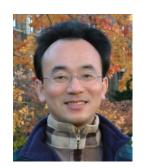




文字探勘與網頁探勘 (Text and Web Mining)

1022DM09 MI4 Wed, 6,7 (13:10-15:00) (B216)



Min-Yuh Day 戴敏育 Assistant Professor 專任助理教授

Dept. of Information Management, Tamkang University

淡江大學 資訊管理學系



課程大綱 (Syllabus)

日期 (Date) 內容 (Subject/Topics) 週次 (Week) 資料探勘導論 (Introduction to Data Mining) 103/02/19 103/02/26 關連分析 (Association Analysis) 103/03/05 分類與預測 (Classification and Prediction) 3 103/03/12 分群分析 (Cluster Analysis) 個案分析與實作一(SAS EM 分群分析): 103/03/19 Case Study 1 (Cluster Analysis – K-Means using SAS EM) 個案分析與實作二 (SAS EM 關連分析): 103/03/26 Case Study 2 (Association Analysis using SAS EM) 教學行政觀摩日 (Off-campus study) 103/04/02 個案分析與實作三 (SAS EM 決策樹、模型評估): 103/04/09 Case Study 3 (Decision Tree, Model Evaluation using SAS EM)

課程大綱 (Syllabus)

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週次 (Week) 日期 (Date) 內容 (Subject/Topics)
             期中報告 (Midterm Project Presentation)
  103/04/16
   103/04/23 期中考試週 (Midterm Exam)
10
   103/04/30 個案分析與實作四 (SAS EM 迴歸分析、類神經網路):
11
              Case Study 4 (Regression Analysis,
              Artificial Neural Network using SAS EM)
              文字探勘與網頁探勘 (Text and Web Mining)
   103/05/07
12
   103/05/14
              海量資料分析 (Big Data Analytics)
13
              期末報告 (Final Project Presentation)
   103/05/21
14
   103/05/28 畢業考試週 (Final Exam)
15
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Learning Objectives

- Differentiate between text mining, Web mining and data mining
- Application areas for text mining
- Web mining
 - Web content mining
 - Web structure mining
 - Web usage mining

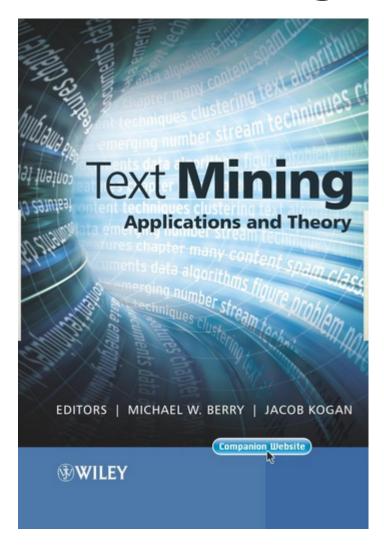
Learning Objectives

- Describe Web mining, its objectives, and its benefits
- Understand the three different branches of Web mining
 - Web content mining
 - Web structure mining
 - Web usage mining
- Understand the applications of these three mining paradigms

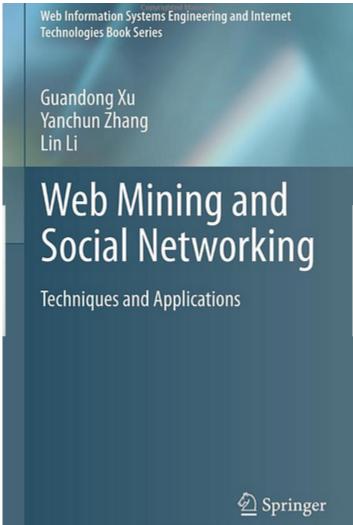
Text and Web Mining

- Text Mining: Applications and Theory
- Web Mining and Social Networking
- Mining the Social Web: Analyzing Data from Facebook, Twitter, LinkedIn, and Other Social Media Sites
- Web Data Mining: Exploring Hyperlinks, Contents, and Usage Data
- Search Engines Information Retrieval in Practice

Text Mining



Web Mining and Social Networking



Mining the Social Web: Analyzing Data from Facebook, Twitter, LinkedIn, and Other Social Media Sites

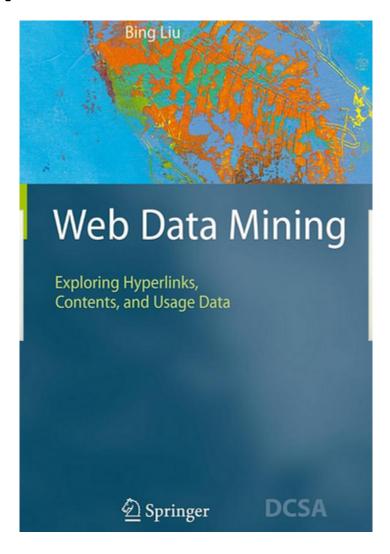
Analyzing Data from Facebook, Twitter, LinkedIn, and Other Social Media Sites



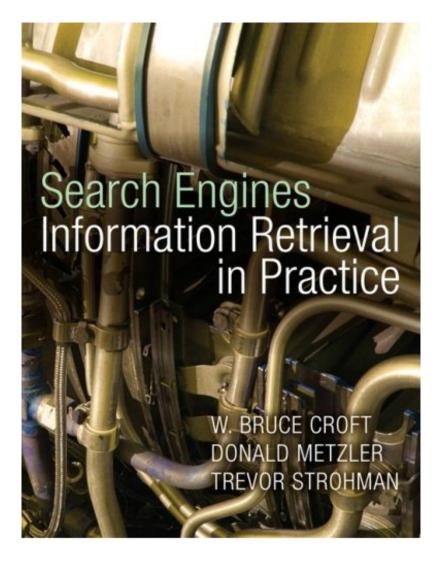
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Web Data Mining: Exploring Hyperlinks, Contents, and Usage Data



Search Engines: Information Retrieval in Practice



Text Mining

- Text mining (text data mining)
 - the process of deriving high-quality information from text
- Typical text mining tasks
 - text categorization
 - text clustering
 - concept/entity extraction
 - production of granular taxonomies
 - sentiment analysis
 - document summarization
 - entity relation modeling
 - i.e., learning relations between named entities.

