

#### Semantic Search in Biomedical Science Content Applications for an NLP Engine

Martin Griffies| October 2010.





#### We have a problem Too much information, too little knowledge

- External data
  - Free : PubMed, ClinicalTrials.gov, Open Access journals, Espace, ..
  - Subscription journals, digests, secondary sources
  - WWW search results
  - News feeds, advertisements
  - Conferences
  - etc
- Internal data
  - •Structured: databases, tables, curated data
  - Unstructured reports, scanned documents.



# **The Evolving Challenge**



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#### The challenge of volume More is not necessarily better



- 20 million PubMed abstracts
- 500.000 USPTO applications / year

•PubChem: 72 million records / 28 m structures.







#### The challenge of Meaning The need for Semantics

Name: PAP		Type:	Protein   Lookup in DB	
Description: Si	milar Objects			23
Properties:		72 entit	ties have a name or alias starting with "PAP".	
Category	Name	Alias	Description	*
All Properties	PRPSAP1	PAP39	phosphoribosyl pyrophosphate synthetase-assoc	E
General Info	PRPSAP2	PAP41	phosphoribosyl pyrophosphate synthetase-assoc	
Alias	PAPA2	PAPA2	postaxial polydactyly, type A2	
Ariadne Ontology	MRPS30	PAP	mitochondrial ribosomal protein S30	
GenBank ID	PDAP1	PAP	PDGFA associated protein 1	
GO Biological Process	SLC35B3	PAPST2	solute carrier family 35, member B3	
GO Cellular Compone	METTL9	PAP1	methyltransferase like 9	
GOID	C10orf18	pap20	chromosome 10 open reading frame 18	
GO Molecular Functio	PAPD1	PAPD1	mitochondrial poly(A) polymerase	-
	i Use	entity selected in the lis	at ntities in the list)	

1700 synonyms for APAP

70+ entities named "PAP"



#### The Search for meaning 90% of Searches are Keyword-based



keyword			Advanced Language
	Google Search	I'm Feeling Lucky	

Who made the most creative video? See the YouTube Play shortlist.

• Retrieves documents, not facts.

• But facts / assertions / relationships are (usually) what users want.

•RELEVANCE is needed



#### **NLP Processing**

11940574:7 Because Axin2 Plas been shown to<sub>Main</sub> Associate with and inhibit beta-catenin abundance and function,<sub>Main</sub> we hypothesized that<sub>Main\_That</sub> Axin 2,4 which is affecting roliferation of MEF cell line NPmod can work in a negative feedback pathway<sub>Main</sub> Fregulating Wnt signaling and thu controlling apoptotic process<sub>VPmod</sub>.

Syntactic normalization:

- 1. Verbal conjunction
- 2. VP conjunctions
- 3. NP conjunctions
- 4. NP modifiers
- 5. VP modifiers
- 6. Some syntactic movements
- 7. NP prepositional structure
- 8. Relational clauses
- 9. Nominalizations

Decomposed primitive sentences (triplets):

Axin2	associate	beta-catenin abundance
Axin2	associate	beta-catenin function
Axin2	inhibit	beta-catenin abundance
Axin2	inhibit	beta-catenin function
Axin2	affect	MEF cell line proliferation
Axin2	work	negative feedback pathway
Axin2	regulate	Wnt signaling
Axin2	control	apoptotic process

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### **From Text to Relations**

"Axin binds beta-catenin and inhibits GSK-3beta activity in hepatocytes."

NLP: short statements (key facts in the form of triplets)

Axinbindsbeta-cateninAxininhibitsGSK-3beta activity

Extracting relations

Axin - beta-catenin, relation: Binding Axin -> GSK-3beta, relation: Regulation, effect: Negative



# Semantic Search System

- •Finds the right documents
- •Summarizes / precis findings
- •Can also answer natural language questions:
  - "what causes migraine?

Can be tailored for specific domains by adding *ontologies* 

- Brivaracetam inhibits spreading depression in rat neocortical slices in vitro.
   PubMed PubGet Margineanu DG, Klitgaard H Seizure (2009) Show Abstract »

   Epilepsy and migraine are episodic neurological disorders with marked co-morbidity, making migraine common among epileptic patients.
   Influence of MTHFR genotype on contingent negative variation and MRI abnormalities in migraine.
   PubMed PubGet Margineans Marginean
- Metoclopramide for migraine-associated hiccup.
   PubMed PubGet G
   Gupta VK
   Int J Clin Pract (2006) Show Abstract »
   Metoclopramide can swiftly control both hiccup and migraine headache.
- Chronic daily headache: when to suspect sinus disease.
   PubMed PubGet Headache
   Houser SM, Levine HL
   Curr Pain Headache Rep (2008) Show Abstract »
   Migraine may be responsible for many headaches thought to be caused by the sinuses.
- 5 📃 [Genetics of migraine]
  - PubMed PubGet 2 Evers S ... Ringelstein EB »
  - Nervenarzt (1996) Show Abstract »
  - This would lead to further clues to the pathogenesis underlying migraine and, thus, to therapeutic developments.
- 6 Alzheimer's disease and other neurological disorders.





