

### The Security Role for Content Analysis

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#### About Us



- Tablus is a 3 year old company that delivers solutions to provide visibility to sensitive information leaving the network
- Our background
  - low-level packet capture and protocol analysis
  - content analysis, content classification
  - database management

## What is Content Analysis?



- Techniques for extracting and classifying data
  - Simplistic (deterministic)
    - Matching specific keywords or patterns
    - Matching meta data in specific file formats
  - Algorithmic
    - Statistical analysis
    - Language based analysis
    - Document clustering

# What Does Content Analysis have to do with Security?



- Companies are increasingly focused on protecting their sensitive information
  - Customer lists, SSNs (PII, PHI)
  - Trade secrets, internal documents
  - Proprietary information -- source code, etc.

The challenge is to be able to accurately classify data as sensitive

#### **Detecting Sensitive Information**



- Verify that copies of sensitive information are adequately protected
- Remove unneeded copies of sensitive information
- Monitor the network for the transmission of sensitive information

#### **Real World Ways Mail Filters Identify Information as Sensitive...**





# **Types of Machine Classification Techniques**

- Linguistic
  - Based on the text or language
  - Semantic analysis
    - Based on the meaning of the words
- Bayesian Inference
  - Based on probability theory
- Statistical/Al
  - Neural net
- Hybrids

Lexical Resources (e.g. wordnet)





#### **Taxonomic Classification**



- Taxonomic classification can tell you what subjects are likely discussed in a document
- Would allow us to say "documents that talk about concurrent routing are sensitive"



#### **Document Clustering**



- Documents with similar characteristics grouped together
  - Based on language
  - Based on statistical information
  - Based on meta data



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#### **Derivative Work Analysis**



 Derivative work analysis means looking for overwhelming similarity in lexicon or form



## **Vector Space Analysis**



- Document represented by a vector of terms
  - Words (or word stems)
  - Phrases (e.g. computer science)
  - Removes words on "stop list"
    - Documents aren't about "the"
- Often assumed that terms are uncorrelated
- Correlations between term vectors implies a similarity between documents

#### **Document Vectors**



- Documents are represented as "bags of words"
- Represented as vectors when used computationally
  - Has direction and magnitude
  - Each vector holds a place for every term in the collection
  - Therefore, most vectors are sparse

#### The Training Set: Processing Existing Sensitive Content



- We can gain accuracy if we can provide
  - A representative set of sensitive content
- Negative training set ("outliers")
   Similar content that is not sensitive
- Learning systems
  - Supervised vs. Unsupervised learning

#### Spam vs. Sensitive Content



# Spam detection and sensitive content detection have significant differences.

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#### **Detecting Sensitive Information vs. Spam Detection**



- Similarities
  - Language analysis can be used to classify
  - Meta data may exist to help with detection
- Differences
  - Your Spam and my Spam are the same
  - Your sensitive information and mine are different
  - Sensitive information is often time sensitive; Spam is not
  - Spammers try to make Spam not look like Spam; sensitive information is not obfuscated

### HOW DO YOU KNOW WHAT IS SENSITIVE?



# ASSET CLASSIFICATION

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## ISO 17799: Code of Practice for Information Security Management



- Security Policy
- System Access Control
- Computer & Operations Management
- System Development and Maintenance
- Physical and Environmental Security
- Compliance
- Personnel Security
- Asset Classification and Control
- Business Continuity Management

## ISO 17799: Code of Practice for Information Security Management



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#### **ISO 17799: Asset Classification**



# A suggested schema for classification:

- Confidentiality can the information be freely distributed?
- Value is this costly to replace?
- Time will its confidentiality status change over time
- Access rights who will have access to this information?
- Retention when can this information be destroyed?

### ISO 17799: Asset Classification



# A suggested schema for classification:

- Confidentiality can the information be freely distributed?
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## ISO 17799: Confidentiality



# Suggested levels of confidentiality\*:

- Authentication data internal security information
- **Restricted** never leaves organization
- Confidential Plus financial information
- Confidential restricted to specific roles within the company
- Internal restricted to company employees
- **Public** publicly accessible information
- \* Actual classification schema used by a very large financial institution It's your business to know.

# INFORMATION RETRIEVAL (IR)



# IT'S ALL ABOUT THE ACCURACY

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# Quick Overview of Search and IR Technologies



- In IR solutions, when we talk about "accuracy" we often talk about:
  - Precision
    - Proportion of retrieved material actually relevant
  - Recall
    - Proportion of relevant material actually retrieved

# Is Internet Search really about "search"?



- Finding all occurrences is not too helpful
- Ranking the relevance of the results is key
- If you lower the Recall you will generally increase the Precision but you run the risk of missing something you want.





