



### Putting the Semantic In the Semantic Web An overview of UIMA and its role in Accelerating the Semantic Revolution

### Ontolog Forum, May 11, 2006

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### IBM

# **Opening Observations**

- Semantics are key to Knowledge Discovery in Unstructured Sources
  - Unstructured sources is where the action is
  - Keywords and Known-Item Search don't cut it
  - Need Richer Semantics
- Massive manual semantic annotation is <u>not</u> likely
  - A challenge for the Semantic Web vision
  - User View vs. Authors view

2

- Automated Annotation is Essential
- Many Component Annotators must emerge and combine
- The right enabler and the right expectations
  - Must enable rapid annotator development and integration
  - Applications can add value while tolerating less that perfect precision
  - Automation is necessary to tag and help humans reduce/focus content



# Overview

- Semantics Matters A Motivating Example
- UIMA: Facilitating Automatic Semantic Discovery
- Using Semantics to Raise the Search Bar
  - Finding the Sweet-Spot
  - Semantic Search and the SAW
  - Knowledge Extraction



# Semantic Match vs. Key Word Match

**SEARCH:** Going rate for leasing a billboard near Triborough Bridge



Top hits from popular search engines miss the mark...

Keywords may Match BUT **WRONG** Content returned And right content **MISSED** 

### **SEARCH:** Going rate for leasing a billboard near Triborough Bridge

Wired New York Forum - Long Island City Development "it's Right over The 59th Street Bridge." ... it's going to become our SoHo. The Powerhouse is most likely going to become a performing Arts facility for ... www.wirednewyork.com/forum/ printthread.php?t=5160&pp=50 - 150k - Supplemental Result - Cached - Similar pages

#### Long Island City Development [Archive] - Wired New York Forum

... Creek to the **Triborough Bridge** - would become an attractive destination. ... Several Long Island City sites are now in play - Junger himself's **going** ... www.wirednewyork.com/forum/ archive/index.php/t-5160.html - 255k -<u>Cached</u> - <u>Similar pages</u> [More results from www.wirednewyork.com]

#### [PDF] Austin's Wireless Future

File Format: PDF/Adobe Acrobat - <u>View as HTML</u> In Section 2 we explore the **near**-term future of wireless-- ubiquitous mobile ... applications such as the **Triborough**. **Bridge** installation, wireless sensors ... www.ic2.org/publications/AustinsWirelessFuture.pdf - <u>Similar pages</u>

#### [PDF] Funding of the High-Speed Rail System

File Format: PDF/Adobe Acrobat - <u>View as HTML</u> **Triborough Bridge**. and Tunnel. Authority\*\*. Oklahoma. Turnpike Authority ... management fees, reserves / on **going** TI's, and **leasing** commissions. ... www.cahighspeedrail.ca.gov/plan/pdf/Financial\_Plan.pdf - <u>Similar pages</u>

#### The rail magazine for The computer age ...

Surprisingly, thanks to 9600 baud modems, lower **rates**, and automated access ... his previous positions included President, **Triborough Bridge** and tunnel ... www.railfan.net/railpix/text/ro\_1\_6.bt - Supplemental Result - <u>Similar pages</u>

#### Checklist 1989

Triborough Bridge and Tunnel Authority, selected procurement and contract ... Distribution of high school graduates and college-going rate, New York State. ... www.nysl.nysed.gov/edocs/education/check89.htm - 513k - <u>Cached</u> - <u>Similar pages</u>

#### [PDF] www.icc.utexas.edu/publications/AustinsWirelessFut...

File Format: PDF/Adobe Acrobat - <u>View as HTML</u> Supplemental Result - <u>Similar pages</u> "Going", "Bridge", "Rate", "Leasing", etc.

#### **But All Misses**

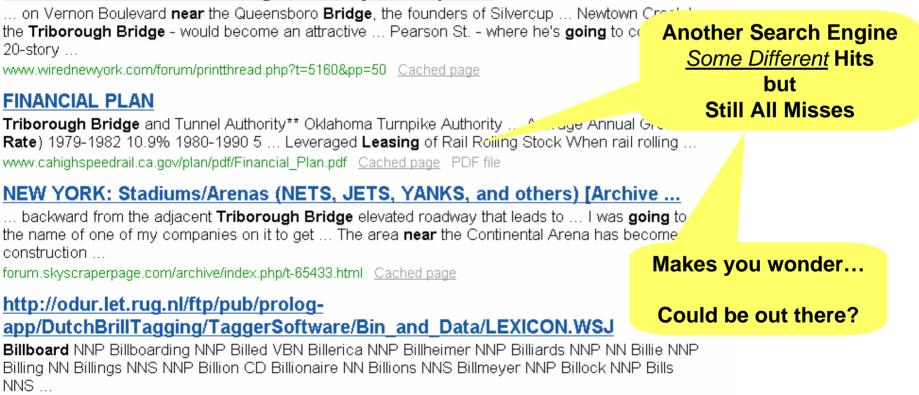
### **SEARCH:** Going rate for leasing a billboard near Triborough Bridge

\* Were you looking for <u>Going rate for leaving a billboard near Triborough</u>

#### Web Results

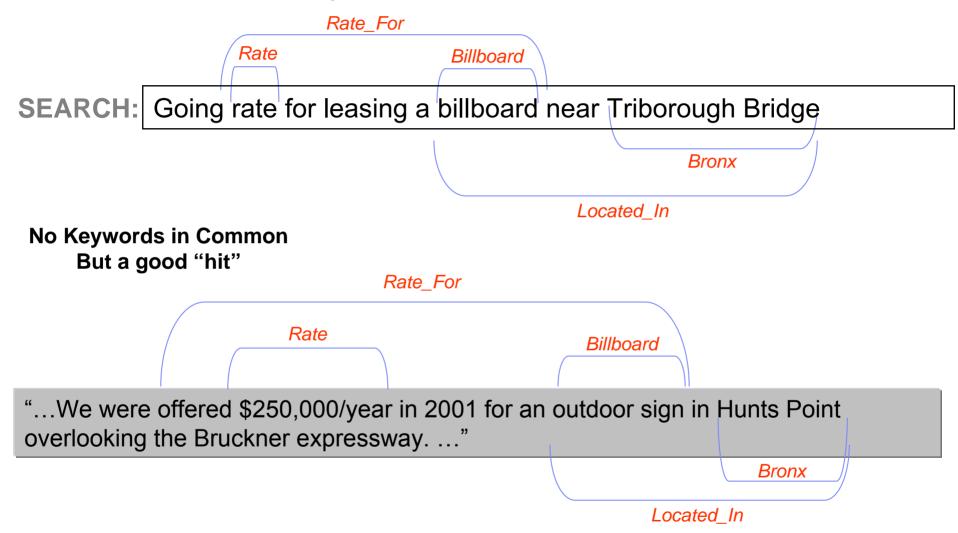
Page 1 of 4 results containing Going rate for leasing a billboard near Triborough Bridge (0.70 seconds)

#### Wired New York Forum - Long Island City Development



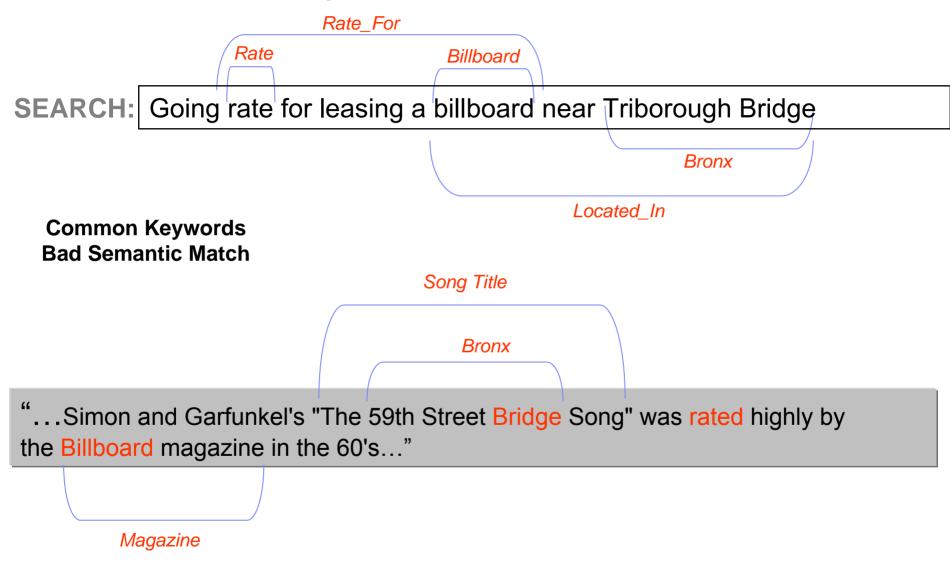
odur.let.rug.nl/ftp/pub/prolog-app/DutchBrillTagging/TaggerSoftware/Bin\_and\_Data/LEXICON.W... Cached page

### **Semantic Match Improves Recall**



8

# Semantic Match Improves Precision







# **UIMA** Overview

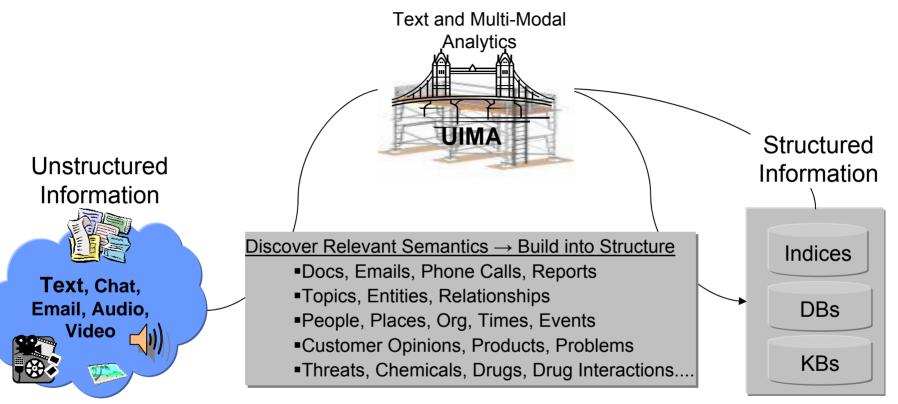
**Unstructured Information Management Architecture** 

