Keywords, phrases, clauses and sentences Topicality, indicativeness and informativeness at scales

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Motic has launched its new upright microscope, the BA410, a newly designed, modular stand especially for routine-clinical, lab, and teaching applications suitable for a wide range of transmitted light applications for the life science markets.

A completely redesigned optical system ensures that the BA410 will provide the best image quality in the demanding cytology, pathology, and histology fields from both demanding amateur to professional levels. A variety of new viewing heads are also available, including a Trinocular head with three light splits (100:0/20:80/0:100) and two Ergonomic heads with tilting and (optional) telescopic functions.

The improved CCIS Optical system includes a variety of contrast techniques like Fluorescence, dark field, polarization as well as an improved phase contrast: one condenser covers both positive as well as negative phase contrast lenses. While a solidstate quintuple nosepiece is standard, an optional sextuple nosepiece is now also available.

Imaging has also been improved through new CCD adapters, optimizing the use of all Motic Digital cameras with CMOS and CCD sensor targets.

The completely lead-free manufacturing of the microscope and its optics follow the RoHS regulations of environment and user protection.

- 30° inclined Binocular head with 360° Swiveling eyepiece tubes for comfortable viewing while seated.
- Optionally binocular ergo head, tilting 4°~30° or binocular ergo plus head, tilting 4°~30° and telescoping 35mm
- Interpupillary distance adjustment between 48-75mm
- Widefield eyepieces N-WF10X/22mm with diopter adjustment on both eyepieces
- Reversed sextuple nosepiece with click stops for precise magnification changes
- CCIS EC-H Plan Achromatic objectives 4X/0.10, 10X/0.25, 40X/0.65 Spring, 100X/1.25 – Spring/Oil
- Coaxial coarse and fine focusing system with 1 micron minimum increment with tension adjustment
- Vertical travel range 27mm
- Large 175mm X 145mm mechanical stage with low-position coaxial controls. Travel range 80 X 53mm. Sample holder can hold up to 2 slides
- Focusable and centrable Achromat swing-out condenser N.A. 0.90 with iris diaphragm
- Collector lens assembly with screw-on filter holder
- Koehler illumination quartz Halogen 6V/30W with external lamphouse and intensity control



Evidence has its scales

External

Collection Document Context Candidate Context	
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Sources for Keyphrase Evidence

SUMMARIZATION SCALES

Error Analysis Directions Forward Anthology as Platform



Scaling

NLP tackles "summarization" at different scales:

- KeywordsKeyphrases
- Headlines
- Abstracts and summaries



Keywords / Phrases

- Position
 - Spread
 - Section
- Structure
 - Part of Speech
 - N-gram Models

(Nguyen and Kan, 2007)

(Witten et al., 1999) (Griveva, 2009) (Hulth, 2004) (Nakov, 2015)

(Liu et al., 2009) (Nguyen and Phan, 2009) (Wu et al., 2005)

• Supervision: Keyphraseness



Clauses – Headlines

HEADY (Alfonseca, 2013)

One-shot, single output

- Abstractive
- Pulling from multiple sites
- Density Coverage
- Complexity Penalty
 - Text simplification



Sentences - Summaries

- Predicate Structure
- Dependency Tuples
- Semantic Roles
- Redundancy
- Length penalty
- Cohesion



Summarization Facets

- Single vs. Multi
- Generic vs. Query-biased
- Stationary vs. Update
- Indicative vs. Informative
- Internal only vs.
 Leveraging External Resources



Participant	tf	loc	disc	coref	co-occ	syn
BT	+	+	-	+	+	-
CGI/CMU	+	÷	-		+	-
CIR	+	+			-	+
Cornell/SabIR	+	-	-	-	+	-
GE	+	-+-	+	+	+	-
IA	+	-	-	. -	+	-
IBM	+	+	-	-	-	-
ISI	+	+	-	-	-	+
LN	+	-	-	-	+	-
NMSU	+	-	+	+	-	-
NTU	+	-	+	+	-	-
Penn	-	+	-	+	-	-
SRA	+	+	-	+	-	+
Surrey	+	-	+	-	+	+
TextWise	+	-	-	+	+	+
UMass	+	-	-	•	+	-

Table 1. Participant summarization method features. tf: term frequency; loc: location; disc:discourse; coref: coreference; co-occ: co-occurrence; syn: synonyms.