Web Mining

- Web mining
 - discover useful information or knowledge from the Web hyperlink structure, page content, and usage data.
- Three types of web mining tasks
 - Web structure mining
 - Web content mining
 - Web usage mining

Text Mining Concepts

- 85-90 percent of all corporate data is in some kind of unstructured form (e.g., text)
- Unstructured corporate data is doubling in size every 18 months
- Tapping into these information sources is not an option, but a need to stay competitive
- Answer: text mining
 - A semi-automated process of extracting knowledge from unstructured data sources
 - a.k.a. text data mining or knowledge discovery in textual databases

Data Mining versus Text Mining

- Both seek for novel and useful patterns
- Both are semi-automated processes
- Difference is the nature of the data:
 - Structured versus unstructured data
 - Structured data: in databases
 - Unstructured data: Word documents, PDF files, text excerpts, XML files, and so on
- Text mining first, impose structure to the data, then mine the structured data

Text Mining Concepts

- Benefits of text mining are obvious especially in text-rich data environments
 - e.g., law (court orders), academic research (research articles), finance (quarterly reports), medicine (discharge summaries), biology (molecular interactions), technology (patent files), marketing (customer comments), etc.
- Electronic communization records (e.g., Email)
 - Spam filtering
 - Email prioritization and categorization
 - Automatic response generation

Text Mining Application Area

- Information extraction
- Topic tracking
- Summarization
- Categorization
- Clustering
- Concept linking
- Question answering

Text Mining Terminology

- Unstructured or semistructured data
- Corpus (and corpora)
- Terms
- Concepts
- Stemming
- Stop words (and include words)
- Synonyms (and polysemes)
- Tokenizing

Text Mining Terminology

- Term dictionary
- Word frequency
- Part-of-speech tagging (POS)
- Morphology
- Term-by-document matrix (TDM)
 - Occurrence matrix
- Singular Value Decomposition (SVD)
 - Latent Semantic Indexing (LSI)

- Structuring a collection of text
 - Old approach: bag-of-words
 - New approach: natural language processing
- NLP is ...
 - a very important concept in text mining
 - a subfield of artificial intelligence and computational linguistics
 - the studies of "understanding" the natural human language
- Syntax versus semantics based text mining

- What is "Understanding"?
 - Human understands, what about computers?
 - Natural language is vague, context driven
 - True understanding requires extensive knowledge of a topic
 - Can/will computers ever understand natural language the same/accurate way we do?

- Challenges in NLP
 - Part-of-speech tagging
 - Text segmentation
 - Word sense disambiguation
 - Syntax ambiguity
 - Imperfect or irregular input
 - Speech acts
- Dream of AI community
 - to have algorithms that are capable of automatically reading and obtaining knowledge from text

WordNet

- A laboriously hand-coded database of English words, their definitions, sets of synonyms, and various semantic relations between synonym sets
- A major resource for NLP
- Need automation to be completed

Sentiment Analysis

- A technique used to detect favorable and unfavorable opinions toward specific products and services
- CRM application

NLP Task Categories

- Information retrieval (IR)
- Information extraction (IE)
- Named-entity recognition (NER)
- Question answering (QA)
- Automatic summarization
- Natural language generation and understanding (NLU)
- Machine translation (ML)
- Foreign language reading and writing
- Speech recognition
- Text proofing
- Optical character recognition (OCR)

Text Mining Applications

- Marketing applications
 - Enables better CRM
- Security applications
 - ECHELON, OASIS
 - Deception detection (...)
- Medicine and biology
 - Literature-based gene identification (...)
- Academic applications
 - Research stream analysis

Text Mining Tools

- Commercial Software Tools
 - SPSS PASW Text Miner
 - SAS Enterprise Miner
 - Statistica Data Miner
 - ClearForest, ...
- Free Software Tools
 - RapidMiner
 - GATE
 - Spy-EM, ...

SAS Text Analytics



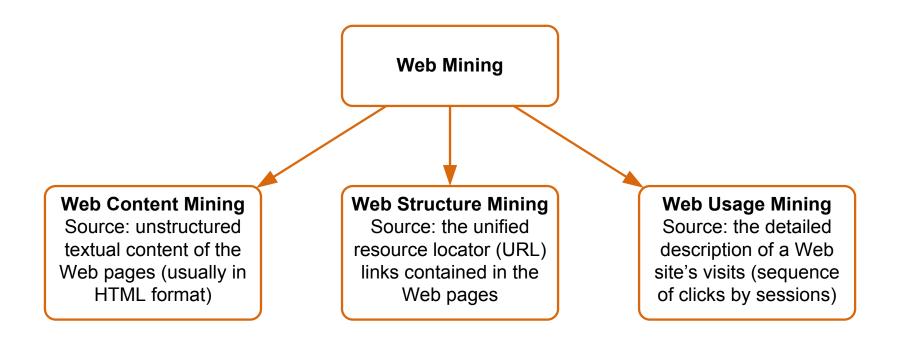


Web Mining Overview

- Web is the largest repository of data
- Data is in HTML, XML, text format
- Challenges (of processing Web data)
 - The Web is too big for effective data mining
 - The Web is too complex
 - The Web is too dynamic
 - The Web is not specific to a domain
 - The Web has everything
- Opportunities and challenges are great!

Web Mining

 Web mining (or Web data mining) is the <u>process</u> of discovering intrinsic relationships from Web data (textual, linkage, or usage)



Web Content/Structure Mining

- Mining of the textual content on the Web
- Data collection via Web crawlers
- Web pages include hyperlinks
 - Authoritative pages
 - Hubs
 - hyperlink-induced topic search (HITS) alg

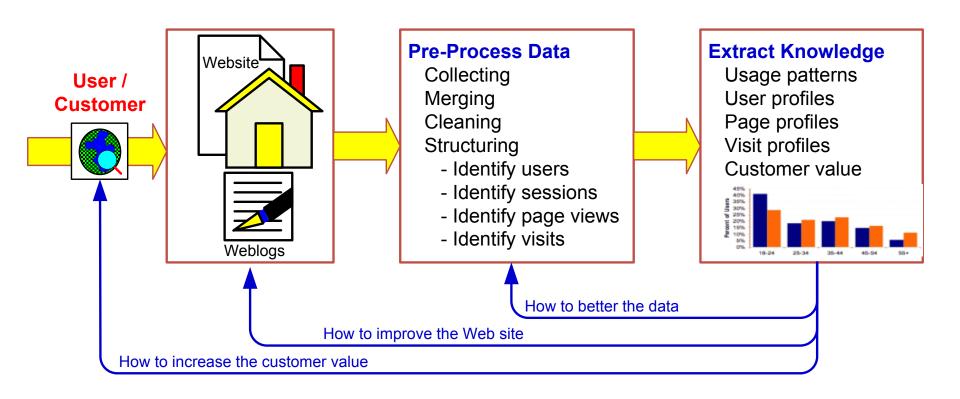
Web Usage Mining

- Extraction of information from data generated through Web page visits and transactions...
 - data stored in server access logs, referrer logs, agent logs, and client-side cookies
 - user characteristics and usage profiles
 - metadata, such as page attributes, content attributes, and usage data
- Clickstream data
- Clickstream analysis