# A open-source, pluggable framework for accelerating the science and business of semantic analysis



### IBM

# Analytics Bridge the Unstructured & Structured Worlds

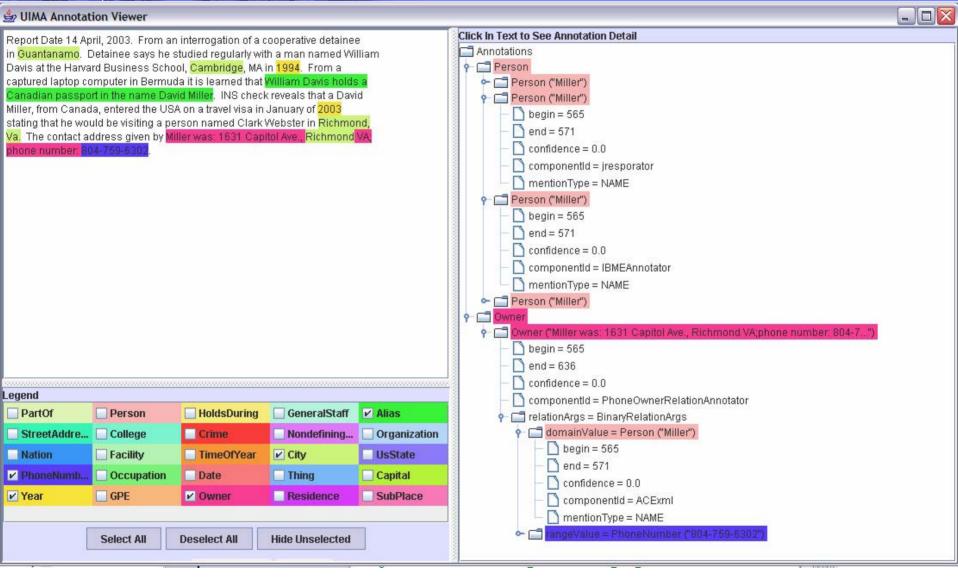


- High-Value
- Most Current
- Fastest Growing (80% of Corporate Data) ...BUT ...
- Buried in Huge Volumes (Noise)
- Implicit Semantics
- Inefficient Search

- Explicit Semantics
- Efficient Search
- Focused Content ...BUT...
- Slow Growing
- Narrow Coverage
- Less Current/Relevant







# Semantic Analytics: The Promise and the Challenge

<ul> <li>Independently developed</li> <li>From an increasing # of sources</li> </ul>	<ul><li>Different technologies &amp; interfaces</li><li>Highly specialized &amp; fine grained</li></ul>
Analysis Canabilities	Capability Specializations

Language, Speaker Identifiers	<ul> <li>Modality</li> </ul>
<ul> <li>Tokenizers</li> </ul>	<ul> <li>Human Language</li> </ul>
Part of Speech Detectors	Domain of Interest

The right analysis for the job will likely be a <u>best-of-breed</u>
 <u>combination</u> integrating across many dimensions.

<ul> <li>Relationship Detectors</li> </ul>	<ul> <li>Performance/Precision Tradeoffs</li> </ul>
<ul> <li>Classifiers</li> </ul>	

#### Over 200 IBM researchers across 6 WW labs with UIM as a Strategic Focus





### UIMA: <u>Unstructured Information Management Architecture</u> The Architecture

- Architecture for composing analytics that extract knowledge from unstructured sources & integrate results with structured information
  - Interfaces, Data Representation Schemes, Design Patterns

#### Principal Architectural Commitments

- Common representation scheme
- Common component engine interfaces (task and domain-independent)
- Common component metadata
- Pluggable Workflow and Transports
- Embeddable (can be layered on top of system middleware)

#### Independent of but interoperable with application specific

- Data models
- Algorithms
- Language-level or domain-level concepts or tools
- Workflows or workflow engines
- Transports (e.g., SOAP, Vinci)
- Back-end Systems (DB, Search Engine, KB Interfaces)



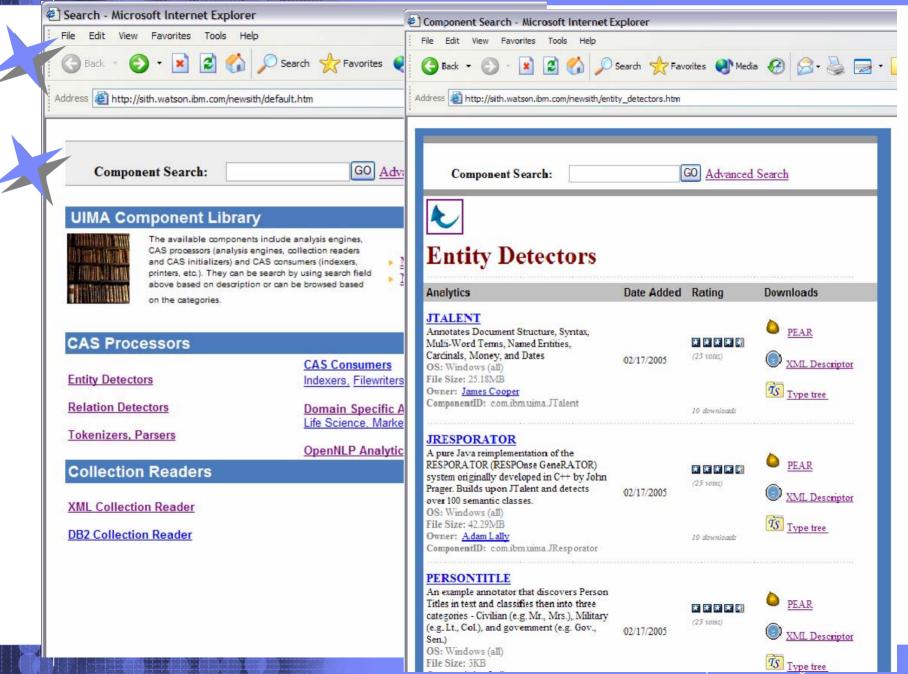
# **UIMA: The Software**

- Supports UIMA-compliant development, composition & deployment
- Java Framework Implementation
  - Components in other languages (e.g., C++, PERL, PYTHON)
  - Support for co-located and service-oriented deployments
    - Just change XML Descriptor
    - Balances performance and flexibility
    - Support for C++ co-Located Aggregates for high-performance communication
  - High-Performances APIs to common data representation (CAS)

#### Where to Get It

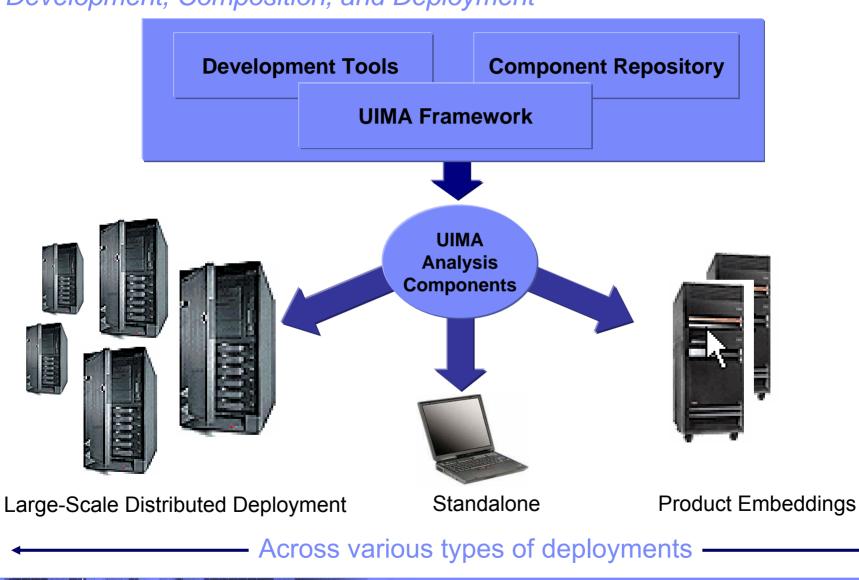
- Software Development Kit (SDK) Freely Available from IBM alphaWorks
  - <u>http://www.ibm.com/research/uima</u>
  - <u>http://www.alphaworks.ibm.com/tech/uima</u>
  - Stand-alone Java Install
  - C++ Enablement Layer
  - Tutorial and Development-Level Utilities and Tooling
  - "Semantic Search" Engine and Indexer
- Core Software Framework Open-Source on Source Forge
  - <u>http://uima-framework.sourceforge.net/</u>
- Emerging Component Community at CMU
  - <u>http://uima.lti.cs.cmu.edu/index.html</u>

