carbonell ..... 396
TextRank: Bringing Order into Texts Rada Mihalcea and Paul Tarau ..... 404
Sentiment Analysis using Support Vector Machines with Diverse Information Sources Tony Mullen and Nigel Collier ..... 412
Evaluating Information Content by Factoid Analysis: Human annotation and stability
Simone Teufel and Hans van Halteren ..... 419
Efficient Decoding for Statistical Machine Translation with a Fully Expanded WFST Model
Hajime Tsukada and Masaaki Nagata ..... 427
Multi-Document Biography Summarization
Liang Zhou, Miruna Ticrea and Eduard Hovy ..... 434