# **Quertle - a Search Engine**



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#### Cartridges & Ontologies Flexibility & Domain Coverage

- Single engine, multiple domains
  - In-house dictionaries: canonical / preferred terms
  - Standard terminologies:
    - MeSH,
      GO,
      SNOMED,
      MedDRA etc
- Clinical, AE records,
- •Toxicology, Plants, Proteins,
- Competitive Intelligence

# **BMKS App – Semantic Search (Plants)**

¥.	Key Concepts		
	\$smallmol	ammonium	
	CA.	selenite	Search      S
		postin	
		pecun	Authors ?
	GA3	SIIICON	Journals ?
	C2H4	GA(4)	o da mais
	ABA	quinclorac	
	cytokinin	citric acid	
	FC	glyphosate	elationships (263) (?) 📾 Keyword Results (10,292) (?)
	BR	silver	Selected: 0. Expand All Relationships Turn Highlighting Off Sort by Date
	RS	Ca2+	
	methionine	haemin	
	BL	tryptophan	usicoccin- and IAA-induced elongation growth share the same pattern of K+ dependence.
	NaCl	ZEN	ubMed 🚡
	CO2	AA	ode K, Lüthen H
	catechin	CFM	Exp Bot (2001) Show Abstract »
	sterol	anthocyanin	ne potassium channel blocker tetraethylammonium (TEA) reversibly inhibited FC-induced growth.
	ETH	PAA	More Relationships
	benzyladenine	GA(14)	
	TIBA	SA	volvement of oxyradicals in promotion/inhibition of expansion growth in cucumber cotyledons.
	Kinetin		ubMed S
	Ozone		ataria S Guruprasad KN »
	oligosaccharides		dian J Exp Biol (2005) Show Abstract »
	H+		ytokinins reduced the level of oxyradicals in dark grown cotyledons, while promoting growth.
	lysine		More Relationships
	Cadmium		uxin Conjugation by Tobacco Mesonbyll Protonlasts : Correlations between Auxin Cytotoxicity under Low Density
	lanolin mixture		rowth Conditions and Induction of Conjugation Processes at High Density.
	.IA		ubMed 👔
	2 4-D		aboche M Leguay JJ »
	1-NAA		lant Physiol (1984) Show Abstract »
	Nat		ne induction of growth by 2,4-dichlorophenoxyacetic acid and picloram was not affected by cell density.
	octopine		More Relationships
	octopine		



#### BMKS Application – Translational Medicine

		Q proteins mutated in Alzheimers Search ?
	K S SEARCH	Authors     ?       Journals     ?
_		∞ ResNet Relations (155) ②
	Applied Filters ② None	Turn Highlighting Off
0	Filters Key Entities ? 12000006 12003066 14-3-3	→ StateChange: Alzheimer Disease -> CYP2D6 (mutation) Pharmacogenetics 11: 237-245. [CrossRef] [Medline] Tanaka S, Chen X, Xia Y, Kang DE, Matoh N, Sundsmo M, Thomas RG, Katzman R, Thal LJ, Trojanowski JQ, et al. (1998) Association of CYP2D microsatellite polymorphism with Lewy body variant of Alzheimer's disease. 16033950:10298; Organ: brain, Organism: Homo sapiens 3 More References »
	ABCA1 ADAM10	positive StateChange: Alzheimer Disease -> PPARG (mutation)     « Fewer References
	ADRB2 AHSG AKT1 ALB	<ul> <li>[1] Because both COX and PPARgamma expression are increased in Alzheimer brains (Kitamura et al., 1999), it is likely that at least some effects of ibuprofen on AD pathology are mediated through changes in the activities of these enzymes. 10908610:10199; Tissue: microglia</li> </ul>
	ALDH2 ALOX5 ALOX5AP APBA3	[2] It has been reported that the expression of cyclooxygenase-2 (COX-2) and peroxisome proliferator- activated receptor-gamma (PPARgamma) is elevated in Alzheimer's disease, and certain nonsteroidal anti- inflammatory drugs (NSAIDs) can reduce the risk and delay the onset of Alzheimer's disease. 15033806:3; CellLineName: PC 12
	APBB1 APBB3	<ul><li>[3] Alzheimer's disease is associated with elevated levels of Abeta, and enhanced expression of PPARgamma. 15993441:1;</li></ul>
	APOA4 APOA5 APOC1	[4] In addition, this polymorphic mutation in PPARgamma2 is associated with other aspects of human diseases, including cancers, polycystic ovary syndrome, Alzheimer disease and aging. 19390629:4; Tissue: fat, Organism: Homo sapiens



### Applicable Technology



MedScan

#### Examples of MedScan customization projects performed for customers:

- 1) Immunology: facts about cell types
- 2) Biomarkers: automatic classification of biomarkers
- 3) ClinicalTrials.gov: import of XML formatted clinical trial reports
- 4) Phosphosites: extraction of protein phosphorylation sites
- 5) Mutations: extraction of mutations linked to diseases



