

# Natural Language Watermarking

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with

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# The Problem

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# Properties of Watermarked Text

- Same meaning as original text
- Holds up in court
- Watermark is only readable with key
- Original document need not be stored
- Removing watermark is hard
- Watermarking algorithm is public
- Ability to produce multiple watermarks

# Model of Adversary

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- Meaning-preserving transformations (e.g., translation into another language)
- Meaning-modifying transformations (destroys original)
- Insert new sentences
- Move sentences, paragraphs, chapters, etc.

# Previous Schemes

- Spacing between letters, words or lines  
[BraMaxOGo94][Max94][LowMaxLap98]
- Manipulating the format, e.g. HTML, TeX, Postscript, etc. [Kat00]
- Generating cover text [Way95][ChaDav97]
- Synonym substitution [AtaMcDRasNir00]
- Spelling errors, punctuation, etc.

# Advantages of Our Scheme

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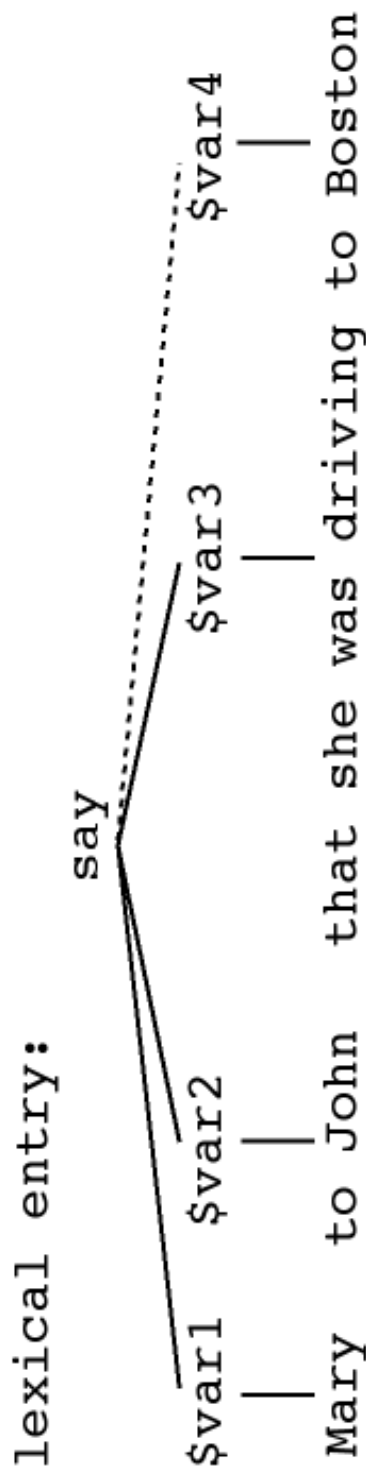
- Embeds watermarking in text
- Resistant to changes in representation, e.g. OCR
- Requires little or no change to the watermark

# Why NLP?

- Automatic text processing
- Best method is meaning -based
- Semantic analysis “unhiding” information
- Best-developed semantic method is ontological semantics

# Ontological Semantics

- Ontology: hierarchy of conceptual nodes
- Lexicon: entries explained in terms of nodes
- Necessary modules:  
Syntactic Parser, Analyzer, Generator



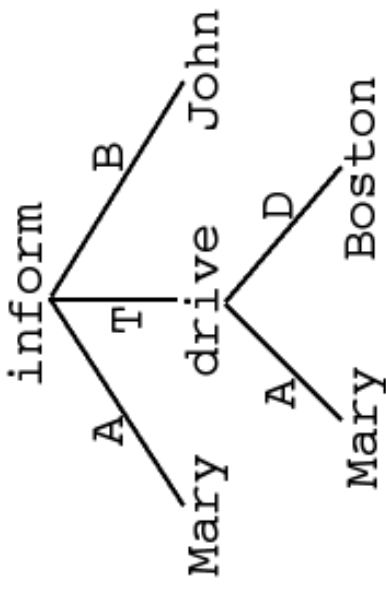


# Ontological Semantics - contd.

- Basis for analysis into Text-meaning-representation (TMR):

ontological concept:

```
(inform
  (Agent ^$var1)
  (Theme ^$var3
    (Agent ^$var1)
    (Destination ^$var4)
    (Beneficiary ^$var2))
```