Noise Reduction / Signal Enhancement

cf (Erbs et al., 2015)

Mani et al. (2002)SUMMAC: a text summarization evaluation. Natural Language Engineering 8(1). p 43-68.

Generic Summarization and Keyphrase Extraction Using Mutual Reinforcement Principle and Sentence Clustering

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ABSTRACT

A novel method for *simultaneous* keyphrase extraction and generic text summarization is proposed by modeling text documents as weighted undirected and weighted bipartite graphs. Spectral graph clustering algorithms are used for partitioning sentences of the documents into topical groups with sentence link priors being exploited to enhance clustering quality. Within each topical group, saliency scores for keyphrases and sentences are generated based on a mutual reinforcement principle. The keyphrases and sentences are then ranked according to their saliency scores and selected for inclusion in the top keyphrase list and summaries of the document. The idea of building a hierarchy of summaries for documents capturing different levels of granularity is also briefly discussed. Our method is illustrated using several examples from news articles, news broadcast transcripts and web documents.

Categories and Subject Descriptors

1. INTRODUCTION

Text summarization is an increasingly pressing practical problem due to the explosion of the amount of textual information available. For example, web search engines have exploited the use of text summarization from the very beginning: starting with the extraction of certain number of bytes from the beginning of each document to the more sophisticated query-focused summaries typified by Google's snippets (see also the recent work in [1]). Query-focused summaries provide the users with the useful information for initial relevance judgement so that they can quickly zero in on documents deserving further inspection. In contrast, a generic summary in general distills the most important overall information from a document (or a set of documents), it can be especially useful when the documents are relatively long and contain a variety of topics. With many search engines starting to index documents in postscript and pdf formats, we will see increased availability of long and multi-part documents and the pressing needs for efficiently generating effactive generic summaries for those documents. In addition