#### UIMA | IBM Research





### Common Infrastructure Development, Composition, and Deployment







# **Architecture Highlights**

Common Representations, Interfaces and Design Patterns

## How it works



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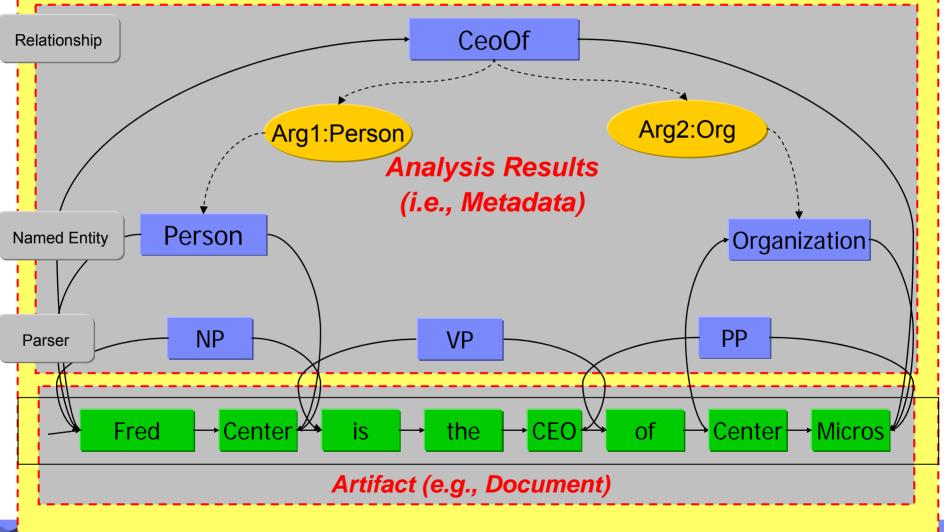
#### UIMA | IBM Research

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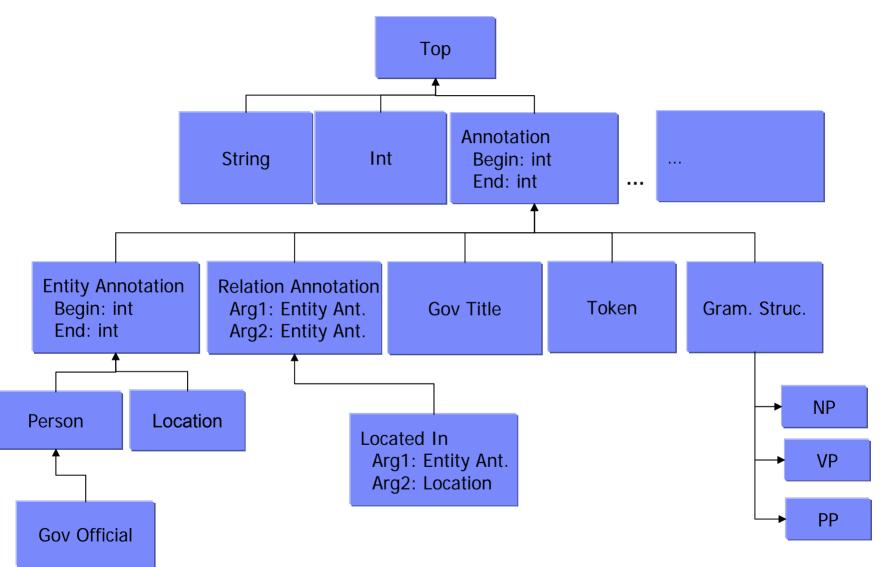


UIMA's Basic Building Blocks are **Annotators.** They iterate over an artifact to discover new types based on existing ones and update the **Common Analysis Structure (CAS)** for upstream processing.