#### Use of Rules: Materials & Methods













# Project – ClinicalTrials.gov

CI http://ck	inicabials.gov/show/NCT00304044	* 4 × Googe	۹.
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🌮 🕸 🛄 Methotreate, Leucovorin, Ritualmati, and Highly.		· 位・日・	📾 * 🕑 Bage * 🔘 Tgals *
ClinicalTri	ials.gov	Home Search	Study Topics Glossary Search
Full Text View	Tabular View Contacts	and Locations    No. Sturty Results I	Posteil Related Stur
Methotre Therapy in	exate, Leucovorin, Ritu: n Treating Patients With Syster This study is curre	ximab, and Highly Active An AIDS-Related Primary Cen m Lymphoma ntly recruiting participants.	ntiretroviral ntral Nervous
Methotre Therapy i	exate, Leucovorin, Ritu: n Treating Patients With Syster This study is curre Vertied by National Can Sponsored by:	kimab, and Highly Active Ar h AIDS-Related Primary Cen m Lymphoma ntly recruiting participants, cer institute (NCI). December 2008 National Cancer Institute (NCI)	ntiretroviral Itral Nervous
Methotre Therapy in	axate, Leucovorin, Ritu: n Treating Patients With Syster This study is curre Verled by National Can Sponsored by: Information provided by:	kimab, and Highly Active Ar h AIDS-Related Primary Cen m Lymphoma ntly recruiting participants. cer huttute (NCI). December 2008 National Cancer Institute (NCI) National Cancer Institute (NCI)	ntiretroviral htral Nervous
Methotre Therapy ir	exate, Leucovorin, Ritu: n Treating Patients With Syster This study is curre Veriled by National Can Sponsored by: Information provided by: ClinicalTrials.gov Identifier:	kimab, and Highly Active Ar A IDS-Related Primary Cen m Lymphoma ntly recruiting participants. cer institute (NCI). December 2008 National Cancer Institute (NCI) National Cancer Institute (NCI) NCT00304044	ntiretroviral htral Nervouš

#### Data Components:

- Study
- Status
- Start
- Company
- Phase
- Primary Outcome

Use clinical trials data with Tox/Small molecule cartridge for abstract deduction.





# Information extracted by Clinical trial cartridge. Statistics from >85,000 XML files





### **Extracted fields:**

ClinicalTrials.gov			Home Sea	rch Study Topics Glossary Search
Full Text View Tabular View No Study Results Posted	Related Studies			
	A Trial Assessing I A \$3/273 in Moderate to Severe Stable C	bronic Obstructive Pulmonany Disease (COPD)		
	A mai Assessing LA334273 in Moderate to Severe Stable C	mone obstructive runnonary Disease (COPD)		
	This study has been con	mpleted.		
First Received: August 10, 2006 Last Updated: September 1, 2010 History of Changes				
	Sponsor:	Almirall, S.A.		
	Collaborator:	Forest Laboratories		
	Information provided by:	Almirall, S.A.		
	ClinicalTrials.gov Identifier:	NCT00363896		-
		* *		1
Purpose				
To evaluate the efficacy and safety of LAS 34273 compared to placebo in patien	its with moderate to severe COPD during one year of treatment.			
Condition	l Ir	ntervention (	Phase	
Chronic Obstructive Pulmonary Disease		iruo: Aclidinium bromide	Phase III	
Study Type: Interventional Study Design: Allocation: Randomized				
Control: Placebo Control Intervention Model: Parallel Assignment				
Masking: Double-Blind				
Official Title: Clinical Trial Assessing Efficacy and Safety of LAS34273 in Mod	ferate to Severe Stable Chronic Obstructive Pulmonary Disease (COPD) Patients			
Resource links provided by NLM:				
MedlinePlus related topics: COPD (Chronic Obstructive Pulmonary Diseas				
Drug Information available for: Aclidinium bromide				
U.S. FDA Resources				
Further shades to the environment of the				
Purdie of the sourced by Animan, S.A.				
Iung function				
Long remoter				
Secondary Outcome Measures:				
Exacerbations and Quality of Life				
Study Start Date: August 2006				
Primacy Completion Date: May 2008 (Final data collection date for primar	y outcome measure)			
Eligibility				
Ages Eligible for Study: 40 Years and older				
Genders Eligible for Study: Both Accepts Healthy Volunteers: No				
Inclusion Criteria:				
<ul> <li>Males and females aged ≥ 40 years with a clinical diagnosis of modera Evolution Coloria</li> </ul>	ite to severe stable COPD			

Exclusion Criteria

History or current diagnosis of asthma, recent respiratory tract infection or acute COPD exacerbation, life expectancy of less than 1 year, known symptomatic prostatic hypertrophy, bladder neck obstruction or narrow-angle glaucoma

#### **Combined cartridges:** What companies are developing TPO therapies?





# **Project - Business Intelligence**





# Solution requirements

- Highly Curated Dictionaries and Patterns
  - On-going manual effort aided with statistical analysis
- Advanced NLP Algorithms:
  - Context sensitive disambiguation
  - Pattern / Dictionary based entity detection
  - Parallel Entity Detection
  - ConceptScan<sup>®</sup> Technology
- Curator
  - Statistical error model for rules-based

"error detection and correction" algorithm







# Thank You. Questions? Applications for an NLP Engine

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