Joint multi-resolution problem

- Math •
- Nursing ٠
- Software ٠ Engineering
- Literary • Plays

Read/Unread: All Impact of Invasive and Noninvasive Quantitative Culture Sampling on Outcome of Ventilator-Associated Resource All Impact of Invasive and Noninvasive Quantitative Culture Sampling on Outcome of Ventilator-Associated Type: All Impact of Invasive and Noninvasive Quantitative Culture Sampling on Outcome of Ventilator-Associated Type: All Impact of Invasive and Noninvasive Quantitative Culture Sampling on Outcome of Ventilator-Associated Year of Publication: Sort by: Time Added Sort by: Time Added Impact of Environmenta was considered in 14 directly attributable to pneumonia. This occured in three meethy and the sector attributative control (VAP) ranges from 20 to of portional (VAP) ranges from 20 to or portion from nosocomial Profile: adult [blood transfusion] Prediction of Clinical Severity and Outcome of Ventilator-associated pneumonia . Comparison of Simplified acuter [fail.time] Prediction of Clinical Severity and Outcome of Ventilator-associated Pneumonia Comparison of Simplified served results: >>Click to manage profile keywords Saved results: >>Click to see saved results	Filter Settings for Current Results:	Hits 1-3 (out of about 3 total matching pages): Save marked results Mark as read Mark as unread
Resource All Pneumonia . A Pilot Study SANCHEZ-NIETO et al. 157 (2): 371 American Journal of Respiratory and Critical Care Medicine Type: Since last login Preumonia . A Pilot Study SANCHEZ-NIETO et al. 157 (2): 371 American Journal of Respiratory and Critical Care Medicine Year of Any time Publication: 1998, Full text, Added 2 days ago Sort by: Time Added Time Added Inter-onset (7 d) Profile: adult [blood transfusion] Date on set pneumonia. In addition, quantitative mortality of ventilator-associated pneumonia (VAP) ranges from 20 to a poor outcome from nosecomial http://ajrccm.atsjournals.org/cgi/content/full/157/2/371 (cached) (key text) Prediction of Clinical Severity and Outcome of Ventilator-associated Pneumonia . Comparison of Simplified acute Physiology Score with Systemic Inflammatory Mediat rs FROON et al. 158 (4): 1026 American Journal of Respiratory and Critical Ca Year of Publication: 1998, Full text, Added 5 days ago Outcome of Ventilator-associated Pneumonia Comparison of Simplified Outcome of Ventilator-associated Pneumonia Comparison of Simplified Outcome of Ventilator-associated Pneumonia Comparison of Simplified Outcome of Ventilator-associated Pneumonia VAP was considered ICU-acquired the criteria for pneumonia developed flar the patient clinical supplicing of meumonia WAP was considered ICU-acquired the criteria for pneumonia developed flar the patient clinical supplicion of pumonia VAP was considered ICU-acquired the criteria for pneumonia developed flar the patient clinical suppli	Read/Unread: 🛛 🛛 🗸	
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Publication: Any time Sort by: Time Added Sort by: Time Added Profile: adult [blood transfusion] adult [blood transfusion] cancer [quality of life] pressure ulcer [fall time] Prediction of Clinical Severity and Outcome of Ventilator-associated Pneumonia . Comparison of Simplified ventilator-associated pneumonia Prediction of Clinical Severity and Outcome of Ventilator-associated Pneumonia . Comparison of Simplified cultural sampling] >>Click to manage profile keywords Saved results: Saved results: Outcome of Ventilator-associated pneumonia (VAP) is a frequently Definition of Simplified Cutome of Ventilator-associated IPneumonia Comparison of Simplified Cutome of Ventilator-associated IPneumonia Comparison of Simplified Cutome of Ventilator-associated Ipneumonia (VAP) is a frequently Definition of Ventilator associated IPneumonia WaP was considered ICU-acquired the criteria for pneumonia developed after the patient clinical supplicion of pneumonia VAP was considered ICU-acquired the criteria for pneumonia developed after the patient clinical supplicion of pneumonia VAP was considered ICU-acquired	Time Added: Since last login 💙	Year of Publication: 1998, Full text, Added 2 days ago
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adult [blood transfusion] cancer [quality of life] pressure ulcer [fall,time] ventilator-associated pneumonia [cultural sampling] >>Click to manage profile keywords Saved results: Prediction of Clinical Severity and Outcome of Ventilator-associated Pneumonia . Comparison of Simplified Cutcome of Ventilator-associated Pneumonia Comparison of Simplified development of ventilator-associated pneumonia (VAP) (n = 42), cagnosed on RESULTS DISCUSSION REFERENCES Ventilator-associated pneumonia (VAP) is a frequently Definition of Ventilator -associated ICU-acquired the criteria for pneumonia developed after the patient clinical suspicion of pnumonia, bronchoadveolar lavage (BAL the criteria for pneumonia developed after the patient clinical suspicion of pnumonia, bronchoadveolar lavage (BAL the criteria for pneumonia developed after the patient clinical suspicion of pnumonia, bronchoadveolar lavage (BAL the criteria for pneumonia developed after the patient clinical suspicion of pnumonia, bronchoadveolar lavage (BAL the criteria for pneumonia developed after the patient clinical suspicion of pnumonia, bronchoadveolar lavage (BAL the criteria for pneumonia developed after the patient clinical suspicion of pnumonia, bronchoadveolar lavage (BAL the criteria for pneumonia developed after the patient c	Profile:	http://ajcontais.org/cg/content/fub/15/25/17 (cached) (key text)
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Extracting • Key Metadata

	We performed an open, prospective, randomized clinical trial in	Sex
	51 patients receiving mechanical ventilation for more than 72 h, in	Condition
Intervention, Patient, Research Goal, Study	order to evaluate the impact of using noninvasive (quantitative	Race
Design	endotracheal aspirates [QEA]) diagnostic method on the	Age
Design	morbidity and mortality of ventilator-associated pneumonia (VAP).	Intervention Study Design

Jin Zhao, Min-Yen Kan, Paula M. Procter, Siti Zubaidah, Wai Kin Yip and Goh Mien Li (2010)

eEvidence: Information Seeking Support for Evidence-based Practice: An Implementation Case Study. In the Proceedings of the AMIA 2010 Annual Symposium. Washington, DC, USA.