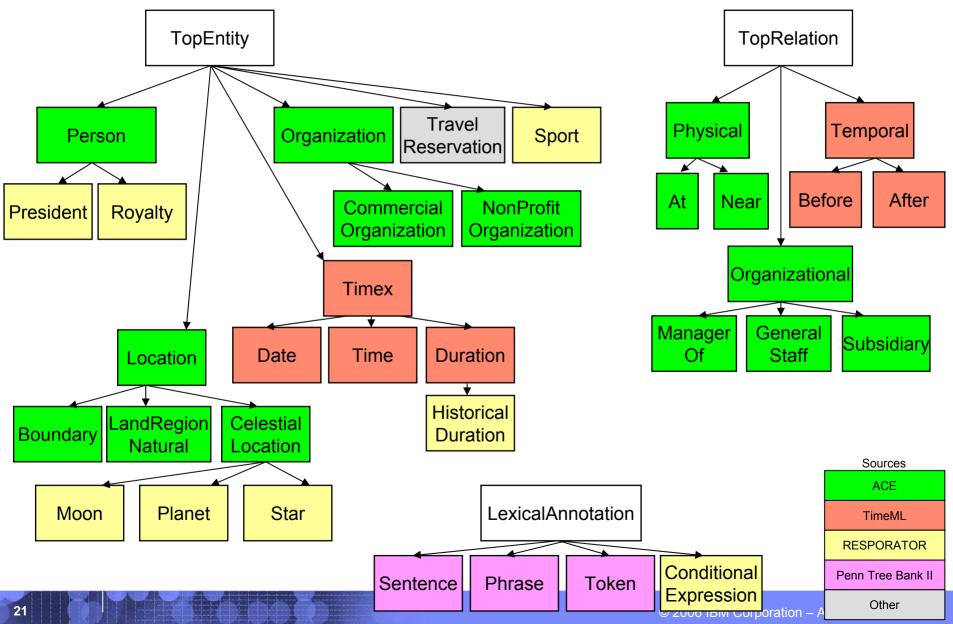


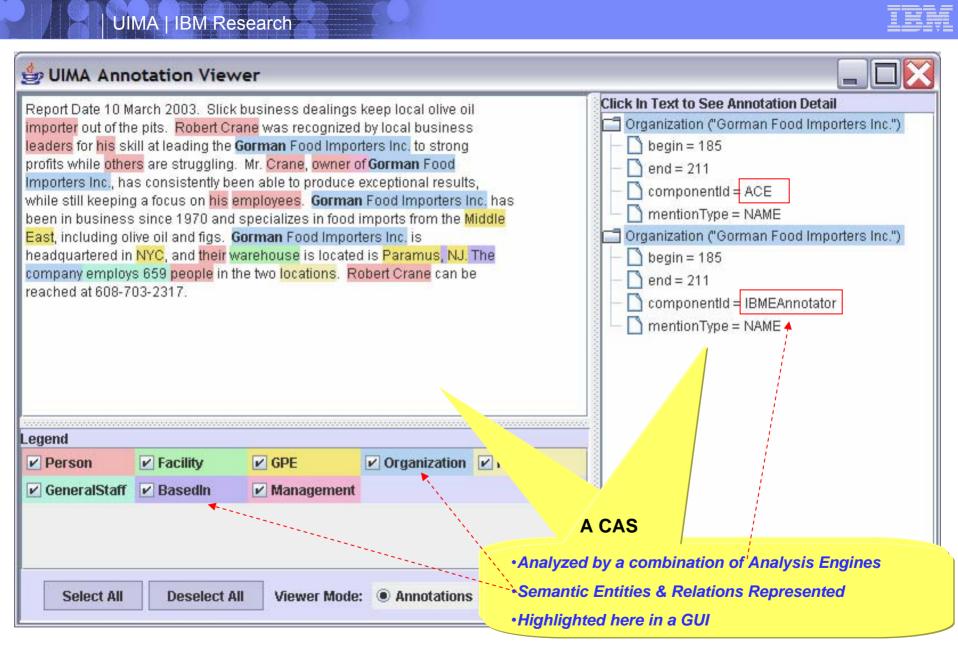


#### Sample Type System

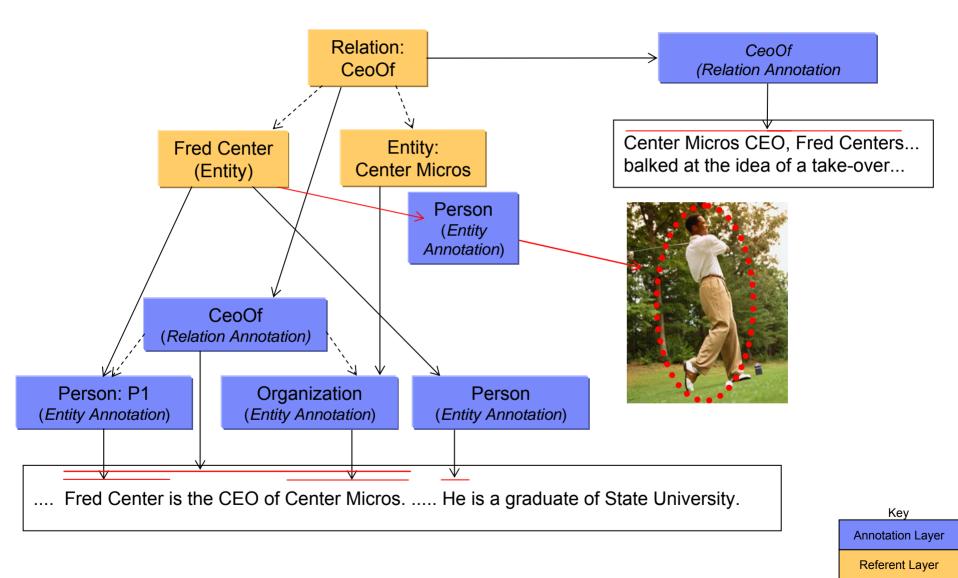


### Partial HUTT Type System (254 concepts in total)





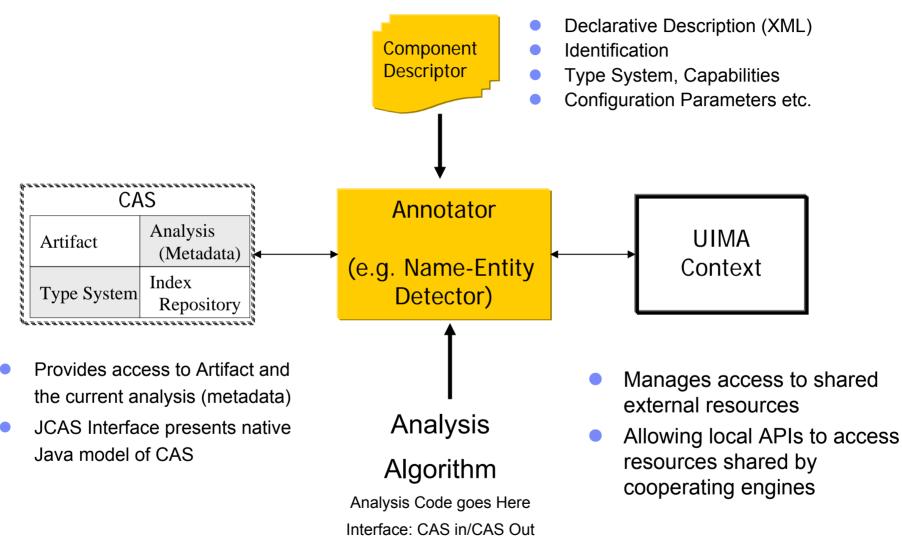
# **Annotations and Referents**





#### UIMA | IBM Research

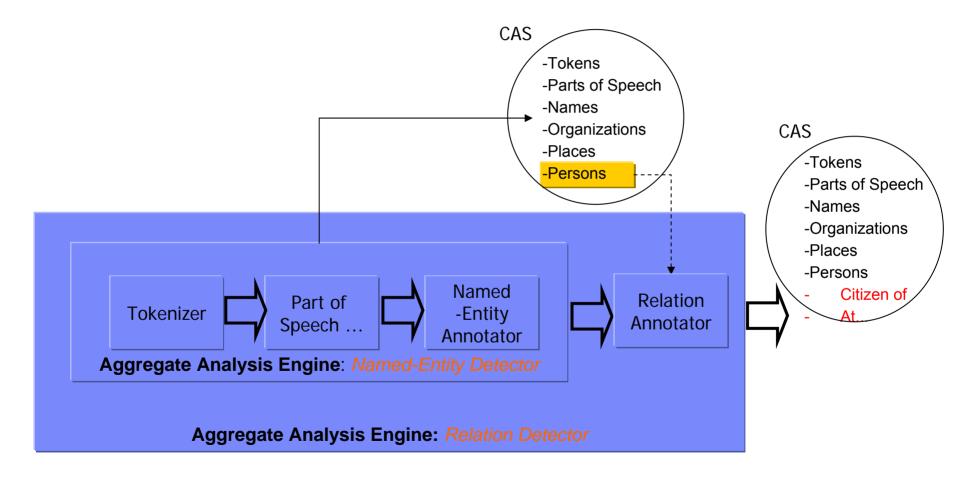
# The Basic UIMA Component Interfaces



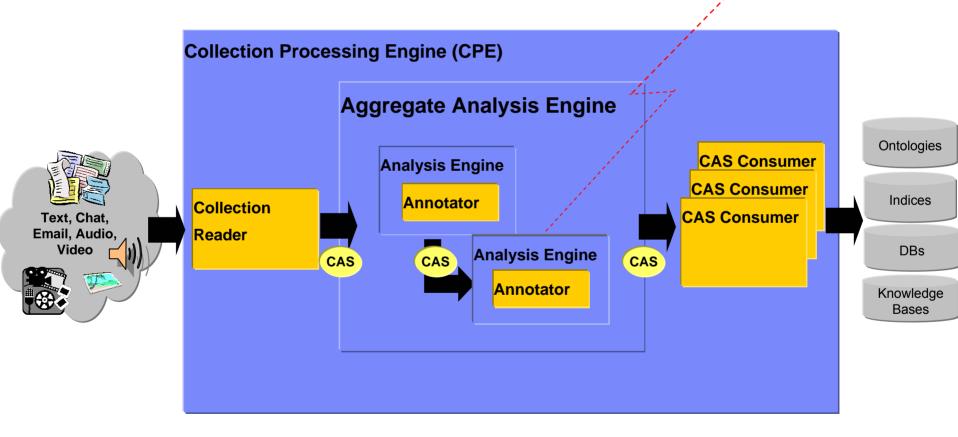
#### UIMA | IBM Research

**Document Analysis** 

The UIMA framework allows the developer to <u>compose</u> & <u>encapsulate</u> a set of engines as a single **aggregate** component, insulating applications or users from its implementation details/complexities – Promoting Reuse.

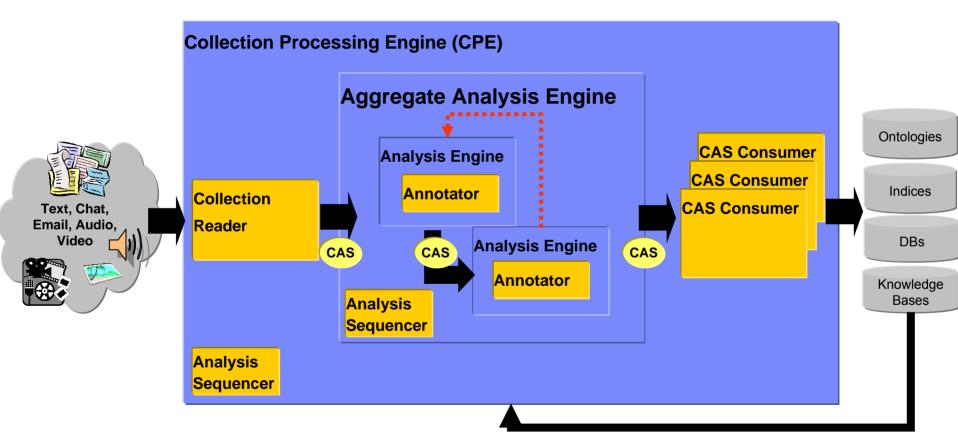


### Collection Processing Engines: Aggregate Analytic Components From "Source to Sink"



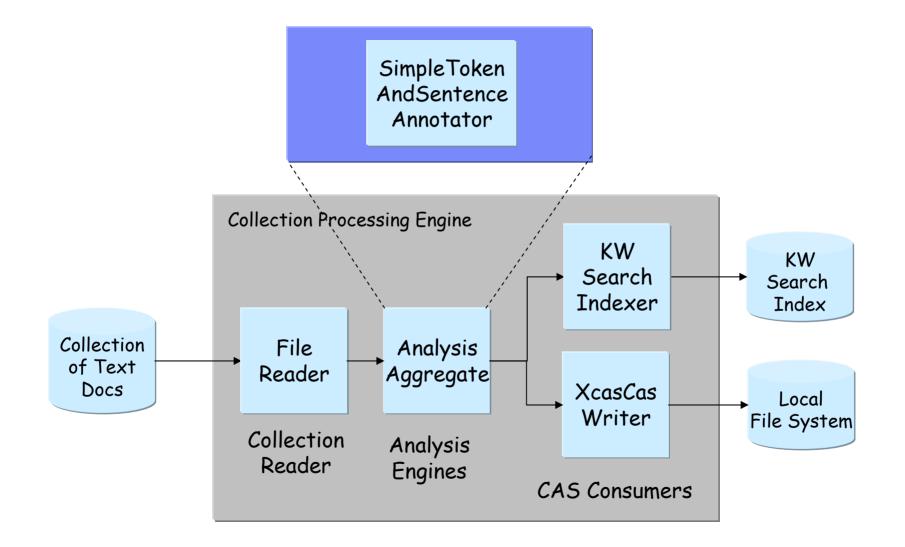


# User Definable Workflow (3Q 2006)



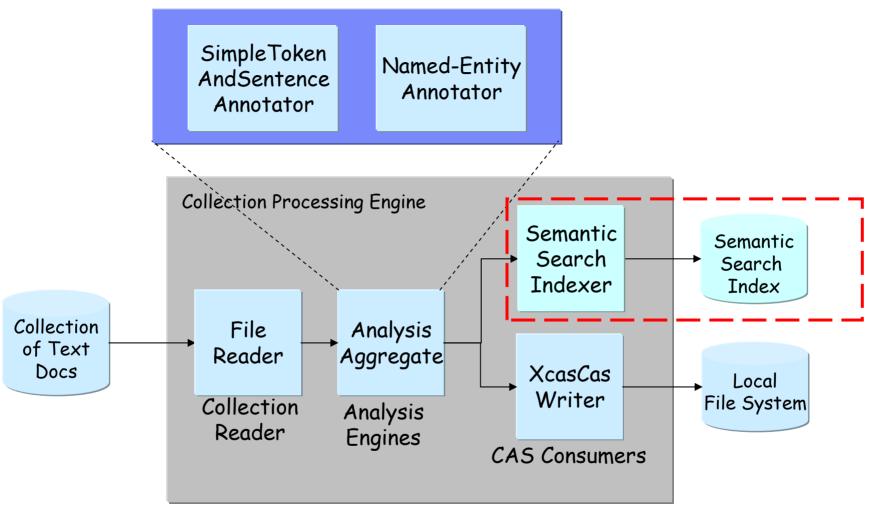


# **CPE for Keyword Search**





### **CPE for Semantic Search**





We index and search over tokens AND the semantics annotations from UIMA

"first" is an ambiguous term so is "center"

We are looking for these terms with particular semantics possibley detected by the UIMA analytics

"first" as it appears in the name of an organization

The JuruXML Query Language Exploits the results of Analysic

KeyWord Query: Semantic Search Query: Semantic Search Query: "first"
 <organization> first </organization>
 <ceo\_of> <person> Center </person> </ceo\_of>

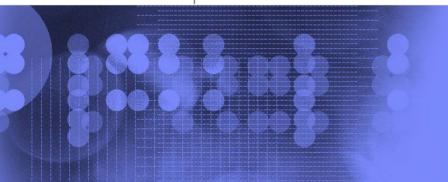
"Center" appearing in a name of a person who is the ceo of something





# Raising the Search Bar

### From matching keywords to gathering knowledge



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# From Finding Documents to Gathering Knowledge

#### Known-Item Search

- Problem
  - Find the items (e.g., documents) that individually contain some combination of keywords
- Operating Assumptions
  - User assumed that exactly what he/she wants is there in a document
  - There is one specific item out there that best solves information need
  - Native artifact boundaries are rigid
  - Contents = Used Words
  - User provides contained key words or phrases
- Magic: Ranking

#### Knowledge Gathering and Synthesis

- Problem
  - Produce an *efficient* collection of knowledge that is relevant to information need
- Operating Assumptions
  - Multiple items at varying grains together will solve information need
  - Artifact boundaries are permeable
  - Contents ~ Knowledge
  - User provides a conceptual space of interest (possibly using words or phrases)
- Magic: Semantic Matching

# **Raising the Search Bar**

#### Exploit Semantic Analysis

- Tolerate less-than-perfect analytics
- Use to Eliminate Noise and Focus Content
- Degrade gracefully toward key-word search

#### • The more in the query the better the results should be

- Web-Search conditions users to ~ 2 key words
- Recall drops off dramatically
- The more users type the less they know about the desired artifact & we punish them for it
- Encourage the user to fully describe their information need in their terms

#### Predictive Query Interpretation and Refinement

- Should be clear on how to modify a query to direct results
- Throttle Precision and Recall
- Cross Artifact Boundaries
  - The best solution is not always the single-based document
- Identify the best Grain (relates to Density)
  - Document, Passage, Entity, Fact, Set of...