- There is a tradeoff between Precision and Recall
- So measure Precision at different levels of Recall



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#### **TREC – NIST Text Retrieval Competition**



- Text REtrieval Conference/Competition
  - Run by NIST (National Institute of Standards & Technology)
- Collection: 3 Gigabytes, >1 Million Docs
  - Newswire & full text news (AP, WSJ, Ziff)
  - Government documents (federal register)
- Queries + Relevance Judgments
  - Queries devised and judged by Information Specialists
- Competition
  - Various research and commercial groups compete
  - Results judged on precision and recall

#### An Example of Poor Precision...



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<u>June 2000 : Informix &amp; amp, XML</u> Chief <b>Plumber</b> INFORMIX Software Inc., 4100 Bohannon Drive <b>Menio Park</b> California 94025 USA Phone: 650 926 6300 Fax: 510 628 3951 email: paul.brown@informix.com www.infoloom.com/gcaconfs/WEB/paris2000/S35-04.HTM - 30k - <u>Cached</u> - <u>Similar pages</u>	
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#### **Precision and Ambiguity**



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#### Did anyone here wonder what UniCycle for SmallTalk is?





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## UniCycle for SmallTalk (so now you know!)



#### UniCycle for Smalltalk

#### Features

#### Software Maintenance Keeping you Informed and in Control

Unity's UniCycle is the first complete, integrated software maintenance system for VisualAge Smalltalk ( www.software.ibm. com/ad/smalltalk), combining the functions of problem management, software distribution and task-based workflow systems. With the capability to manage the ongoing maintenance of software that is ready for deployment or has already been deployed, UniCycle keeps developers and managers fully informed and in control of their VisualAge applications.

#### Sample of Unicycle for Smalltalk Interface

#### Unique Features and Benefits of UniCycle:

- Remote Problem Capture and Fix
- Problem Management
- Software Patch Distribution
- Full-phase Capabilities
- Integration with Configuration Management System
- Capture of Debugger Stack as Objects
- · Task Viewer
- Configuration Editor
- Easier Packaging
- Capture of Windows Registry Information
- · Compression of Screen Capture Information
- Selective Window Capture for Manual Task Creation
- Separately Configurable Storage Targets for Capture and Patch
- Custom Attributes Specification within a Packaged Application



Features Downloads Case Study Pricing Information Support







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#### **Keyword Matching**



- We <u>can</u> achieve high precision when we provide very specific keywords to match
- Matching generic terms is not likely to produce sufficient precision for flagging sensitive content



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# **Document Clustering Techniques**



- If you can process a representative set of your sensitive content then you can use document clustering techniques
- Examples...
  - HR documents
  - Source code for specific projects
  - Corporate financial documents
  - Marketing documents

# **Document Clustering:** "Documents like this"



- We can scan new content we see for overwhelming similarity to existing sensitive documents
- Documents can be viewed as similar based on statistical similarities or you can look for language similarities (or both)

#### **Text Analysis:**

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#### **Text Analysis:** Tokenize, stem, normalize



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#### **Document Representation:** What values to use for terms



- tf (term frequency) Count of times term occurs in document.
  - The more times a term *t* occurs in document *d* the more likely it is that *t* is relevant to the document.
  - Used alone, favors common words, long documents.
- df document frequency
  - The more a term *t* occurs throughout all documents, the more poorly *t* discriminates between documents
- tf-idf term frequency \* inverse document frequency
  - High value indicates that the word occurs more often in this document than average.

# **Document Matching Based on Fingerprints**



- Documents that are derived from the same source will likely have common fingerprints
- Documents that share common boilerplate information shared by many documents will not
- Documents talking about the same thing but not derived from the same source will probably <u>not</u> share common fingerprints

#### **Text Analysis:** Generate collection of fingerprints



- Fingerprint 1 @1: 9aee9ea8d640be7f6df0766b02411e93
- findings audit follows acceptable satisfies requirements ISO 9001 2000
- Fingerprint 2 @21: 4c7c05b25170b410398bffa26c7faa47
- audit report version 2001 standard objective information concerning
- Fingerprint 3 @35: 8bfc73fa7a07aa92f091fce0b2272087
- 82203 Auditing 2001 During audit auditor collect objective information
- •

#### **Content Alarm Approach**





#### It's your business to know."

### **Content Alarm Approach**



- Content Analysis Engine
  - Multiple analyzers
    - Keyword/regex analyzer
    - File signature analyzer
    - Meta data analyzer
    - Fingerprint analyzer
    - Database data analyzer\*



\* Version 2 feature

#### **Content Alarm Architecture**





#### Conclusion



 Think of search and knowledge discovery tools as part of your security toolkit!



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