Observations

Variations:

- Subjective, certainly no one annotator can capture all keywords, but perhaps would agree on the statehood
- However, we want good coverage: keyword set should covers all aspects of the item
- In some cases, the keyphrases are not part of formal metadata



Indicativeness

Def: "serving as a sign, indication or suggestion of something"

- Useful signpost of a category
- Discriminatory power (IDF)
- Represents the item to distinguish it from the corpus



Informativeness

Def: "Providing information"

• Importance within the document (TF)



Topicality

TF.IDF

Word in Context

- LDA
- Matrix Factorization
- Distributional approaches



Sources for Keyphrase Evidence Summarization Scales

ERROR ANALYSIS

Directions Forward Anthology as Platform



Keyphrase Workshop

Hasan and Ng's (2014) error analysis

Canadian **Ben Johnson** left the **Olympics** today "in a complete state of shock," accused of cheating with drugs in the world's fastest 100meter dash and stripped of his gold medal. The prize went to American Carl Lewis. Many athletes accepted the accusation that Johnson used a muscle-building but dangerous and illegal anabolic steroid called stanozolol as confirmation of what they said they know has been going on in track and field. Two tests of Johnson's urine sample proved positive and his denials of **drug use** were rejected today. "This is a blow for the Olympic Games and the Olympic movement," said International Olympic Committee President Juan Antonio Samaranch.

- Overgeneration Same keyword within different keyphrases
- Infrequency Important but infrequently occurring
- <u>Redundancy</u> Semantically equivalent output
- Evaluation Evaluation metric problematic

Kazi S. Hasan and Vincent Ng. 2014.

<u>Automatic keyphrase extraction: A survey of the state of the art.</u> In Proceedings of the 52nd Annual Meeting of the Association for Computational Linguistics (Volume 1: Long Papers), pages 1262–1273, Baltimore, Maryland, June. Association for Computational Linguistics



My take on Hasan and Ng (2014)

- Overgeneration Same keyword within different keyphrases
- <u>Redundancy</u> Semantically equivalent output
- Infrequency Important but infrequently occurring
- Evaluati

- Evaluatio

Cohort Effect – consider candidates jointly

Latent Category – a priori knowledge informs keyphrase status



22

The Takeaways

Cohort Effect – consider candidates jointly

Latent Category – a priori knowledge informs keyphrase status

Abstractive Generalization – prefer a representative concept over concrete instances





Parts of a compound microscope

Taken from: moltic.com

Shop by category 🔺	FREE SHIPPING on	orde
MICROSCOPE PACKAGES Compound Microscopes	Stereo Microscopes Low power dissecting scopes	111 Mic
Stereo Microscopes	Clinical & Lab	Ņ
Digital Microscopes	Standard Lab/Clinical Stereo CMO High Resolution	\$/
Specialty Microscopes	Home & Hobby Kids	ER/
Student Microscopes	Hobbyist Advanced	
Microscope Accessories	Industrial Inspection	
Magnifying Lamps	Boom Stand Microscopes Pedestal Microscopes	2
Microscope Cameras	Platform Stands Schools & Students	
Microscope Slides & Stains	Elementary Middle - High School	pr
	University	C/

Reuters RCVI Categories

2.2 The Categories

To aid retrieval from database products such as Reuters Business Briefing (RBB), category codes from three sets (Topics, Industries, and Regions) were assigned to stories. The code sets were originally designed to meet customer requirements for access to corporate/business information, with the main focus on company coding and associated topics. With the introduction of the RBB product the focus broadened to the end user in large corporations, banks, financial services, consultancy, marketing, advertising and PR firms.

2.2.1 TOPIC CODES

Topic codes were assigned to capture the major subjects of a story. They were organized in four hierarchical groups: CCAT (Corporate/Industrial), ECAT (Economics), GCAT (Government/Social), and MCAT (Markets). This code set provides a good example of how controlled vocabulary schemes represent a particular perspective on a data set. The RCV1 articles span a broad range of content, but the code set only emphasizes distinctions relevant to Reuters' customers. For instance, there are three different Topic codes for corporate ownership changes, but all of science and technology is a single category (GSCI).

