

# FireCite: Lightweight real-time reference string extraction from web pages

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# Outline

- Introduction
- Reference String Recognition
- Reference String Parsing
- Firefox Extension
- Conclusion



# Introduction: The Problem

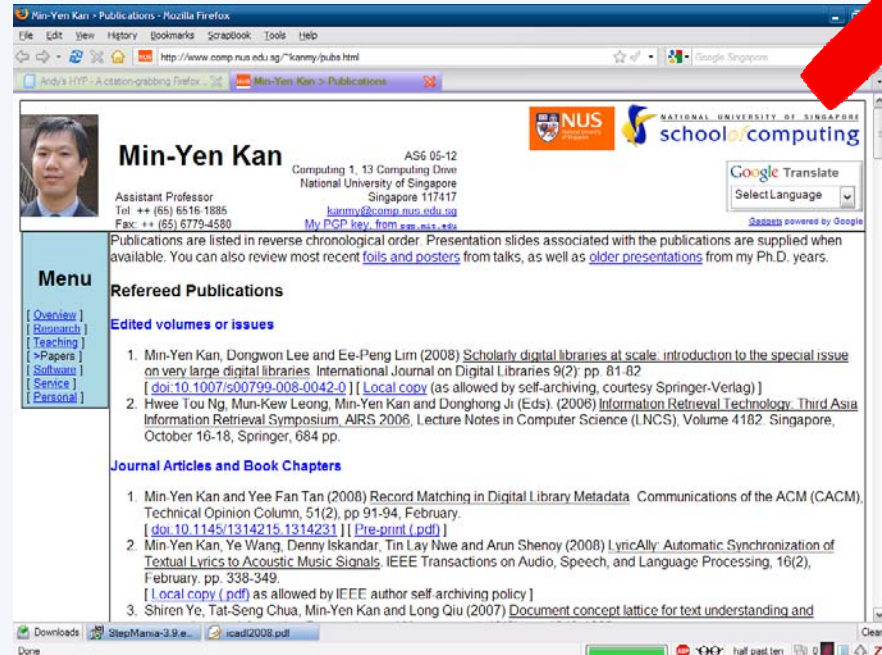
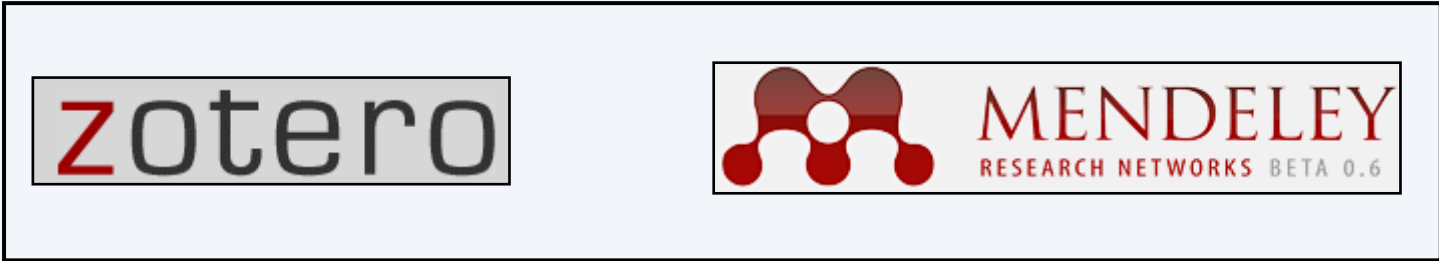
- Recognition and parsing of references found on the Internet

- Criteria:
  - Accurate
  - Fast

**Journal Articles**

IR	NL	ML	• Fuchun Peng and Xiangji Huang; <a href="#">Machine Learning Approaches to Automatic Text Classification for Asian Languages</a> , <i>Journal of Documentation</i> , Volume 63, Issue 3, pages 378-397, (2007)
IR		ML	• Fuchun Peng and Andrew McCallum; <a href="#">Information Extraction from Research Papers using Conditional Random Fields</a> , <i>Information Processing and Management</i> , 42(4), pages 963-979, (2006)
	NL	ML	• Shaojun Wang, Dale Schuurmans, Fuchun Peng and Yunxin Zhao; <a href="#">Combining Statistical Language Models via the Latent Maximum Entropy Principle</a> , <i>Machine Learning Journal</i> , Vol. 60, No. 1-3, pages 229-250, (2005) Special Issue on Learning in Speech and Language Technologies.
		ML	• Shaojun Wang, Dale Schuurmans, Fuchun Peng and Yunxin Zhao; <a href="#">Learning Mixture Models with the Regularized Latent Maximum Entropy Principle</a> , <i>IEEE Transactions on Neural Networks</i> , Vol. 15, No. 4, pages 903 - 916, (2004). Special Issue on Information Theoretic Learning
			• Fuchun Peng, Dale Schuurmans and Shaojun Wang; <a href="#">Augmenting Naive Bayes</a>