Web Usage Mining

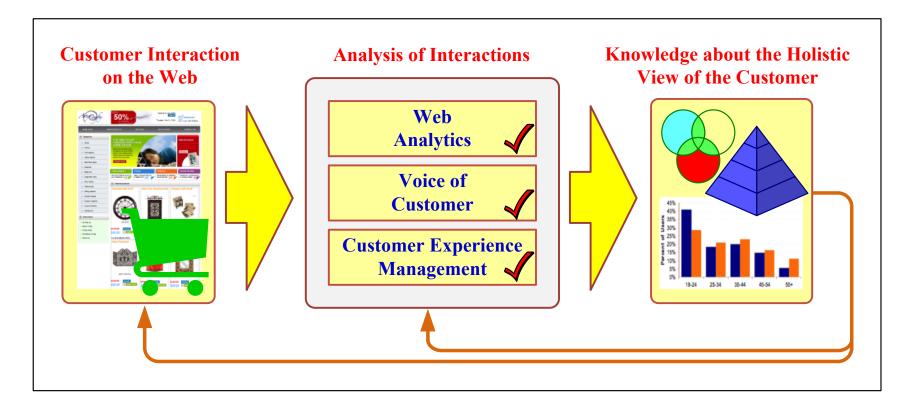
- Web usage mining applications
 - Determine the lifetime value of clients
 - Design cross-marketing strategies across products.
 - Evaluate promotional campaigns
 - Target electronic ads and coupons at user groups based on user access patterns
 - Predict user behavior based on previously learned rules and users' profiles
 - Present dynamic information to users based on their interests and profiles...

Web Usage Mining (clickstream analysis)



Web Mining Success Stories

- Amazon.com, Ask.com, Scholastic.com, ...
- Website Optimization Ecosystem



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歐巴馬是美國的一位總統

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文章的文字檔 攝取未知詞過程 包含未知詞的斷詞標記結果 未知詞列表

歐巴馬(Nb) 是(SHI) 美國(Nc) 的(DE) 一(Neu) 位(Nf) 總統(Na)

中文文字處理:中文斷詞

抗氣候變遷 白宮籲採緊急行動

中央通訊社 中央社 - 2014年5月6日下午10:58

(中央社華盛頓6日綜合外電報導) 白宮今天公布全球暖化對全美及美國經濟關鍵產業造 成何種衝擊的新報告, 呼籲採取緊急行動對抗氣候變遷。

這份為期4年的調查警告,極端氣候事件將對住家、基礎設施及產業帶來嚴重威脅。

美國總統歐巴馬2008年當選總統時曾在競選造勢時誓言,要讓美國成為對抗氣候變遷與相 關「安全威魯」的領頭羊。

但歐巴馬在任上一直未能說服美國國會採取重大行動。

在本週對這項議題採取的新作為中,歐巴馬今天將與數名氣象學家接受電視訪問,討論美 國全國氣候評估第3版調查結果。

美國數百名來自政府與民間的頂尖氣候科學家及技術專家,共同投入這項研究,檢視氣候 變遷對當今帶來的衝擊並預測將對下個世紀帶來何種影響。

研究人員警告,加州可能發生旱災、奧克拉荷馬州發生草原大火,東岸則可能遭遇海平面 上升,尤其佛羅里達,而這些事件多為人類造成。

海平面上升也將吞噬密西西比等低窪地區。

至於超過8000萬人居住日擁有全美部分成長最快都會區的東南部與加勒比海區,「海平面 上升加上其他與氣候變遷有關的衝擊,以及地層下陷等既有問題,將對經濟和生態帶來重 大影響」。

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58(Neu) ((PARENTHESISCATEGORY) 中央社(Nc) 華盛頓(Nc) 6日(Nd) 綜合(A) 外電(Na) 報導(VE))(PARENTHESISCATEGORY) 白宮(Nc) 今天(Nd
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但(Cbb) 歐巴馬(Nb) 在任(VH) 上(Ng) 一直(D) 未(D) 能(D) 說服(VF) 美國(Nc) 國會(Nc) 採取(VC) 重大(VH) 行動(Na) 。(PERIODCATEGORY)
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美國(Nc) 數百(Neu) 名(Nf) 來自(VJ) 政府(Na) 與(Caa) 民間(Nc) 的(DE) 頂尖(VH) 氣候(Na) 科學家(Na) 及(Caa) 技術(Na) 專家(Na) '(COMM
共同(A) 投入(VC) 這(Nep) 項(Nf) 研究(Na) '(COMMACATEGORY)
檢視(VC) 氣候(Na) 變遷(VH) 對(P) 當今(Nd) 帶來(VC) 的(DE) 衝擊(Na) 並(D) 預測(VE) 將(D) 對(P) 下(Nes) 個(Nf) 世紀(Na) 帶來(VC) 何
研究(Na) 人員(Na) 警告(VE) '(COMMACATEGORY)
加州(Nc) 可能(D) 發生(VJ) 旱災(Na) 、(PAUSECATEGORY) 奧克拉荷馬州(Nc) 發生(VJ) 草原(Na) 大火(Na) ,(COMMACATEGORY)
東岸(Nc) 則(D) 可能(D) 遭遇(VJ) 海平面(Na) 上升(VA) '(COMMACATEGORY)
尤其(D) 佛羅里達(Nc) '(COMMACATEGORY)
而(Cbb) 這些(Neqa) 事件(Na) 多(D) 為(VG) 人類(Na) 造成(VK) 。(PERIODCATEGORY)
海平面(Na) 上升(VA) 也(D) 將(D) 吞噬(VC) 密西西比(Nb) 等(Cab) 低窪(VH) 地區(Nc) 。(PERIODCATEGORY)
至於(P) 超過(VJ) 8000萬(Neu) 人(Na) 居住(VA) 且(Cbb) 擁有(VJ) 全美(Nb) 部分(Neqa) 成長(VH) 最(Dfa) 快(VH) 都會區(Nc) 的(DE) 東南
「(PARENTHESISCATEGORY) 海平面(Na) 上升(VA) 加上(VC) 其他(Neqa) 與(Caa) 氣候(Na) 變遷(VH) 有關(VJ) 的(DE) 衝擊(Na) ,(COMMACATEGOR

http://nlp.stanford.edu/software/index.shtml



The Stanford Natural Language Processing Group

home · people · teaching · research · publications · software · events · local

The Stanford NLP Group makes parts of our Natural Language Processing software available to everyone. These are statistical NLP toolkits for various major computational linguistics problems. They can be incorporated into applications with human language technology needs.