2.2.2 INDUSTRY CODES

Industry codes were assigned based on types of businesses discussed in the story. They were grouped in 10 subhierarchies, such as I2 (METALS AND MINERALS) and I5 (CONSTRUCTION). The Industry codes make up the largest of the three code sets, supporting many fine distinctions.

David D. Lewis, Yiming Yang, Tony G. Rose and Fan Li (2004) RCV1: A New Benchmark Collection for Text Categorization Research. JMLR Vol 5., 361-397

^{1.} Further formatting details are available at http://about.reuters.com/researchandstandards/corpus/.

```
<DOC ID="1">
  <TITLE>2-Source Dispersers for Sub-Polynomial Entropy and Ramsey Graphs Beating the Frankl-Wilson Construction</TITLE>
  <LINKS>
  <LINK name="PDF" url="1/1.pdf"></LINK>
  <LINK name="TXT" url="1/1.txt"></LINK>
  <LINK name="HTML" url="1/1.html"></LINK>
  <LINK name="XML" url="1/1.xml"></LINK>
11
12 </LINKS>
13 <CATEGORIES AND SUBJECT DESCRIPTORS>
14 <ITEM>G.2.2 [Mathematics of Computing]: Discrete Mathematics - Graph algorithms</ITEM>
15 </CATEGORIES AND SUBJECT DESCRIPTORS>
  <GENERAL TERMS>
16
                                               40 <KEYWORD SET origin="1">
17 <ITEM>Theory</ITEM>
                                               41 <ITEM>Ramsey graphs</ITEM>
  <ITEM>Algorithms</ITEM>
                                               42 <ITEM>extractors</ITEM>
  </GENERAL TERMS>
19
                                               43 <ITEM>disperser</ITEM>
  <AUTHOR KEYWORDS>
20
                                               44 <ITEM>construction of disperser</ITEM>
  <ITEM>Dispersers</ITEM>
21
                                               45 <ITEM>structure</ITEM>
  <ITEM>Ramsey Graphs</ITEM>
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                                               46 <ITEM>tools</ITEM>
  <ITEM>Independent Sources</ITEM>
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                                               47 <ITEM>independent source</ITEM>
  <ITEM>Extractors</ITEM>
24
                                               48 <ITEM>subsource</ITEM>
25 </AUTHOR KEYWORDS>
                                               49 <ITEM>entropy</ITEM>
26
  <KEYWORDS>
                                               50 <ITEM>Theorem</ITEM>
  <KEYWORD SET origin="0">
27
                                               51 <ITEM>resiliency</ITEM>
  <ITEM>disperser</ITEM>
28
                                               52 <ITEM>deficiency</ITEM>
  <ITEM>entropy</ITEM>
29
                                               53 </KEYWORD SET>
  <ITEM>independent sources</ITEM>
30
  <ITEM>extractor</ITEM>
31
                                                                   54 <KEYWORD SET origin="4">
  <ITEM>randomness extraction</ITEM>
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                                                                   55 <ITEM>explicit disperser</ITEM>
33 <ITEM>Ramsey graphs</ITEM>
                                                                   56 <ITEM>extractors</ITEM>
34 <ITEM>bipartite graph</ITEM>
                                                                   57 <ITEM>algorithms</ITEM>
  <ITEM>distribution</ITEM>
35
36 <ITEM>polynomial time computable disperser</ITEM>
                                                                   58 <ITEM>Ramsey graph</ITEM>
  <ITEM>subsource</ITEM>
                                                                   59 <ITEM>sum-product theorem</ITEM>
37
  <ITEM>subsource somewhere extractor</ITEM>
                                                                   60 <ITEM>block-sources</ITEM>
38
39 </KEYWORD SET>
                                                                   61 <ITEM>entropy</ITEM>
                                                                   62 <ITEM>recursion</ITEM>
                                                                   63 <ITEM>termination</ITEM>
                                                                   64 <ITEM>resiliency</ITEM>
                                                                   65 </KEYWORD SET>
```