# Introduction: Related Work



# Outline

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- **Reference String Recognition**
- **Reference String Parsing**
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# Reference String Recognition: Definition

- Are there reference strings?
- Where are the reference strings?

## Journal Articles

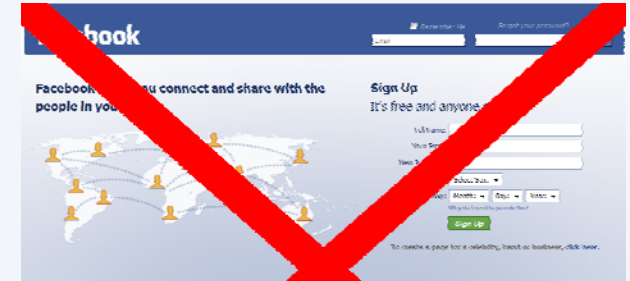
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# Reference String Recognition: Methodology

## 1. Web page exclusion

- Keyword + URL Matching



### Journal Articles

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# Reference String Recognition: Methodology

## 2. Splitting

- Split web page text into segments
- GOAL: Each segment to contain at most 1 reference string, and each reference string to exist in only 1 segment.

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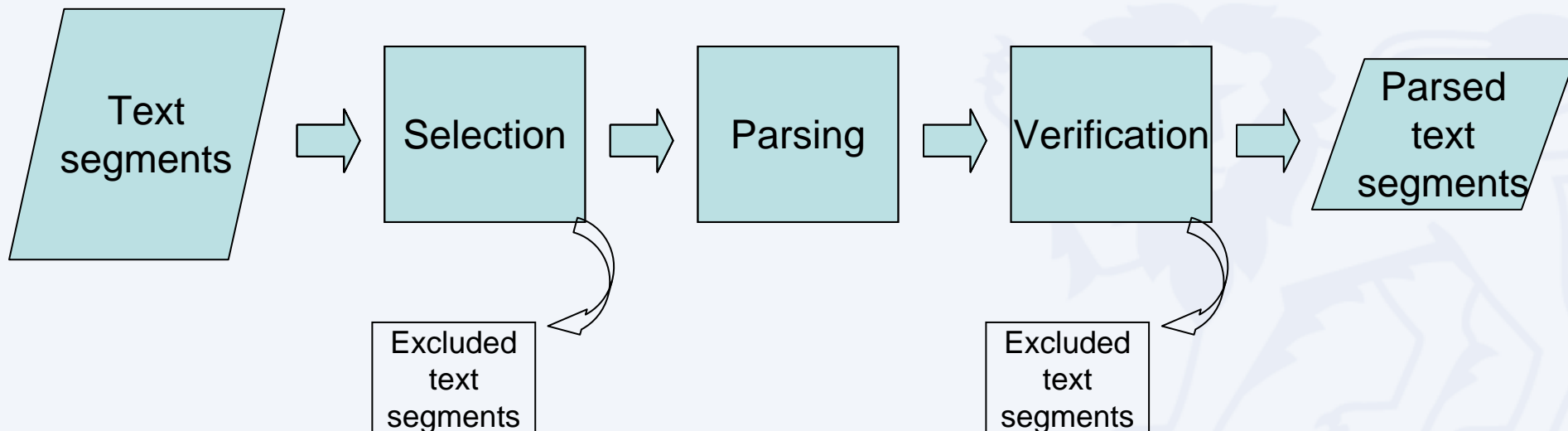
# Reference String Recognition: Methodology

## 3. Selection

- Token length and word length of segment

## 4. Verification

- Reject segments that do not have a title or authors



## Reference String Recognition: Evaluation

- **Test set: 40 staff homepages from 4 universities**
- **Reference strings found: 364/379 (96.0%)**
- **False positives: 269 (42.5%)**

System	Precision	Recall	F1-measure
FireCite (All 40 pages)	0.575	0.960	0.719
FireCite (Only 20 pages with reference strings)	0.655	0.960	0.779

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- Related Work
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## Reference String Parsing: Definition

- Purpose
  - Store reference according to metadata fields
  - Assist reference string recognition
- Only identify authors, title, date

Jesse Prabawa Gozali and Min-Yen Kan (2007) A Rich OPAC User Interface with AJAX, In Proceedings of the Joint Conference on Digital Libraries (JCDL '07). Vancouver, Canada, June, pp. 329-330. Short paper.