All the software we distribute here is written in Java. All recent distributions require Oracle Java 6+ or OpenJDK 7+. Distribution packages include components for command-line invocation, jar files, a Java API, and source code. A number of helpful people have extended our work with bindings or translations for other languages. As a result, much of this software can also easily be used from Python (or Jython), Ruby, Perl, Javascript, and F# or other .NET languages.



Supported software distributions

This code is being developed, and we try to answer questions and fix bugs on a besteffort basis.

All these software distributions are open source, **licensed under the GNU General Public License** (v2 or later). Note that this is the *full* GPL, which allows many free uses, but *does not allow* its incorporation into any type of distributed proprietary software, even in part or in translation. **Commercial licensing** is also available; please contact us if you are interested.

Stanford CoreNLP

An integrated suite of natural language processing tools for English and (mainland) Chinese in Java, including tokenization, part-of-speech tagging, named entity recognition, parsing, and coreference. See also: Stanford Deterministic Coreference Resolution, and the online CoreNLP demo, and the CoreNLP FAQ.

Stanford Parser

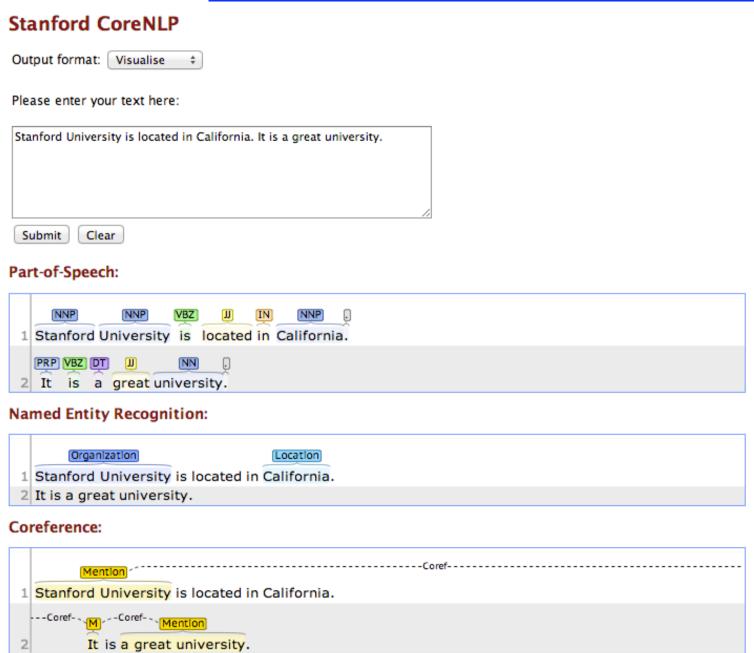
Implementations of probabilistic natural language parsers in Java: highly optimized PCFG and dependency parsers, a lexicalized PCFG parser, and a deep learning reranker. See also: Online parser demo, the Stanford Dependencies page, and Parser FAQ.

Stanford POS Tagger

A maximum-entropy (CMM) part-of-speech (POS) tagger for English,

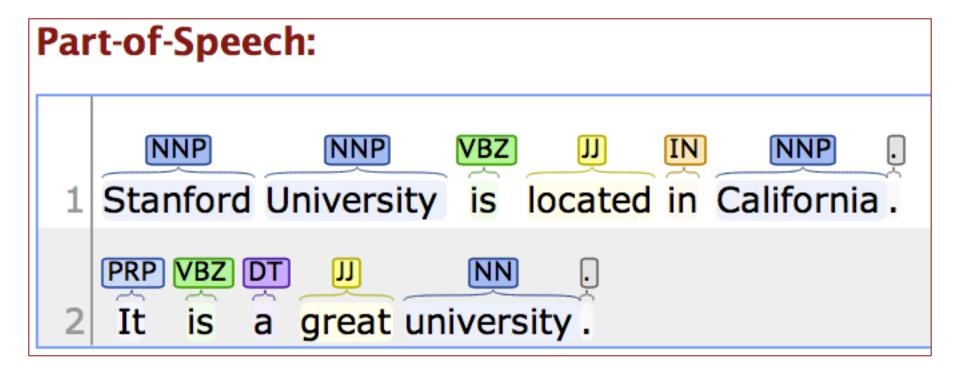
Stanford NLP Software

Stanford CoreNLP http://nlp.stanford.edu:8080/corenlp/process



http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.



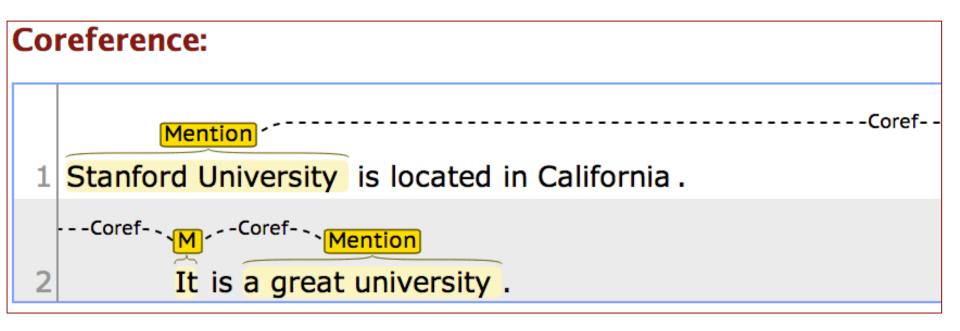
http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.

Named Entity Recognition: Organization Stanford University is located in California. It is a great university.

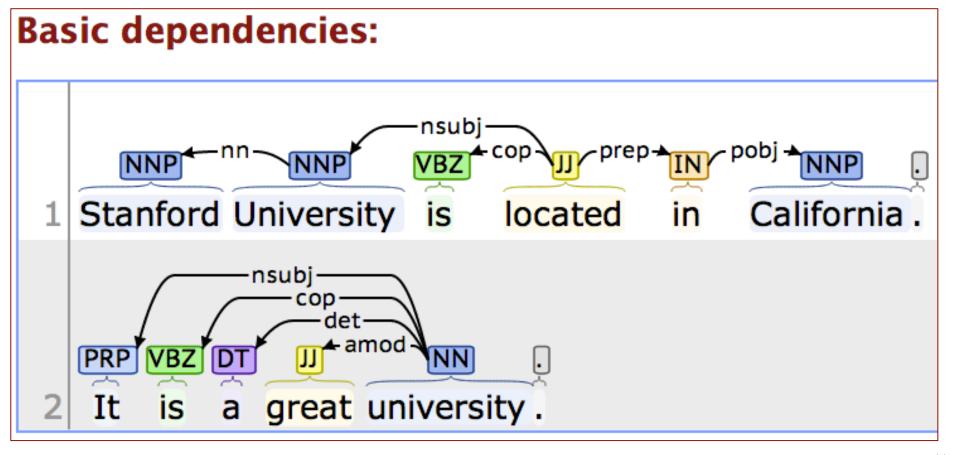
http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.