WINGNUS Keyphrase Corpus. http://wing.comp.nus.edu.sg/downloads/keyphraseCorpus/corpus.xml Sources for Keyphrase Evidence Summarization Scales Error Analysis

DIRECTIONS FORWARD

Anthology as Platform

CAL

THAT WAY



THIS WAY

Addressing the Takeaways

Cohort Effect – consider candidates jointly

- Redundancy / Entropy statistics
- Compound semantics

Latent Category – a priori knowledge

- Domain Named Entities
- Understanding the problem domain

Abstractive Generalization – extraction fails

- Exploit domain vocabularies
- Latent space (embeddings and exemplars)



(Turney, 2003) (Milhacea and Tarau, 2004) (Boudin, 2015)

29

Sparse data: an underlying problem

- Search space is very large
- Labeled observations are just alternatives

So make things more dense

- Project into a smaller space
- Select exemplars from their
- Consider their interactions

(Liu et al., 2015) (Liu et al., 2009)



External Resources

- Scientific Documents
 - Citation Networks
 - Web Documents
 - Datastores (Freebase)
 - Wikipedia
 - Query Log
 - Social Media
 - External Knowledgebase

(Caragea et al., 2014) (Gollapalli and Caragea, 2014)

(Ferrara and Tasso, 2013)

(Marujo et al. 2013)

(Shi et al., 2008)

(Liang et al., 2009)

(Tuarob, 2015)

(Wu et al., 2005)





What's the purpose, anyways?

- For human vs. for machine process
- Inline highlight vs. Standalone
- Weighted (e.g., word cloud) vs. Presence
- Single vs. Multi (e.g., trend analysis)
- Generic vs. Query-biased (e.g., facets)

... and also language density.

But as for applications, we should be asking

What's the killer app for keyphrases?



WHAT IS DATA?

VOLUME Large amounts of data.

Needs to be analyzed quickly.

Different types of structured and unstructured data.

Key questions ntornricos aro as

WHAT ARE THE VOLU THAT WE ARE SEEIN

30 billion pieces of co added to Facebook this p by 600 million plus users

zynga

Zynga processes 1 petabyte of content for players every day; a volume of data that is unmatched in the social game industry.

You Tube

More than 2 billion videos were watched on YouTube... yesterday.

LOL!

The average teenager sends 4,762 text messages per month.

32 billion searches were performed last month... on Twitter.

Everyday business and consumer life creates 2.5 quintillion bytes of data per day.

Trend Analytics for Social Media

3

Multimedia and social By 2 network evidence

> In the scholarly domain too

will be online, pushing the data created and shared to nearly 8 zettabytes.

HOW IS THE MARKET FOR BIG DATA SOLUTIONS EVOLVING?

A new IDC study says the market for big technology d convince will arrow from

Aman at Summer Palace Beijing

Check Out

Enter dates for best prices

Show Prices

THE

Check In

● ● ● ● ● ● ● 203 Reviews #40 of 5,488 Hotels in Beijing ♀ Certificate of Exceller

🖗 No.1 Gongmenqian Street, Yiheyuan, Haidian District | Summer Palace, Beijing 100091, China 🛛 😔 Name/adc

Item Reviews



"A piece of heaven money can buy"

It is a hotel like no other hotels, because it is a Palace yet you don't feel it. The hotel compour are big and decorated in the Imperial Chinese facilities and the restaurants serve good food. they have a staff/guest ratio of 4.5 to 1. Need..

More -

Was this review helpful? Yes

- Latent highlights
- Cohort effect
- Domain ally metadata
 - and facets
- Conline claims
 - forums too

Report



"A nice experience, but I prefer Hangzhou more...." Courtesy: searchengineland.com



Rocco

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SHARES

14904

READS

CONTENT MARKETING Y SOCIAL MEDIA Y PAID SEARCH Y ENTREPRENEUR Y SEARCH ENGINES ~ EVEN

Baldassarre

hold opposing views.