# Finding the Sweet-Spot

# Using an Ontology and an interactive dialog to elicit priorities and select or focus the content



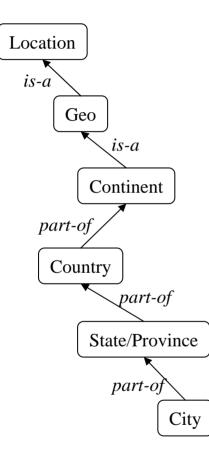
### IBM

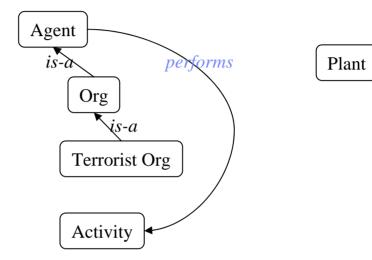
# The QA-Cube

- Produces conceptual dimensions present in a scenario
  - Each represented by a concept taxonomy
- Interacts with user to elicit relative priories
  - Where the user needs to be most specific and
  - Where he is willing to relax the requirements
- Evaluate or Generate Focused Corpora
  - Less Noise, More Relevant
  - Worthy of Deeper Analysis/Exploration



# **Example Base Ontology**





#### UIMA | IBM Research

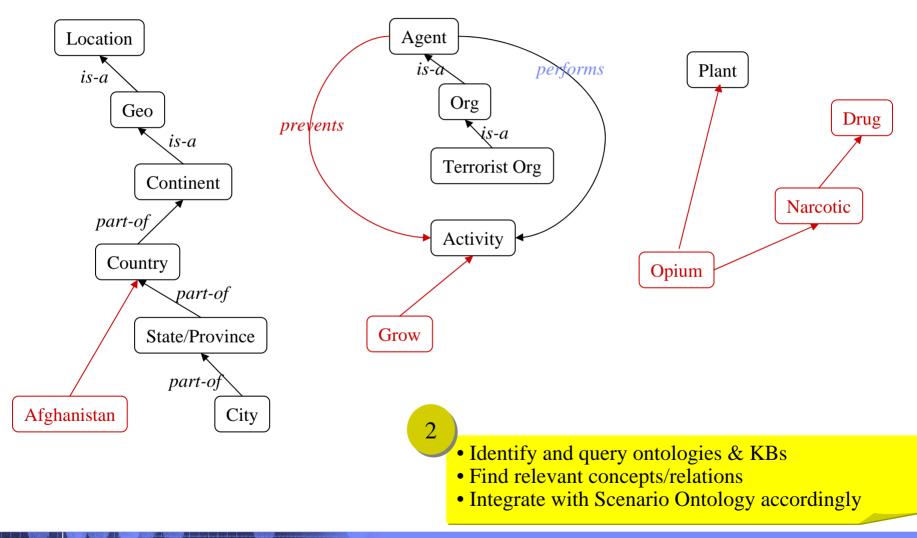
NLP on scenario text

(e.g., Topic, NE Detection)

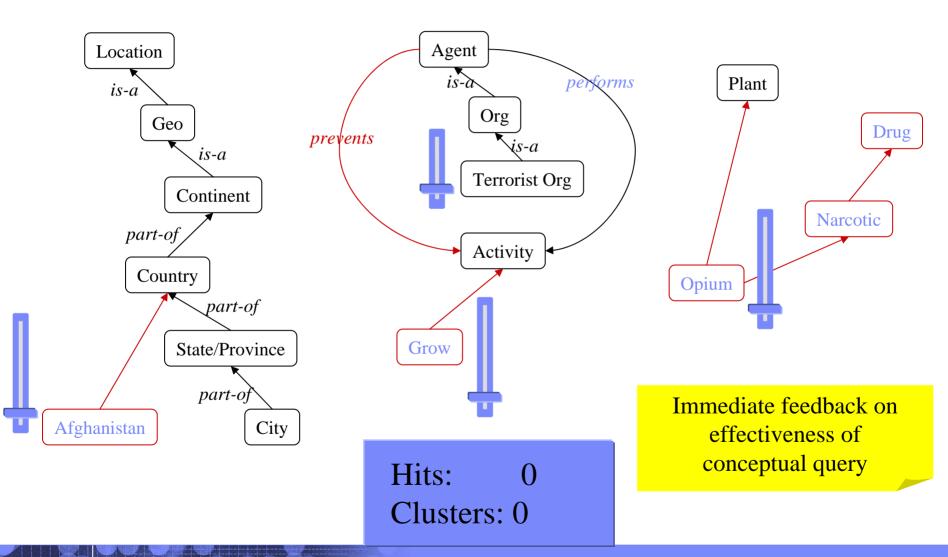


### **Scenario Ontology Expansion**

### "....explore the prevention of opium growing in Afghanistan..."

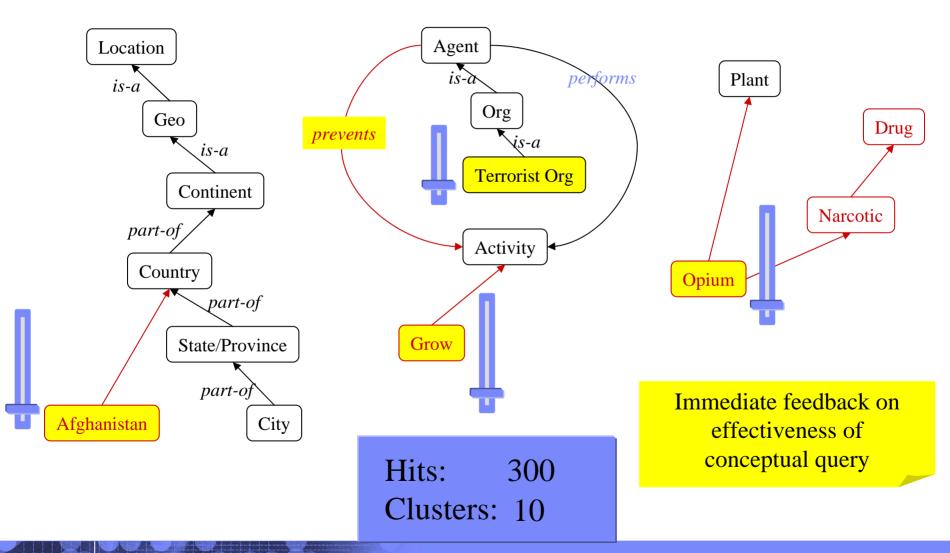


### Selects key dimensions in QA Cube



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# Find the Sweet Spot

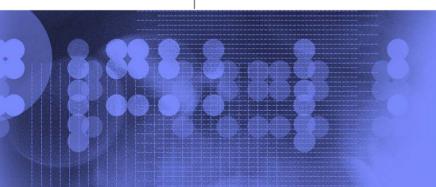






# Semantic Search and Analysis Workbench

#### Exploiting Task Ontologies & Automatically Discovered Semantics to Improve Search Quality





Semantic Search

Broadly Defined...

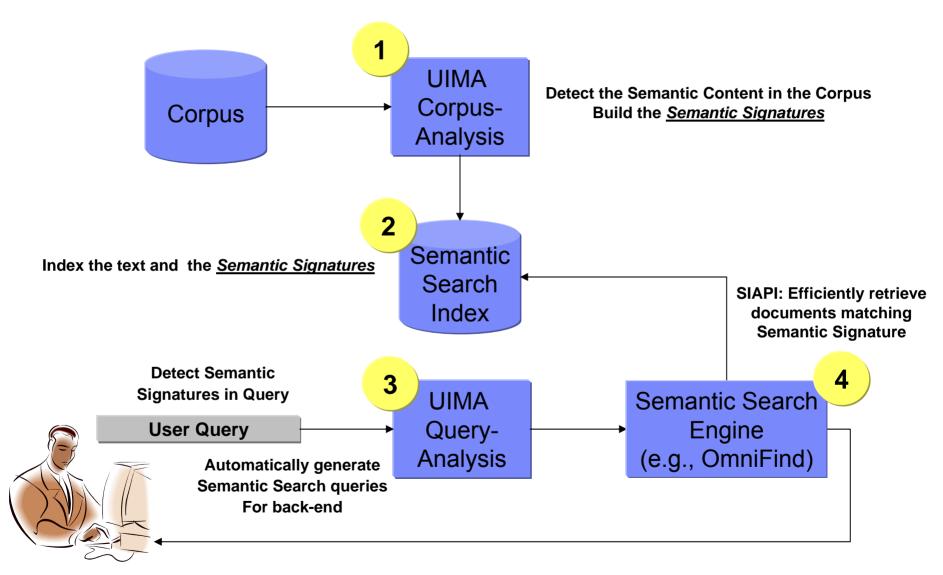
# An extension of search that exploits semantic analysis to improve precision, recall, and density.

