

# Semantic Technologies for Advanced Medical Image and Information Search

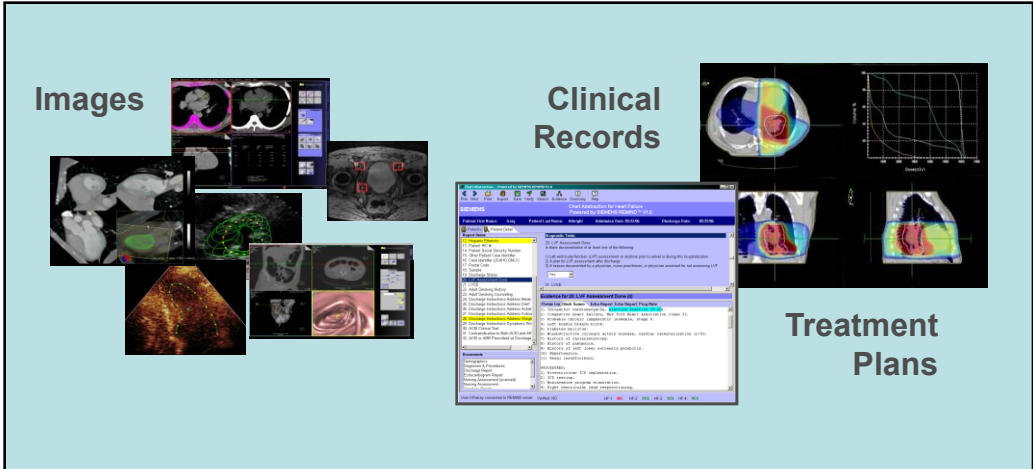
THESEUS-MEDICO

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Vienna, 26.09.2008

- Introduction
  - THESEUS-MEDICO
- Knowledge Engineering in the Medical Domain
  - Domain Specific Knowledge Engineering Challenges
  - Requirements Analysis
  - The KEMM Methodology
  - Query Pattern Derivation
  - Ontology Identification
  - Medical Ontology Alignment
- Final Remarks



## Problem:

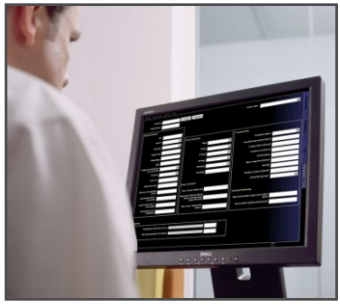
Many individual medical applications, but no common semantics

## BUT:

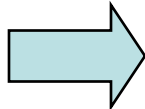
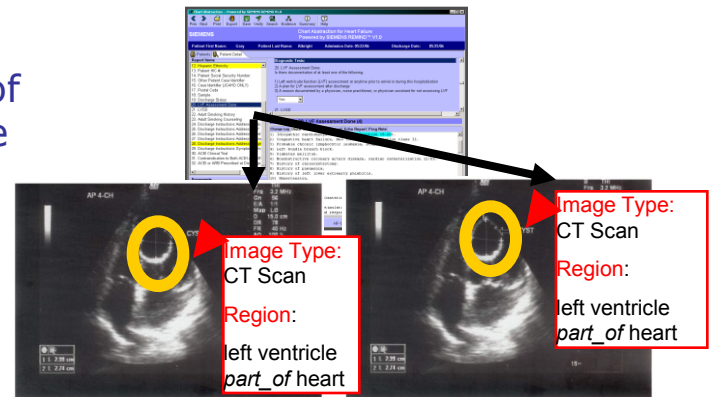
Queries are not arbitrary, instead based on anatomy, physiology, pathology...

- e.g. only heart has left ventricle
- e.g. certain spatial relations between the organ regions/segments

## Proposed solution:



“Show me the CT scans & records of patients with an enlargement in the dimension of the lymph node in the neck”

The search results display two CT scan images. Each image has a yellow circle highlighting a region. Red arrows point from the highlighted regions to text boxes containing the following information:

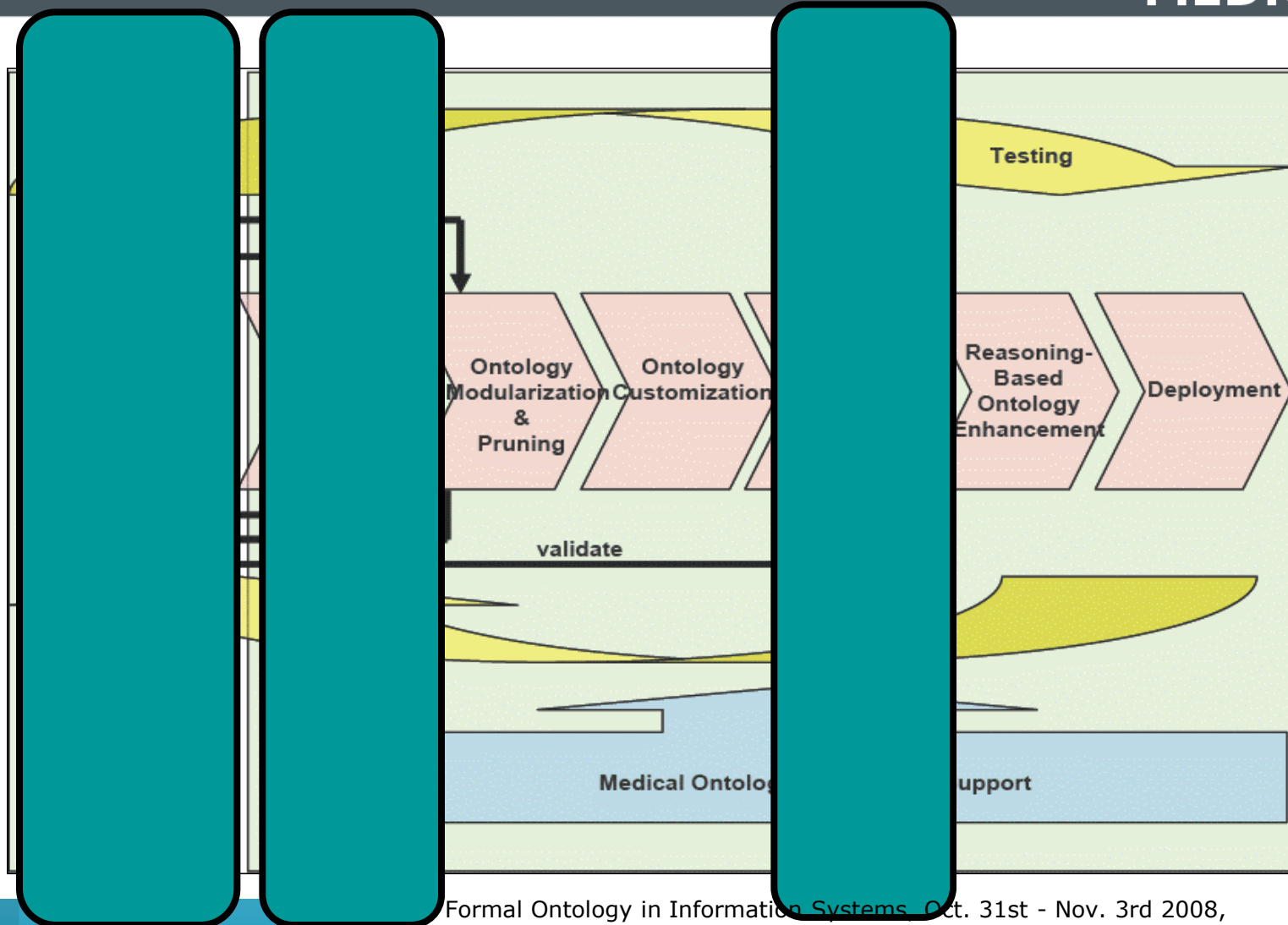
- Image Type:** CT Scan
- Region:** left ventricle part\_of heart

- Challenges of knowledge engineering in the medical domain
  - Communication based
    - Knowledge acquisition bottleneck or knowledge elicitation
  - Medical ontology engineering based
    - Large and comprehensive medical ontologies
    - Knowledge is opaque to the engineer due to special vocabulary
    - Complex – several hierarchies, many relationships
    - Sensitive domain, knowledge has to be accurate
    - Modelling challenge due to lack of domain expertise

To achieve the objectives set for MEDICO in a systematic way we identified the following requirements:

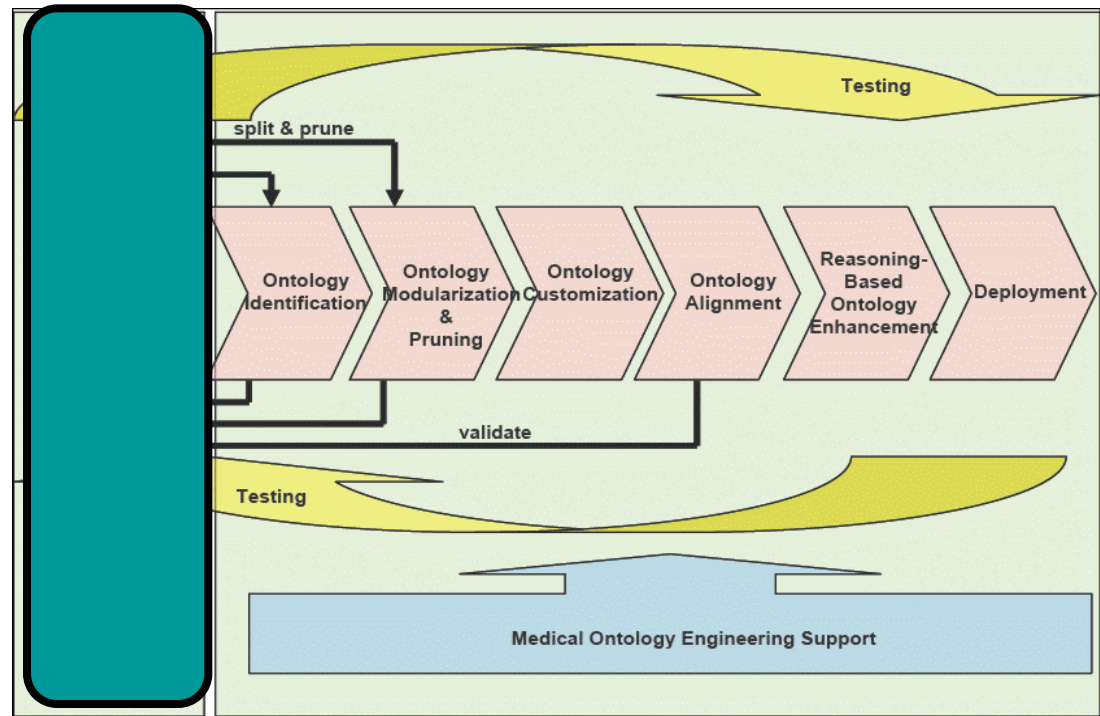
- Query Pattern Derivation
- Ontology Identification
- Ontology Modularization and Pruning
- Ontology Customization
- Ontology Alignment
- Reasoning-Based Ontology Enhancement
- Testing and Deployment