SEO And AdWords

Computational Advertising

SEO is a method that focuses on making your website content relevant to search engines. SEO or Search Engine Optimisation lend a hand for you to rank higher in the organic or natural search results. SEO optin Keyphrases terms of keywords and articles at hand in your web pages. By as friction these gears, search engines distinguish your site and put you spots on the search results. SEO stands for Search Engine C SEO is the process of getting more traffic to your website by dialog as listed and ranked highly for gueries relating to your product, n business in the natural or organic search results. external

evidence Adwords, a different internet marketing alternative, is advertis possible for you to position your advertisement on the top or Query the search results pages on Google and other affiliate website Expansion target internet user's search queries and display your offers e look for it and you have budget left. The visitor then clicks on advertisement and it takes them straightforwardly to your site. The advertiser will on the other hand pay each time somebody clicks on the advertisement, because AdWords runs on the pay per click system. With Adwords, your business listing can be displayed alongside the natural search results when people search for specific keyword phrases in Google. Search results displayed by Google Adwords are also called Pay Per Click (PPC) results in Sources: searchengineland.com

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Sources for Keyphrase Evidence Summarization Scales Error Analysis Directions Forward



ANTHOLOGY AS PLATFORM



Image from: brinkofchaos.com

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	All Fields \$	Search	Search Q	Login Bookmarks History

July 2015: This version of the ACL Anthology will become the default starting sometime this year. Click here to return to the previous × version of the ACL Anthology. Both sites will be maintained in synchrony until the end of 2015.

The Proceedings of the 53rd Annual Meeting of the Association for Computational Linguistics and the 7th International Joint Conference on Natural Language Processing and its 15 associated workshops and events are now available in the Anthology. Also, the Proceedings of the Nineteeth Conference on Computational Natural Language Learning and its shared task, Proceedings of the 14th Meeting on the Mathematics of Language (MoL 2015), Proceedings of the 14th International Conference on Parsing Technologies (IWPT) and the Proceedings of the Third International Conference on Dependency Linguistics (Depling 2015) are available on the ACL Anthology.

Welcome to the ACL	ACL Events	Present - 2010					2009 - 2000									1999 - 1990									1989 -							
Anthology	CL	15	14	13	12	11	10	09	08	07	06	05	04	03	02	01	00	99	98	97	96	95	94	93	92	91	90	89	88	87	86	85 84
The ACL Anthology currently hosts 35531 papers on the study of computational	TACL	15	14	13																												
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	EACL		14		12			09			06			03				99		97		95		93		91		89		87		85
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Anthology:	P14-1007
Volume:	Proceedings of the 52nd Annual Meeting of the Association for Computational
	Linguistics (Volume 1: Long Papers)
Authors:	Woodley Packard Emily M. Bender Jonathon Read Stephan Oepen
	Rebecca Dridan
Month:	June
Year:	2014
Venue:	ACL
Address:	Baltimore, Maryland
SIG:	
Publisher:	Association for Computational Linguistics
Pages:	69-78
URL:	http://aclweb.org/anthology/P14-1007
DOI:	10.3115/v1/P14-1007
MRF:	LaTeXML
Bibtype:	Inproceedings
Bibkey:	packard-EtAI:2014:P14-1
Bib Export formats:	BibTeX RIS Endnote MODS XML MS Word '07

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XML document generated using OCR technology from Nuance Communications, Inc.

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▼<bodyText confidence="0.999919785714286">

Recently, there has been increased community in- terest in the theoretical and practical analysis o (2012) call modality and negation, i.e. linguistic expressions that mod- ulate the certainty or fac

</bodyText>

<sectionHeader confidence="0.998991" genericHeader="introduction">1 Introduction</sectionHeader>
V<bodyText confidence="0.999919785714286">