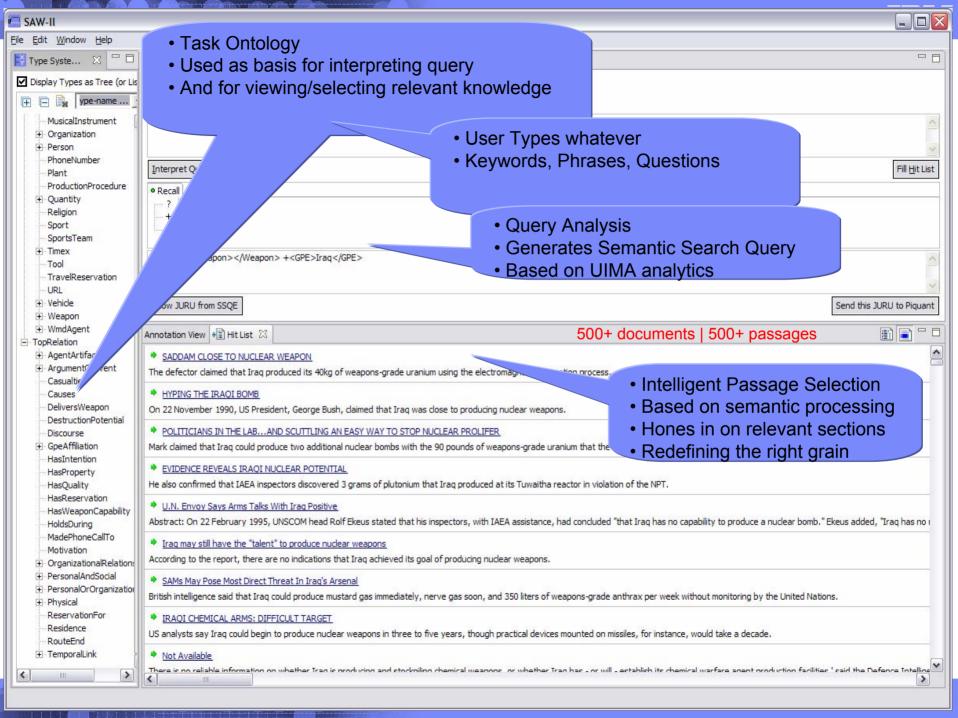
### The SAW: A Tool for Knowledge Gathering and Synthesis

- Beyond Keyword Search
- Ontologies
- Automatically Discovered Semantics
- Throttle Precision and Recall
- Toward Knowledge Gathering and Synthesis



#### **The Semantic Search 4-Step Program**





SAW-II			
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🕀 🖻 🙀 ype-name 🛉	O Entity and Fact O Semantic, Natural-Language, and Keyword		
GpeAdjective	What weapons does Iraq produce?	<u> </u>	
- Language Machine			
Measurement	Document detail	Fill <u>Hit</u> List	
MedicalCondition			
Medicine     MentalState	Reveals task-relevant concepts and relations		
MiscellaneousEntity	Easy to zoom in on key content based on semantic analysis		
MusicalInstrument	• Can highlight answers, concepts, passages or facts	, , , , , , , , , , , , , , , , , , ,	
PhoneNumber	Can also track source of annotation		
ProductionProcedure			
Quantity	Show JURU from SSQE	Send this JURU to Piquant	
SportsTeam	Annotation View / Nuc_13094_n9105855.txt 🛛 Hit List		
Timex     Tool	US BELIEVES IRAQ HAS BUILT	Click In Text to See Annotation Detail	
TravelReservation	MAGNETIC ISOTOPE ENRICHMENT PLANT.	ProducesWeapon	
URL + Vehicle	Abstract: In June 1990, US experts briefed an Iraqi nuclear official who defected from	🕈 🗂 ProducesWeapon ("Iraq produced 40kg of weapons-grade uraniur	
Weapon	Iraq. The US experts now believe that Iraq has at least one secret calutron uranium enrichment facility. US satellite photos taken several months ago may reveal calutron equipment. Since 1988, Iraq has been	— 🗋 begin = 1876	
WmdAgent     TopRelation	importing gas centrifuge uranium enrichment equipment from several western countries. In 1990, the US	- C end = 1919	
	Department of Commerce blocked the sale to Iraq of vacuum diffusion pumps from CVC, a US company in NY, after US Customs determined that the pumps could be used in Iraq's centrifuge program. US officials	- Contidence = 0.0	
ArgumentOfEvent	now believe the pumps were intended for Iraq's calutron program. In the late 1980's, another US firm	Componentia – Kakeration Detector     TetationArgs – BinaryBelationArgs	
Casualties Causes	exported to Iraq \$1.2 million worth of 5-ampere, 40 to 45 kilovolt electrical generators, claimed to be for	← [_] domainValue = GPE ("Iraq")	
DeliversWeapon	induction welding. US officials now believe that Iraq imported the generators for use as calutron power supplies. The generating equipment does not fall under dual-use technology US export control laws.	🗢 🗂 rangeValue = NuclearWeaponAgent ("weapons-grade uran	
- DestructionPotential	Export and import of centrifuge-related dual use technology is strictly controlled by US export laws, while		
	calutron-related equipment is not controlled. In 1949, the US declassified calutron equipment. Calutron equipment is not on the Zangger "trigger list," or the Nuclear Suppliers Group commodity control list. The		
HasIntention	Iraqi defector claims that Iraq produced 40kg of weapons-grade uranium from its calutrons, but US		
HasProperty HasQuality	officials believe that Iraq only produced 1 to 5kg. In late 1990, press reports in the US claimed that		
HasReservation	Saddam Hussein had constructed centrifuge plants, <mark>uranium hexafluoride</mark> conversion facilities, a <mark>uranium</mark> mine, and an underground <mark>plutonium</mark> production reactor, all located in northern lrag. US officials have not		
HasWeaponCapability HoldsDuring	confirmed these press reports. A calutron plant may be located near a hydroelectric power station in		
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	What weapons does Iraq produce?       • Query analysis exploits relations         • 49 results (rather than 500) use highly relevant relation		
Plant	Can combine Precision-Oriented and Recall-Oriented		
ProductionProcedure	Recall • Precision		
⊡ Quantity — Religion — Sport — SportsTeam — Tarana	→ + ProducesWeapon   + Weapon   + GPE   +Iraq		
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⊕ WmdAgent	Annotation View 📲 Hit List 🛛 49 documents   88 passages 📓 🖬 🗖		
TopRelation     AgentArtifact			
ArgumentOfEvent     Casualties	US BELIEVES IRAQ HAS BUILT MAGNETIC ISOTOPE ENRICHMENT PLANT The Iraqi defector claims that Iraq produced 40kg of weapons-grade uranium from its calutrons, but US officials believe that Iraq only produced 1 to 5kg.		
Causes	BUSH ORDERED AID TO IRAOI MILITARY		
DeliversWeapon DestructionPotential	Cyber 910B-400 workstation - to Huteen General Establishment, which was listed by the CIA as a bad end-user and was shown by the IAEA to be a main nuclear weapons design plant in Iraq.		
Discourse	POLITICIANS IN THE LABAND SCUTTLING AN EASY WAY TO STOP NUCLEAR PROLIFER		
<u> </u>	An Iraqi defector told US officials that Iraq produced almost 90 pounds of weapons-grade uranium in a secret uranium enrichment plant.		
HasIntention HasProperty	Does Irag Have The Bomb?		
HasQuality	The IAEA identifies these and other tools as "relevant to the production of gas ultra centrifuges, which Iraq intended to use to enrich uranium to weapons grade." Al-Rabiya is an Iraqi weapons plant, which or		
HasWeaponCapability	UN Inspectors Head For Baghdad		
HoldsDuring	Abstract: On 27 September 1993, a UN weapons inspection team of more than 50 inspectors, the largest such team thus far, left for Iraq to conduct inspections of Iraqi weapons facilities and to provide inform		
MadePhoneCallTo Motivation	UN AIDES SAY IRAQ MAY BE CONCEALING NUCLEAR MATERIAL		
OrganizationalRelation:	Paul L. Leventhal, president of the Nuclear Control Institute, said that US Administration officials had told him that he Iraqi defector claimed that Iraq produced 40 kilograms of weapons-grade uranium using m		
PersonalAndSocial     PersonalOrOrganization	Germany Says It Seeks To Curb Its Arms Exporters		
+ Personal Organization	It is also alleged that German companies built poison gas plants in Iraq as well as sold sophisticated equipment such as precision timers to the Iraqi military.		
ReservationFor	* Not Available		
Residence	The Iraqis had over two decades to develop these weapons.		
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	Annotation View I Hit List 🔀  US BELIEVES IRAO HAS BUILT MAGNETIC ISOTOPE ENRICHMENT PLANT The Iraqi defector claims that Iraq produced 40kg of weapons-grade uranium BUSH ORDERED AID TO IRAQI MILITARY Cyber 910B-400 workstation - to Huteen General Establishment, which was list	WindWeapon BiologicalWeapon ChemicalWeapon NuclearWeapon	Iraq.
Discourse     GpeAffiliation     HasIntention     HasProperty     HasQuality     HasReservation	POLITICIANS IN THE LABAND SCUTTLING AN EASY WAY TO STOP NUC An Iraqi defector told US officials that Iraq produced almost 90 pounds of we Does Iraq Have The Bomb? The IAEA identifies these and other tools as "relevant to the production of ga UN Inspectors Head For Badhdad	Enish Cancel	i weapons plant, which of
HasWeaponCapability HoldsDuring MadePhoneCallTo Motivation DrganizationalRelation:	Abstract: On 27 September 1993, a UN weapons inspection team of more that	an 50 inspectors, the largest such team thus far, left for Iraq to conduct inspections of Iraqi weapons facil ministration officials had told him that he Iraqi defector claimed that Iraq produced 40 kilograms of weapor	
PersonalOrOrganization     Physical     ReservationFor     Residence     RouteEnd     TemporalLink	<u>Not Available</u> The Iraqis had over two decades to develop these weapons. <u>Not Available</u>	l as sold sophisticated equipment such as precision timers to the Iraqi military.	rao's most important chan