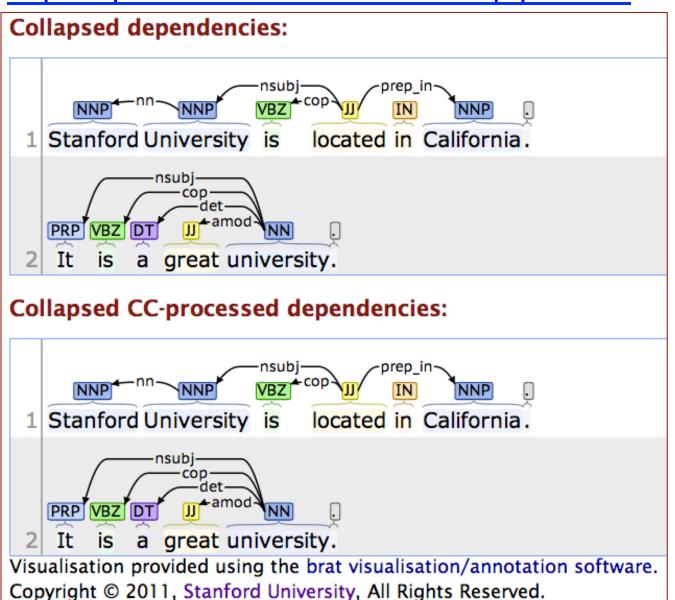


http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.



http://nlp.stanford.edu:8080/corenlp/process



Output format:	Pretty print	‡					
Please enter your text here:							
Stanford Univers	ity is located in	n California. I	t is a great unive	rsity.			
Submit Clea	ar						

Stanford CoreNLP XML Output

Document **Document Info** Sentences Sentence #1 Tokens Char begin Char end POS Normalized NER Speaker NER Word Lemma 1 Stanford Stanford 8 NNP ORGANIZATION PER0 2 University University 9 NNP ORGANIZATION 19 PER0 3 is be 20 22 VBZ O PER0 4 located located 23 30 PER₀ 5 in 31 33 PER₀ 6 | California | California | 34 44 NNP LOCATION PER0 45 0 PER0 44 Parse tree (ROOT (S (NP (NNP Stanford) (NNP University)) (VP (VBZ is) (ADJP (JJ located) (PP (IN in) (NP (NNP California))))) (. .)))

http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.

Sentence #1

Tokens

ld	Word	Lemma	Char begin	Char end	POS	NER	Normalized NER	Speaker
1	Stanford	Stanford	0	8	NNP	ORGANIZATION		PER0
2	University	University	9	19	NNP	ORGANIZATION		PER0
3	is	be	20	22	VBZ	0		PER0
4	located	located	23	30	JJ	0		PER0
5	in	in	31	33	IN	0		PER0
6	California	California	34	44	NNP	LOCATION		PER0
7			44	45		0		PER0

Parse tree

(ROOT (S (NP (NNP Stanford) (NNP University)) (VP (VBZ is) (ADJP (JJ located) (PP (IN in) (NP (NNP California))))) (. .)))

http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.

ld	Word	Lemma	Char begin	Char end	POS	NER	Normalized NER	Speake
1	lt	it	46	48	PRP	0		PER0
2	is	be	49	51	VBZ	0		PER0
3	a	a	52	53	DT	0		PER0
4	great	great	54	59	JJ	0		PER0
5	university	university	60	70	NN	0		PER0
6			70	71		0		PER0

http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.

1. Sentence Head Text Context 1 2 (gov) Stanford University 2 1 It 2 5 a great university

iokens								
ld	Word	Lemma	Char begin	Char end	POS	NER	Normalized NER	Speaker
1	Stanford	Stanford	0	8	NNP	ORGANIZA	ATION	PER0
2	University	University	9	19	NNP	ORGANIZA	ATION	PER0
3	is	be	20	22	VBZ	Ο	PER0	
4	located	located	23	30	JJ	O	PER0	
5	in	in	31	33	IN	Ο	PER0	
6	California	California	34	44	NNP	LOCATION	N PER0	
7			44	45		0	PFR0	

Parse tree

(ROOT (S (NP (NNP Stanford) (NNP University)) (VP (VBZ is) (ADJP (JJ located) (PP (IN in) (NP (NNP California))))) (...)))

Uncollapsed dependencies

```
root (ROOT-0, located-4)
nn (University-2, Stanford-1)
nsubj (located-4, University-2)
cop (located-4, is-3)
prep (located-4, in-5)
pobj (in-5, California-6)
Collapsed dependencies
```

```
root (ROOT-0, located-4)
nn (University-2, Stanford-1)
nsubj (located-4, University-2)
cop (located-4, is-3)
prep_in (located-4, California-6)
Collapsed dependencies with CC processed
```

```
root (ROOT-0, located-4)
nn (University-2, Stanford-1)
nsubj (located-4, University-2)
cop (located-4, is-3)
prep in (located-4, California-6)
```

Stanford CoreNLP

http://nlp.stanford.edu:8080/corenlp/process

Stanford University is located in California. It is a great university.

Output format: XML Please enter your text here: Stanford University is located in California. It is a great university. Submit Clear <?xml version="1.0" encoding="UTF-8"?> <?xml-stylesheet href="CoreNLP-to-HTML.xsl" type="text/xsl"?> <root> <document> <sentences> <sentence id="1"> <tokens> <token id="1"> <word>Stanford</word> <lemma>Stanford</lemma> <CharacterOffsetBegin>0</CharacterOffsetBegin> <CharacterOffsetEnd>8</CharacterOffsetEnd> <POS>NNP</POS> <NER>ORGANIZATION</NER> <Speaker>PERO</Speaker> </token> <token id="2"> <word>University</word> <lemma>University</lemma> <CharacterOffsetBegin>9</CharacterOffsetBegin> <CharacterOffsetEnd>19</CharacterOffsetEnd> <POS>NNP</POS> <NER>ORGANIZATION</NER> <Speaker>PERO</Speaker> </token>

NER for News Article

http://money.cnn.com/2014/05/02/technology/gates-microsoft-stock-sale/index.html



Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET

Bill Gates sold nearly 8 million shares of Microsoft over the past two days.

NEW YORK (CNNMoney)

For the first time in Microsoft's history, founder Bill Gates is no longer its largest individual shareholder.