Recently, there has been increased community in- terest in the theoretical and practical analysis of what Morante and Sporleder (2012) call modality and negation, i.e. linguistic expressions that mod- ulate the certainty or factuality of propositions. Automated analysis of such aspects of meaning is important for natural language processing tasks which need to consider the truth value of state- ments, such as for example text mining (Vincze et al., 2008) or centiment analysis (Tannoni et al. 2012) Oring to its immediate utility in the cura- tion of scholarly results, the analysis negation and so-called hedges in bio-medical resparch liter- ature has been the focus of several workshops, as well as the Shared liter- ature has been the focus of several workshops, as well as the snared Learning (CONLL). Task 1 at the First Joint Conference on Lex- ical and Compare ParsCit Document Segmentation 2012) provided a fresh, prin- cipled annotation of negation and called for cues (affixes. Retrieves body text and words, or phrases that express negation), resolv- ing their scopes (which parts identifying the negated event or property. The task organizers designed and doo en ans, 2012) and applied it to a little more than 100,000 tokens of running text by the the task 2012) and applied it to a little more than 100,000 tokens of running text by the nov- clist Sir Arthur (phan Dovle, While the task and annotations were framed from a semantic perspec- tive, only one participating Categorizes Other text compositional semantics (Basile et al., 2012), with results ranking in the middle of the 12 participating systems. Conversely, the basile performing systems approached the task through machine learning or heuristic proces Resolves headers to learning the systems approached the task through machine learning or heuristic procession. relatively coarse-grained representations; see § 2 below. Example (1), where O ma illustrates the annotations, including how negation inside a noun phrase can scope generic header category </bodyText>

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     k annotations. 3.1 MRS Crawling Fig. 1 shows the ERG semantic analysis for our running example. The heart of the MRS is a
     multiset of elementary predications (EPs). Each ele4Read et al. (2012) predicted cues using a closed vocabulary assumption with a
     supervised classifier to disambiguate instances of cues. 5In other words, a possible semantic interpretation of the (string-
     based) Shared Task approach to meaning representation, or in
        ▼<citation valid="true">
                                                                                      others, Alshawi, 1992). From this
                                                                                     compass interactions of negation
          ▼<authors>
                                                                                     ndle', prefixed to predicates with a
              <author>H Alshawi</author>
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                                                                                     r abstract) entities. All EPs have the
           <title>The Core Language Engine.</title>
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                k annotations. 3.1 MRS Crawling Fig. 1 shows the ERG s
                multiset of elementary predications (EPs). Each ele4Re
                supervised classifier to disambiguate instances of cue
                based) Shared Task annotation guidelines and data is i
                terms of one where quantifier scope need not be made e
                interpretation it follows that the notion of scope as
  </title>
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    In Proceedings of the 1st Joint Conference on Lexical and Computational Sem
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     of negation and called for systems to analyze negation-detecting cues (af
     resolving their scopes (which parts of a sentence are actually negated), and ide WITH auto detected citation
                                                                                                                   ask
     organizers designed and documented an annotation scheme (Morante and Dael mans
     100,000 tokens of running text by the novelist Sir Arthur Conan Doyle. Wh
                                                                            context (citance)
                                                                                                                   ntic
     perspective, only one participating system actually employed explicit com
                                                                                                                   ults
     ranking in the middle of the 12 participating systems. Conversely, the besperforming systems approached the t
     learning or heuristic processing over syntactic and linguistically relatively coarse-grained representations; see § 2 below.
     Example (1), where \Omega marks the cue and () the in-scope elements, illustrates the annotations, including how negation inside a
```



Anthology:	P14-1007								
Volume:	Proceedings of the 52nd Annual Meeting of the Association	Proceedings of the 52nd Annual Meeting of the Association for Computational							
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Venue:	ACL	Fosturing your work in the							
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SIG:		future?							
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MRF:	LaTeXML	based method for accepting							
	Omni-OCR								
	ParsCit-Text	new text for processing							
	XX-Keyphrase								
	YY- Summary								
Bibtype:	inproceedings								
Bibkey:	packard-EtAl:2014:P14-1								
Bib Export formats:	BibTeX RIS Endnote MODS XML MS Word '07								

2016: Shared task on the Anthology?

Previous:

• CL Pilot Summarization Task at TAC 2014: (Jaidka et al., 14) <u>https://github.com/WINGNUS/scisumm-corpus</u>

Now planning:

- Which tasks are of interest to the community?
 - Keyphrase
 - Summarization
- What venue is the best opportunity?
 - An ACL workshop?
- What role could you commit to participate as?



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Conclusion

- Larger summarization scales can inform our task
- Errors stemming from a cohort effect, latent categories and abstractive generalizations
- Characteristics of the keyphrase application may also inform
- Call for Participation:

Thank you!