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GpeAdjective	What weapons does Iraq produce?
Language	
Machine	
Measurement     MedicalCondition	Interpret Query
Medicine	
+ MentalState	Recall   Precision  Producesweapon
MiscellaneousEntity	+ ChemicalWeapon
MusicalInstrument	GPE   +Iraq
Organization	
Person     PhoneNumber	+ <producesweapon>+<chemicalweapon></chemicalweapon>+<gpe>Iraq </gpe></producesweapon>
Plant	
ProductionProcedure	
	Show JURU from SSQE
Religion	
Sport SportsTeam	Annotation View / Nuc_13094_n9105855.txt 📲 Hit List 🕱 1 document   1 passage
+ Timex	Germany Says It Seeks To Curb Its Area exponents
Tool	
TravelReservation	It is also alleged that German companies built poison gas plants n Iraq as well as sold sophisticated equipment such as precision timers to the raqi military.
URL	
Vehicle     Weapon	
+ WmdAgent	
- TopRelation	
+ AgentArtifact	
+ ArgumentOfEvent	
Casualties	
DestructionPotential	
Discourse	
GpeAffiliation	
HasIntention	
HasProperty	
HasQuality HasReservation	
HasWeaponCapability	
HoldsDuring	
MadePhoneCallTo	Zoomed in on single highly relevant document
Motivation	
OrganizationalRelation:	
PersonalAndSocial     PersonalOrOrganization	
PersonalOrOrganization     Physical	
ReservationFor	
Residence	

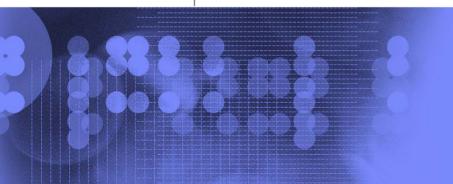
#### - 0 🗙 SAW-II File Edit Window Help - -📑 Type Syste... 🛛 🗖 🗖 New Query 1.ssq 🖾 Descriptive comment ✓ Display Types as Tree (or Lis O Entity and Fact O Semantic, Natural-Language, and Keyword 🕂 🗐 🗽 ype-name ... GpeAdjective What weapons does Irag produce? Language Machine + Measurement Interpret Query Fill Hit List MedicalCondition Medicine all • Precision + MentalState ProducesWeapon | MiscellaneousEntity + ChemicalWeapon | MusicalInstrument CDE | +Iran + Organization + Person +<ProducesWeapon>+<ChemicalWeapon></ChemicalWeapon>+<GPE>Irag </GPE></ProducesWeapon> PhoneNumber Plant ProductionProcedure Quantity Show JURU from SSQE Send this JURU to Piquant Religion Sport Annotation View / Msl 9146 m9100142.txt 💥 Hit List SportsTeam + Timex Click In Text to See Annotation Detail Germany Says It Seeks To Curb Its Arms Tool Annotations Exporters. TravelReservation - ChemicalWeaport Abstract: Germany has decided to seek new URL sanctions against illegal arms exporters and plans to create in the Office of Trade and Industry an export + Vehicle control office. Foreign Minister Hans-Dietrich Genscher called exporters "merchants of death." while ProducesWeapon ("poison gas plants in Iraq") + Weapon Economics Minister J?ergen Nollemann says he is determined to close "the last loopholes" in German 🗋 begin = 1186 + WmdAgent export laws. As the fifth largest arms exporter, Germany earns about 5% of its export earning from the sale of - TopRelation and = 1211 weapons abroad. Israel in fact accused Germany of "almost criminal laxity" in its export policies after being + AgentArtifact confidence = 0.0 struck with Iragi Sead missiles which, it is alleged, had been improved and their range extended by German + ArgumentOfEvent cornegnies. It is also alleged that German companies built poison gas plants in Irag as well as sold Consideration = KSRelationDetector Casualties some bis to the least of the second relationArgs = BinaryRelationArgs Causes violators of UN sanctions on trade with Iraq will be imprisoned for a minimum of one year, an increase from Image: Comparison of the second se DeliversWeapon six months, with 10-year maximum sen man companies are under investigation on 🔶 🗂 rangeValue = ChemicalWeapon ("poison gas") DestructionPotential suspicion of violating the export laws. . Discourse + GpeAffiliation HasIntention HasProperty HasQuality HasReservation HasWeaponCapability HoldsDuring MadePhoneCallTo egend Motivation . HoldsDuring At BasedIn NatoNation EuNation + OrganizationalRelation: + PersonalAndSocial AxisOfEvilNati... MuslimNation Nation GPE Language + PersonalOrOrganization Location GeographicEnt... Facility MilitaryOrgani... Organization + Physical \* - D-Nandafinin aDala Dua ReservationFor Residence Select All **Deselect All** Hide Unselected < > 1111





### **Knowledge Extraction and Integration**

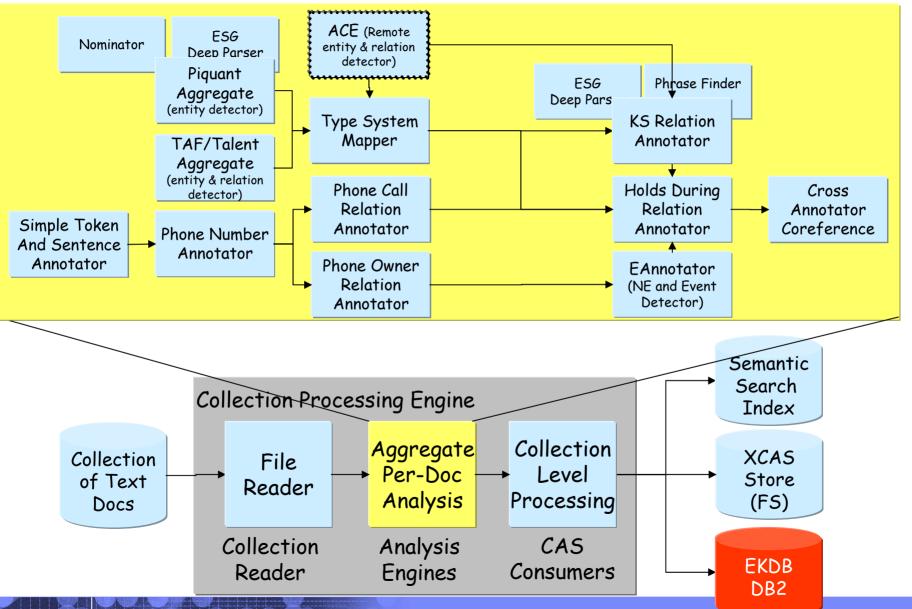
# Assisting the Transformation from Text to Formal Knowledge

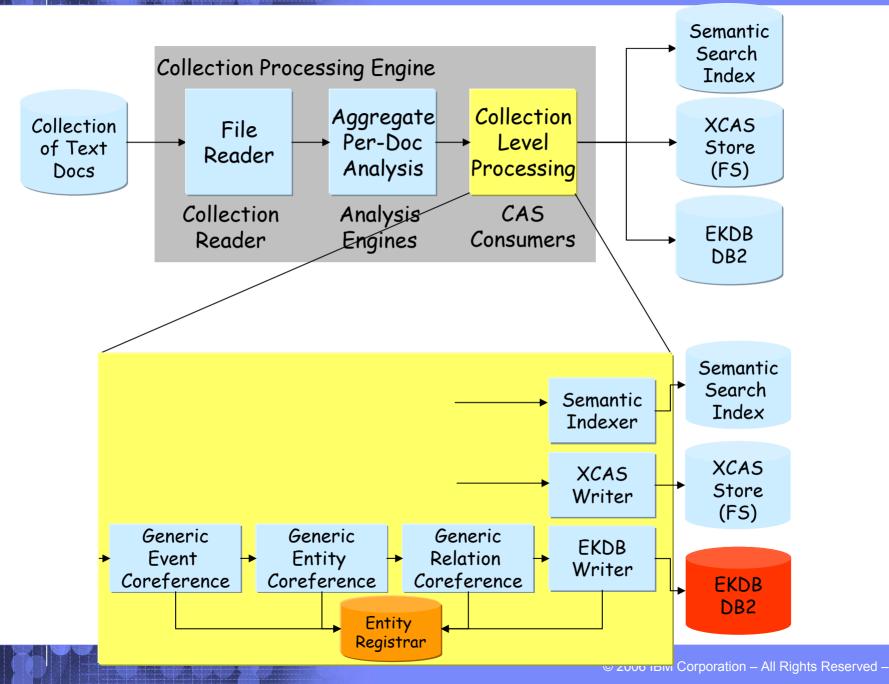


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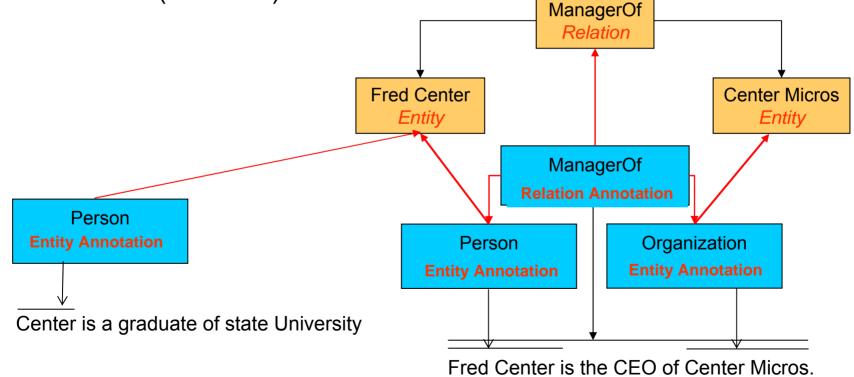