In the past two days, Gates has sold nearly 8 million shares of Microsoft (MSFT, Fortune 500), bringing down his total to roughly 330 million.

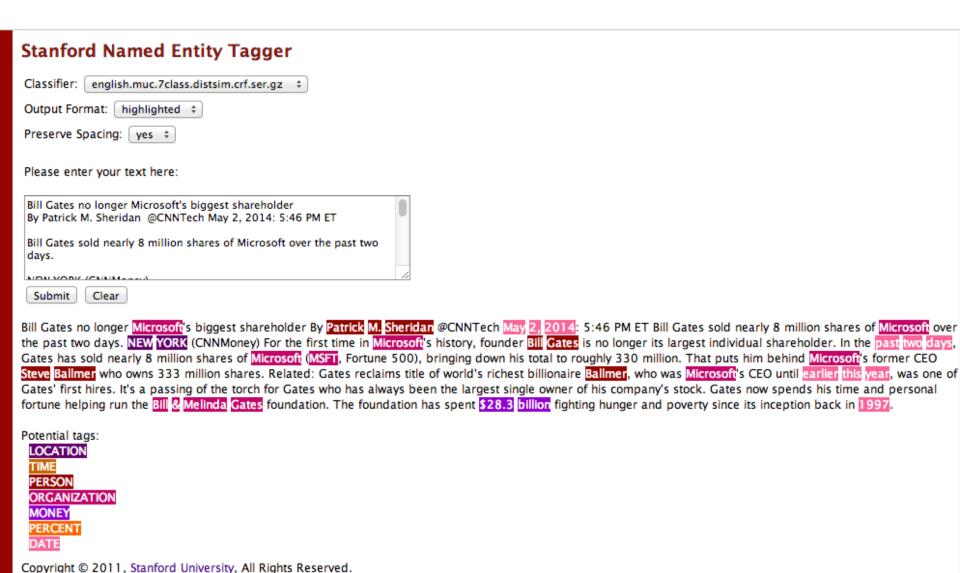
That puts him behind Microsoft's former CEO Steve Ballmer who owns 333 million shares.

Related: Gates reclaims title of world's richest billionaire Ballmer, who was Microsoft's CEO until earlier this year, was one of Gates' first hires.

It's a passing of the torch for Gates who has always been the largest single owner of his company's stock. Gates now spends his time and personal fortune helping run the Bill & Melinda Gates foundation.

The foundation has spent \$28.3 billion fighting hunger and poverty since its inception back in 1997.

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http://nlp.stanford.edu:8080/ner/process

Stanford Named Entity Tagger

Classifier: english.muc.7class.distsim.crf.ser.gz ‡	
Output Format: inlineXML +	
Preserve Spacing: yes ‡	
Please enter your text here:	
Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET	
Bill Gates sold nearly 8 million shares of Microsoft over the past two days.	
Submit Clear	14

Bill Gates no longer <ORGANIZATION>Microsoft</ORGANIZATION>'s biggest shareholder By <PERSON>Patrick M. Sheridan</PERSON> @CNNTech <DATE>May 2, 2014</DATE>: 5:46 PM ET Bill Gates sold nearly 8 million shares of <ORGANIZATION>Microsoft</ORGANIZATION> over the past two days. <LOCATION>NEW YORK</LOCATION> (CNNMoney) For the first time in <ORGANIZATION>Microsoft</ORGANIZATION>'s history, founder <PERSON>Bill Gates</PERSON> is no longer its largest individual shareholder. In the <DATE>past two days</DATE>, Gates has sold nearly 8 million shares of <ORGANIZATION>Microsoft</ORGANIZATION>Microsoft</ORGANIZATION>, Fortune 500), bringing down his total to roughly 330 million. That puts him behind <ORGANIZATION>Microsoft</ORGANIZATION> shares. Related: Gates reclaims title of world's richest billionaire <PERSON> Ballmer</PERSON>, who was <ORGANIZATION>Microsoft</ORGANIZATION>'s CEO until <DATE>earlier this year</DATE>, was one of Gates' first hires. It's a passing of the torch for Gates who has always been the largest single owner of his company's stock. Gates now spends his time and personal fortune helping run the <ORGANIZATION>Bill & Melinda Gates</ORGANIZATION> foundation. The foundation has spent <MONEY>\$28.3 billion</MONEY> fighting hunger and poverty since its inception back in <DATE>1997</DATE>.

http://nlp.stanford.edu:8080/ner/process

Stanford Named Entity Tagger

Classifier: english.muc.7class.distsim.crf.ser.gz +	
Output Format: xml +	
Preserve Spacing: yes ‡	
Please enter your text here:	
Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET	0
Bill Gates sold nearly 8 million shares of Microsoft over the past two days.	
Submit Clear	

<wi num="0" entity="0">Bill</wi> <wi num="1" entity="0">Gates</wi> <wi num="2" entity="0">no</wi> <wi num="3" entity="0">longer</wi> <wi num="4" entity="ORGANIZATION">Microsoft</wi><wi num="5" entity="0">&apos:s</wi><wi num="6" entity="0">biggest</wi><wi num="7" entity="0">shareholder</wi><wi num="8" entity="0">By</wi> <wi num="9" entity="PERSON">Patrick</wi> <wi num="10" entity="PERSON">M.</wi> <wi num="11" entity="PERSON">Sheridan</wi> <wi num="12" entity="0">@CNNTech</wi> <wi num="13" entity="DATE">May</wi> <wi num="14" entity="DATE">2</wi><wi num="15" entity="DATE">.</wi> <wi num="16" entity="DATE">2014</wi><wi num="17" entity="0">:</wi> <wi num="18" entity="0">5:46</wi> <wi num="19" entity="0">PM</wi> <wi num="20" entity="0">ET</wi> <wi num="21" entity="0">Bill</wi> <wi num="22" entity="0">Gates</wi> <wi num="23" entity="0">sold</wi> <wi num="24" entity="0">nearly</wi> <wi num="25" entity="0">8</wi> <wi num="26" entity="0">million</wi> <wi num="27" entity="0">shares</wi> <wi num="28" entity="0">of</wi> <wi num="29" entity="0">the</wi> <wi num="31" entity="0">the</wi> <wi num="32" entity="0">past</wi> <wi num="33" entity="0">two</wi> <wi num="34" entity="0">days</wi> <wi num="35" entity="0">,</wi> <wi num="0" entity="LOCATION"> NEW</wi> <wi num="1" entity="LOCATION"> YORK</wi> <wi num="2" entity="0">-LRB-</wi> <wi num="3" entity="0">-CNNMoney</wi> <wi num="4" entity="0">-RRB-</wi> <wi num="5" entity="0">For</wi> <wi num="6" entity="0">the</wi> <wi num="7" entity="0">first</wi> <wi num="8" entity="0">time</wi> <wi num="9" entity="0">in</wi> <wi num="10" entity="0RGANIZATION">Microsoft</wi><wi num="11" entity="0">'s</wi> <wi num="12" entity="0">history</wi><wi num="13" entity="0">.</wi> <wi num="14" entity="0">founder</wi> <wi num="15" entity="PERSON">Bill</wi> <wi num="16" entity="PERSON">Gates</wi> <wi num="17" entity="0">is</wi> <wi num="18" entity="0">no</wi> <wi num="19" entity="0">longer</wi> <wi num="20" entity="0">ity="0 entity="0">largest</wi> <wi num="22" entity="0">individual</wi> <wi num="23" entity="0">shareholder</wi><wi num="24" entity="0">.</wi> <wi num="0" entity="0">In</wi> <wi num="1" entity="0">the</wi> <wi num="2" entity="DATE">past</wi> <wi num="3" entity="DATE">two</wi> <wi num="4" CONTINE OF A LINE OF A