# Syntactic Representation

- LINK Parser produces constituent trees

( S ( NP<sub>1</sub> the dog )  
    ( VP chased  
      ( NP<sub>2</sub> the cat ) ) )

- Easily translatable to bit strings
- Transparent interface for transformations

# Examples of Syntactic Transformations

- Passivization
- Transitive verb
- Switch object NP to subject position
- Make subject PP adjunct
- Adjust verbal morphology

(S (NP<sub>2</sub> the cat)  
(VP was  
(VP chased  
(PP by  
(NP<sub>1</sub> the dog))))))

# Examples of Syntactic Transformations - continued

- **Adjunct movement:**  
(often) the dog (often) chased the cat (often)
- **Clefting (e.g., of mandatory subject):**  
it was the dog that chased the cat
- **Adjunct insertion:**  
it seems that / generally speaking / basically the dog chased the cat
- **Combinations of all these:**  
it seems that it was the cat that was often chased by the dog

# Watermarking Algorithm Overview

- Split text into sentences  $s_1, \dots, s_n$
- Find tree representation  $T_1, \dots, T_n$  of each sentence
- Map each tree to a bit string  $B_1, \dots, B_n$  according to a secret prime  $p$
- Choose subset  $t_1, \dots, t_\alpha$  of sentences according to secret prime  $p$
- Transform subset, such that  $\beta$  bits of each  $B_{t_1}, \dots, B_{t_\alpha}$  correspond to the watermark  $W$

# Mapping of Tree to Bit Strings

- Assign each node of  $T$  a number  $i$  according to pre-order traversal
- Replace every number  $i$  with a bit:  $1$  if  $i+H(p)$  is a quadratic residue modulo  $p$ , else with  $0$
- List the bits in post-order traversal

# Choosing Watermark Sentences

- Compute  $B'_i = H(B_i)$  for each sentence
- Bitwise  $B'_i$  compare to  $H(p)$
- Rank sentences decreasingly to number of matches
- Choose  $\alpha$  top ranked sentences as markers

# WatermarkInsertion

- Usesentencesaftermarkersforwatermark
- Applytransformationsuntilbitstringismatch watermark
- Ifalltransformationsfailaskuserformanual changesorinsertnewsentences



# Probabilities

- Meaning-preserving transformation:  $0$
- Meaning-modifying transformation:  $\leq 3\alpha/n$
- Insertion of a sentence:  $\leq 2\alpha/n$
- Moving a block of sentences:  $\leq 3\alpha/n$
- All of the above are upper bounds!

# Properties

- Watermark extraction with key only
- Probability of false positives  $2^{-w}$
- On average  $2^{\beta-1}$  transformations are performed
- Different watermarks for the same cover text will reveal watermark placement (random modifications of a number of sentences will make this more difficult)

# Current Prototype

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- Proof-of-Concept implementation
- Uses syntax instead of TMR
- Uses Link parser from CMU
- Uses limited set of transformations

# Example

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"The functions of these instruments are discussed in the Appendix."

"In the Appendix the functions of these instruments are discussed."

"In the Appendix the functions of these tools are discussed."

# Experiences with Prototype

- <http://www.cerias.purdue.edu/homes/wmnl/>
- One “watermark-bit” per sentence:  $\beta = 1$
- Number of transformations: 3
- Approximate bandwidth:  $n/3$

# Planned Extensions

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- Build TMR -based version
- Adjust ontology, parser, analyzer and generator
- Increase number of transformations
- Sentence insertion