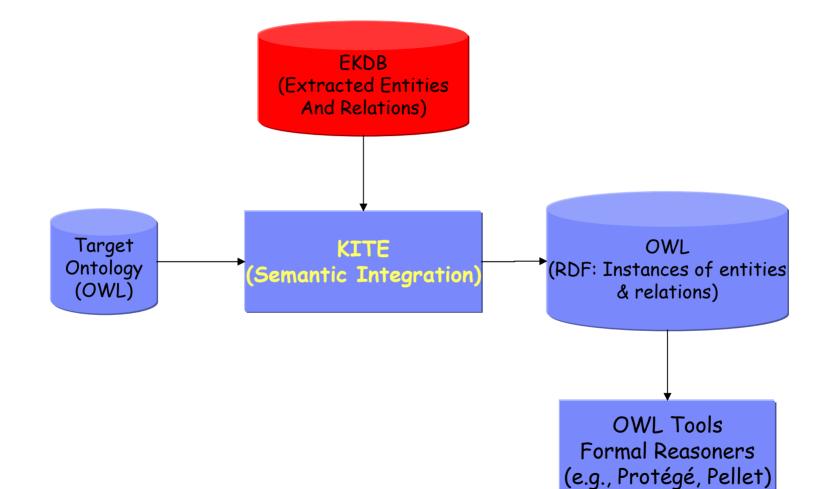
The Knowledge-Level Type (KLT) System imposes essential ontological distinctions on linguistic analysis results

The transformation of analysis results into formal knowledge...

Requires analysis engines to distinguish between entity annotations, relation annotations, mentions of individuals and the individuals themselves (referents).



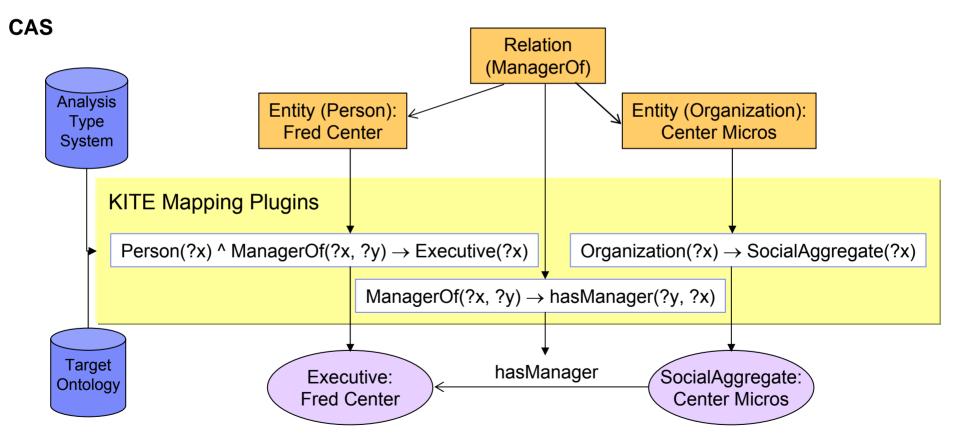


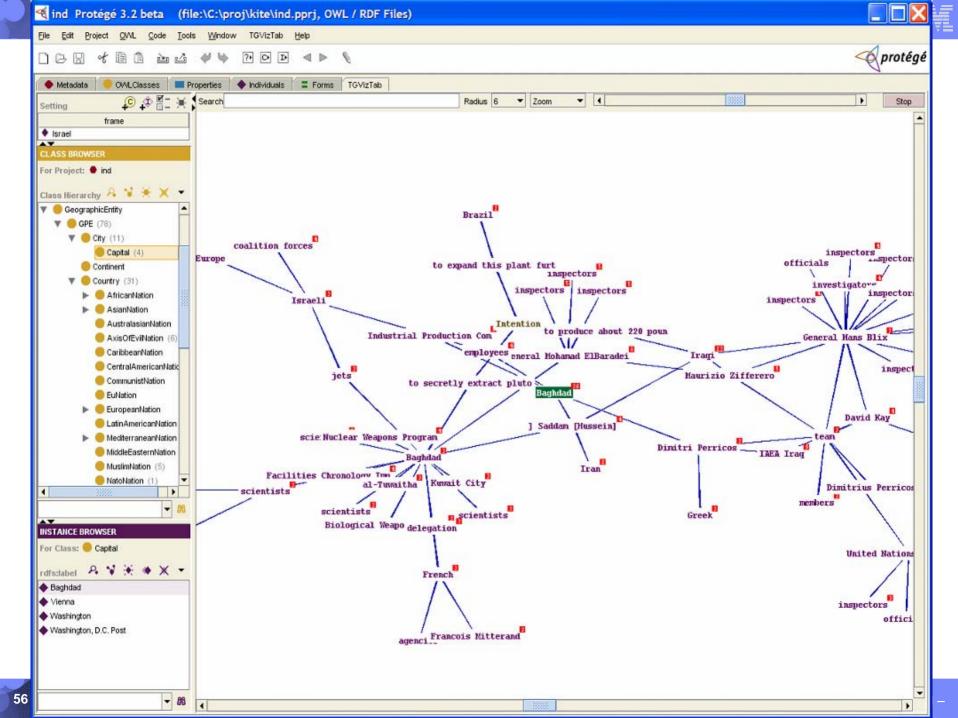




#### **Knowledge Integration and Transformation Engine**

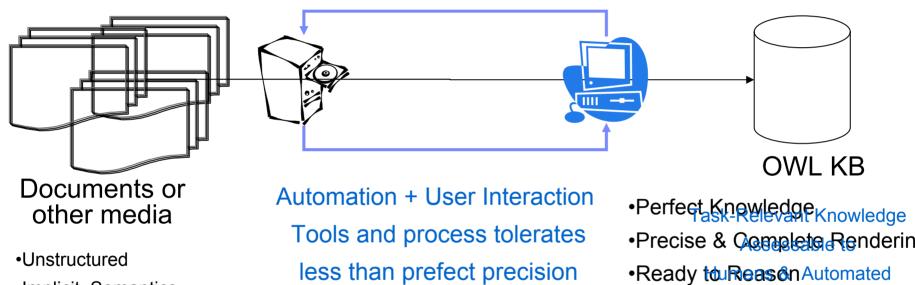
The transformation of analysis results into formal knowledge requires the explicit mapping of types in the type system to classes and properties in the ontology.





# Automated Knowledge Acquisition

### ...Not Gonna Happen...



Implicit Semantics

- Ambiguous
- Imprecise
- Incomplete
- Inconsistent
- Partially relevant

to produce candidate task-relevant knowledge

 Precise & Complete Rendering Reasoners





# Thank You



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### Query Analysis: Simple Answer Type Insertion

#### Want User to Type these....

#### What is Webster's Phone Number

- Webster's Phone Number

- Where is Smith?
  - Smith's Place
  - ...

#### The System to Generate These....

- +Webster phone number
- +<PhoneNumber> </PhoneNumber>

#### +Smith

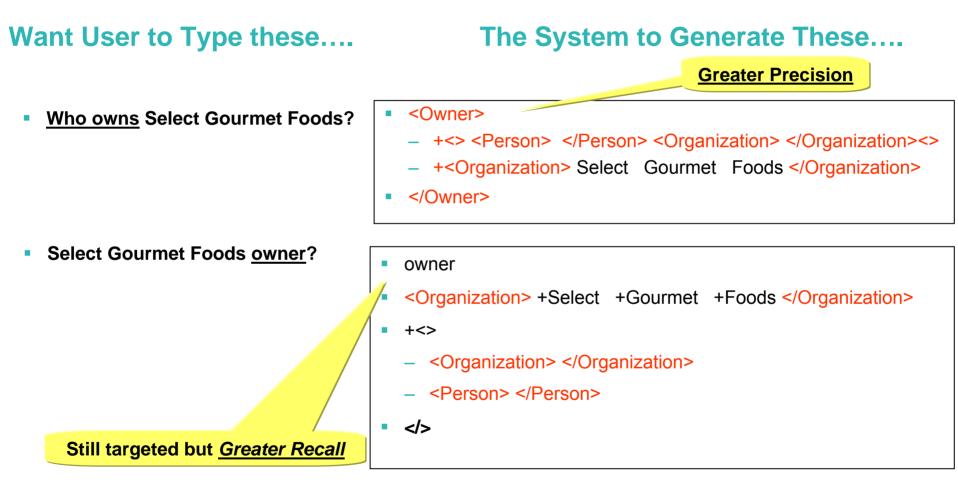
<Location> </Location>

#### +Smith place

<Location> </Location>



### Query Analysis: Exploiting Relation Detection



# UIMA Data Representation Alignment with Standards

#### CAS (Instances)

- Semantics: Object Graph
  - A stand-off representation leaves original artifact untouched
  - Expressivity allows multiple interpretations of artifacts, overlapping annotations
- XML Syntax: XMI (inherit open-source tooling: <u>http://www.eclipse.org/emf/</u>)
- <u>Inline XML</u> may be generated
- OWL RDF may be generated

#### CAS Type System (Schema)

- Semantics: Ecore/EMOF
- XML Syntax: XMI
- XML Schema for partial instance validation can be generated
- Java Classes for CAS Types can be generated

#### Component Metadata

- For Discovery, Reuse and Application-Level Plug-in-Play
- XML document declaratively capture identification, configuration, behavior and deployment information about UIMA components.
- Tools to create standard OSGi Bundles for painless application integration from servers to cell phones <u>http://www.aqute.biz/osgi.html</u>

#### Leverage open-source Eclipse/EMF Tooling