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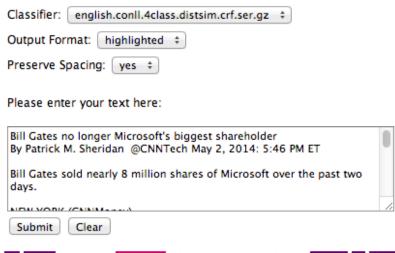
Stanford Named Entity Tagger

Classifier: english.muc.7class.distsim.crf.ser.gz ‡	
Output Format: slashTags +	
Preserve Spacing: yes ‡	
Please enter your text here:	
Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET	
Bill Gates sold nearly 8 million shares of Microsoft over the past two days.	
Submit Clear	

Bill/O Gates/O no/O longer/O Microsoft/ORGANIZATION's/O biggest/O shareholder/O By/O Patrick/PERSON M./PERSON Sheridan/PERSON @CNNTech/O May/DATE 2/DATE_/DATE_2014/DATE_/O 5:46/O PM/O ET/O Bill/O Gates/O sold/O nearly/O 8/O million/O shares/O of/O Microsoft/ORGANIZATION over/O the/O past/O two/O days/O./O NEW/LOCATION YORK/LOCATION -LRB-/OCNNMoney/O-RRB-/O For/O the/O first/O time/O in/O Microsoft/ORGANIZATION's/O history/O,/O founder/O Bill/PERSON Gates/PERSON is/O no/O longer/O its/O largest/O individual/O shareholder/O./O In/O the/O past/DATE two/DATE days/DATE_,/O Gates/O has/O sold/O nearly/O 8/O million/O shares/O of/O Microsoft/ORGANIZATION -LRB-/OMSFT/ORGANIZATION,/O Fortune/O 500/O-RRB-/O,/O bringing/O down/O his/O total/O to/O roughly/O 330/O million/O./O That/O puts/O him/O behind/O Microsoft/ORGANIZATION's/O former/O CEO/O Steve/PERSON Ballmer/PERSON who/O owns/O 333/O million/O shares/O./O Related/O:/O Gates/O reclaims/O title/O of/O world/O's/O richest/O billionaire/O Ballmer/PERSON,/O who/O was/O Microsoft/ORGANIZATION's/O CEO/O until/O earlier/DATE this/DATE year/DATE,/O was/O one/O of/O Gates/O'/O first/O hires/O./O It/O's/O a/O passing/O of/O the/O torch/O for/O Gates/O who/O has/O always/O been/O the/O largest/O single/O owner/O of/O his/O company/O's/O stock/O./O Gates/O now/O spends/O his/O time/O and/O personal/O fortune/O helping/O run/O the/O Bill/ORGANIZATION &/ORGANIZATION Melinda/ORGANIZATION Gates/ORGANIZATION foundation/O./O The/O foundation/O has/O spent/O \$/MONEY28.3/MONEY billion/MONEY fighting/O hunger/O and/O poverty/O since/O its/O inception/O back/O in/O 1997/DATE./O

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Stanford Named Entity Tagger



BIII Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET BIII Gates sold nearly 8 million shares of Microsoft over the past two days. NEW YORK (CNNMoney) For the first time in Microsoft's history, founder BIII Gates is no longer its largest individual shareholder. In the past two days, Gates has sold nearly 8 million shares of Microsoft (MSFT, Fortune 500), bringing down his total to roughly 330 million. That puts him behind Microsoft's former CEO Steve Ballmer who owns 333 million shares. Related: Gates reclaims title of world's richest billionaire Ballmer, who was Microsoft's CEO until earlier this year, was one of Gates first hires. It's a passing of the torch for Gates who has always been the largest single owner of his company's stock. Gates now spends his time and personal fortune helping run the BIII Melinda Gates foundation. The foundation has spent \$28.3 billion fighting hunger and poverty since its inception back in 1997.

Potential tags:

LOCATION ORGANIZATION PERSON MISC

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Stanford Named Entity Tagger

Classifier: english.all.3class.distsim.crf.ser.gz ‡
Output Format: highlighted ‡
Preserve Spacing: yes +
Please enter your text here:
Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET
Bill Gates sold nearly 8 million shares of Microsoft over the past two days.
Submit Clear
Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sherid

Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET Bill Gates sold nearly 8 million shares of Microsoft over the past two days. NEW YORK (CNNMoney) For the first time in Microsoft's history, founder Bill Gates is no longer its largest individual shareholder. In the past two days, Gates has sold nearly 8 million shares of Microsoft (MSFT, Fortune 500), bringing down his total to roughly 330 million. That puts him behind Microsoft's former CEO Steve Ballmer who owns 333 million shares. Related: Gates reclaims title of world's richest billionaire Ballmer, who was Microsoft's CEO until earlier this year, was one of Gates' first hires. It's a passing of the torch for Gates who has always been the largest single owner of his company's stock. Gates now spends his time and personal fortune helping run the Bill Melinda Gates foundation. The foundation has spent \$28.3 billion fighting hunger and poverty since its inception back in 1997.