# Reference String Parsing: Methodology

- **Tokenising**

Atlas, L., and S. Shamma,

“Joint Acoustic and Modulation Frequency,”

EURASIP JASP, 2003.

- Advantages
  - Reduce number of computations
  - Allow information-rich learning features



## Reference String Parsing: Methodology

- Labelling

- J48 decision tree classifier
- CORA corpus (500 reference strings) as training corpus

- Repairs

- “Title” and “Authors” fields are contiguous

Thuy Dung Nguyen and Min-Yen Kan /author ( 2007 /date ) Keyphrase Extraction in Scientific Publications/title .  
In Proc/misc . of International Conference on Asian Digital Libraries /title-misc ( ICADL '07/misc ).  
Hanoi/misc , Vietnam/misc , December/misc . pp/misc . 317-326/misc .



# Reference String Parsing: Evaluation

## 6 Faculty Staff Publication Pages

Page (No. of ref. strings)	Token-level F-measure			
	Title	Authors	Date	All Tokens
A (72)	0.902	0.893	0.988	0.708
B (52)	0.953	0.957	0.990	0.960
C (29)	0.684	0.304	0.774	0.651
D (68)	0.753	0.968	0.889	0.917
E (8)	0.692	0.875	1.000	0.889
F (45)	0.847	1.000	0.989	0.966
<b>Overall (274)</b>	<b>0.836</b>	<b>0.916</b>	<b>0.948</b>	<b>0.878</b>

# Reference String Parsing: Evaluation

FLUX-CiM Computer Science Dataset (300 citations)

System Name	Field-level F-measure			
	Title	Authors	Date	Overall
<u>FireCite</u>	<u>0.92</u>	<u>0.96</u>	<u>0.97</u>	<u>0.94</u>
ParsCit	0.96	0.99	0.97	0.94
FLUX-CiM	0.93	0.95	0.98	0.97

## Reference String Parsing: Evaluation

Parser	Classifier Type	Size of classifier model (KB)	Size of dictionary (KB)
<u>FireCite</u>	<u>Decision Tree</u>	<u>12.6</u>	<u>0.0</u>
FLUX-CiM	Knowledge-Based	>786 (estimated)	0.0
ParsCit	Conditional Random Fields	7339	1722

## Reference String Parsing: Evaluation

Page Type	Time taken (milliseconds)		
	Minimum	Maximum	Average
Pages with reference strings	90	544	192
Pages without reference strings	6	222	74
All pages	6	544	<u>133</u>

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# Extension: Demo

Firecite ×

Title	Authors	Date
What Makes Some ...	David Hsu, Wee Sun L...	null
BibPro: A Citation P...	C. C. Chen, K. H. Yang...	2008
Two field studies of ...	Nielsen, J. and Lyngba...	1990
Improving System U...	Nielsen, J. and Faber, ...	1996; F...
A Generative Model...	Wei Lu, Hwee Tou Ng...	null

(a) (c)

### Publications

- [Wei Lu, Hwee Tou Ng, Wee Sun L](#)  
**A Generative Model for Parsi**  
[pdf](#)  
In Proceedings of the 2008 Conf  
2008).
- [Hai Leong Chieu](#) and Wee Sun L  
**Relaxed Survey Propagation:**  
[pdf](#)  
In *Proceedings of the 23rd AAA*
- [Hanna Kurniawati, David Hsu,](#) ar  
**SARSOP: Efficient point-base**  
spaces

(b)



# Conclusion

- **Results**

- Fast and lightweight reference string parser
- Reference string recogniser with good recall
- Basic, expandable Firefox extension



# Conclusion

- **Future work**

- Reference String Recognition
  - More rules to improve precision
- Reference String Parser
  - Use web page reference strings as training data
  - Recognise implicit/common metadata
- Firefox Extension
  - Add more features to the extension



Questions?