Potential tags:

LOCATION ORGANIZATION PERSON

Classifier: english.muc.7class.distsim.crf.ser.gz

```
Bill Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46 PM ET Bill Gates sold nearly 8 million shares of Microsoft over the past two days. NEW YORK (CNNMoney) For the first time in Microsoft's history, founder Bill Gates is no longer its largest individual shareholder. In the past two days, Gates has sold nearly 8 million shares of Microsoft (MSFT, Fortune 500), bringing down his total to roughly 330 million. That puts him behind Microsoft's former CEO Steve Ballmer who owns 333 million shares. Related: Gates reclaims title of world's richest billionaire Ballmer, who was Microsoft's CEO until earlier this year, was one of Gates' first hires. It's a passing of the torch for Gates who has always been the largest single owner of his company's stock. Gates now spends his time and personal fortune helping run the Bill & Melinda Gates foundation. The foundation has spent $28.3 billion fighting hunger and poverty since its inception back in 1997.
```

Potential tags:

DATE

LOCATION
TIME
PERSON
ORGANIZATION
MONEY
PERCENT

Classifier: english.all.3class.distsim.crf.ser.gz

Gates no longer Microsoft's biggest shareholder By Patrick M. Sheridan @CNNTech May 2, 2014: 5:46
PM ET Bill Gates sold nearly 8 million shares of Microsoft over the past two days. NEW YORK (CNNMoney)
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Potential tags:

LOCATION ORGANIZATION PERSON

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Stanford NER Output Format: inlineXML

Bill Gates no longer <ORGANIZATION>Microsoft</ORGANIZATION>'s biggest shareholder By <PERSON>Patrick M. Sheridan</PERSON> @CNNTech <DATE>May 2, 2014</DATE>: 5:46 PM ET Bill Gates sold nearly 8 million shares of <ORGANIZATION>Microsoft
/ORGANIZATION> over the past two days. <LOCATION>NEW YORK
/LOCATION> (CNNMoney) For the first time in <ORGANIZATION>Microsoft
/ORGANIZATION>'s history, founder <PERSON>Bill Gates</PERSON> is no longer its largest individual shareholder. In the <DATE>past two days</DATE>, Gates has sold nearly 8 million shares of <ORGANIZATION>Microsoft</ ORGANIZATION> (<ORGANIZATION>MSFT</ORGANIZATION>, Fortune 500), bringing down his total to roughly 330 million. That puts him behind <ORGANIZATION>Microsoft</ORGANIZATION>'s former CEO <PERSON>Steve Ballmer</PERSON> who owns 333 million shares. Related: Gates reclaims title of world's richest billionaire <PERSON>Ballmer</PERSON>, who was <ORGANIZATION>Microsoft
/ORGANIZATION>'s CEO until <DATE>earlier this year DATE>, was one of Gates' first hires. It's a passing of the torch for Gates who has always been the largest single owner of his company's stock. Gates now spends his time and personal fortune helping run the <ORGANIZATION>Bill & Melinda Gates</ ORGANIZATION> foundation. The foundation has spent <MONEY>\$28.3 billion</ MONEY> fighting hunger and poverty since its inception back in <DATE>1997</DATE>.

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Stanford NER Output Format: slashTags

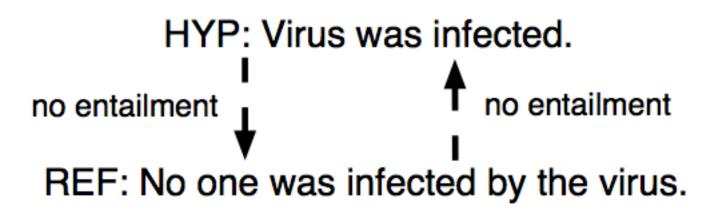
Bill/O Gates/O no/O longer/O Microsoft/ORGANIZATION's/O biggest/O shareholder/O By/O Patrick/ PERSON M./PERSON Sheridan/PERSON @CNNTech/O May/DATE 2/DATE,/DATE 2014/DATE:/O 5:46/O PM/O ET/O Bill/O Gates/O sold/O nearly/O 8/O million/O shares/O of/O Microsoft/ ORGANIZATION over/O the/O past/O two/O days/O./O NEW/LOCATION YORK/LOCATION -LRB-/ OCNNMoney/O-RRB-/O For/O the/O first/O time/O in/O Microsoft/ORGANIZATION's/O history/O,/O founder/O Bill/PERSON Gates/PERSON is/O no/O longer/O its/O largest/O individual/O shareholder/ O./O In/O the/O past/DATE two/DATE days/DATE,/O Gates/O has/O sold/O nearly/O 8/O million/O shares/O of/O Microsoft/ORGANIZATION -LRB-/OMSFT/ORGANIZATION,/O Fortune/O 500/O-RRB-/ O,/O bringing/O down/O his/O total/O to/O roughly/O 330/O million/O./O That/O puts/O him/O behind/ O Microsoft/ORGANIZATION's/O former/O CEO/O Steve/PERSON Ballmer/PERSON who/O owns/O 333/O million/O shares/O./O Related/O:/O Gates/O reclaims/O title/O of/O world/O's/O richest/O billionaire/O Ballmer/PERSON,/O who/O was/O Microsoft/ORGANIZATION's/O CEO/O until/O earlier/ DATE this/DATE year/DATE,/O was/O one/O of/O Gates/O'/O first/O hires/O./O It/O's/O a/O passing/O of/O the/O torch/O for/O Gates/O who/O has/O always/O been/O the/O largest/O single/O owner/O of/ O his/O company/O's/O stock/O./O Gates/O now/O spends/O his/O time/O and/O personal/O fortune/ O helping/O run/O the/O Bill/ORGANIZATION &/ORGANIZATION Melinda/ORGANIZATION Gates/ ORGANIZATION foundation/O./O The/O foundation/O has/O spent/O \$/MONEY28.3/MONEY billion/ MONEY fighting/O hunger/O and/O poverty/O since/O its/O inception/O back/O in/O 1997/DATE./O

Textual Entailment Features for Machine Translation Evaluation

HYP: The virus did not infect anybody.

entailment

REF: No one was infected by the virus.



References

- Efraim Turban, Ramesh Sharda, Dursun Delen, Decision Support and Business Intelligence Systems, Ninth Edition, 2011, Pearson.
- Jiawei Han and Micheline Kamber, Data Mining: Concepts and Techniques,
 Second Edition, 2006, Elsevier
- Michael W. Berry and Jacob Kogan, Text Mining: Applications and Theory,
 2010, Wiley
- Guandong Xu, Yanchun Zhang, Lin Li, Web Mining and Social Networking:
 Techniques and Applications, 2011, Springer
- Matthew A. Russell, Mining the Social Web: Analyzing Data from Facebook, Twitter, LinkedIn, and Other Social Media Sites, 2011, O'Reilly Media
- Bing Liu, Web Data Mining: Exploring Hyperlinks, Contents, and Usage Data, 2009, Springer
- Bruce Croft, Donald Metzler, and Trevor Strohman, Search Engines: Information Retrieval in Practice, 2008, Addison Wesley, http://www.search-engines-book.com/
- Text Mining, http://en.wikipedia.org/wiki/Text mining