# KEMM: Knowledge Engineering Methodology in the Medical Domain

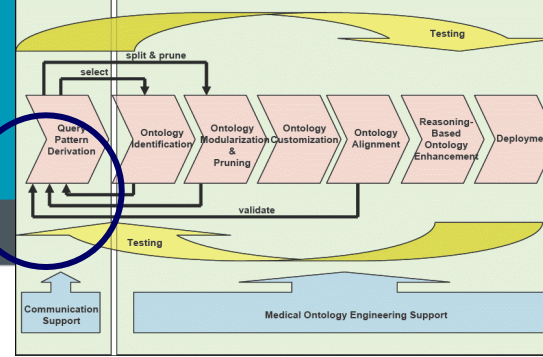


Formal Ontology in Information Systems, Oct. 31st - Nov. 3rd 2008,  
<http://fois08.dfki.de>

# Query Pattern Derivation



# Query Pattern Derivation



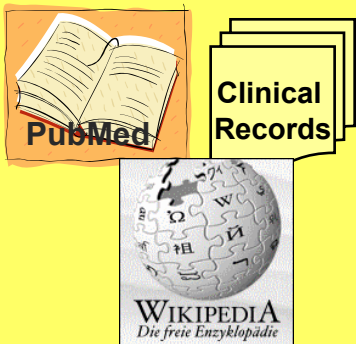
THESEUS  
MEDICO

## Challenge:

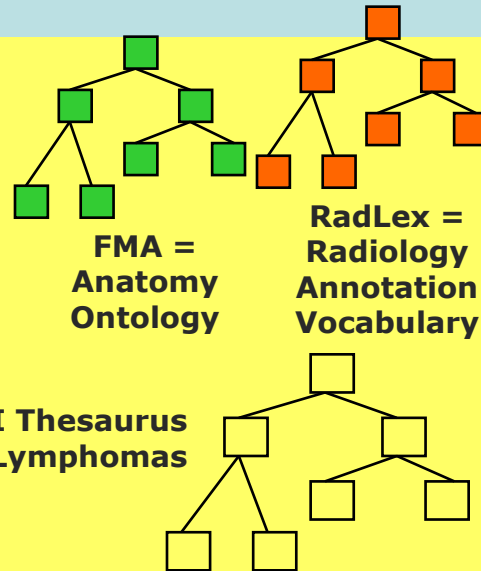
„What are typical queries clinicians or radiologists are interested in?“

we use....

...to achieve:



&



„Enlargement in the dimension of the lymph node in the neck?“

<Anatomical Structure>

Lymph-Node located-in

Neck



<Anatomical Structure>

Neck

XYZ

has-dimension

joint corpora of anatomy, disease, radiology

.... for identifying the most relevant concepts & relationships

.... derive query patterns

Clinical Evaluation



# Data Processing: RadLex & FMA



## Anatomy Corpus

1	Term	FMA	RadLex	ICD	Freq.	Score	PartOfSpeech
2	lateral	y	y	n	464	338724,00	JJ
3	anterior	y	y	n	452	314721,00	JJ
4	artery	y	y	n	237	281961,00	NN
5	anterior spinal artery	y	y	n	2	219894,33	JJ JJ NN
6	lateral thoracic artery	y	y	n	2	217815,33	JJ JJ NN
7	cortex	y	y	n	359	215296,00	NN
8	anterior nucleus	n	y	n	6	211375,09	JJ NN
9	anterior cerebral artery	y	y	n	2	208527,33	JJ JJ NN
10	lateral plantar artery	y	y	n	1	207540,33	JJ JJ NN
11	lateral sacral artery	n	y	n	5	207071,33	JJ JJ NN
12	lateral posterior nucleus	n	y	n	3	206880,73	JJ JJ NN
13	anterior tibial artery	n	y	n	8	199866,00	JJ JJ NN
14	anterior cecal artery	y	n	n	1	198894,33	JJ JJ NN
15	anterior choroidal artery	n	y	n	1	198894,33	JJ JJ NN
16	anterior communicating artery	n	y	n	2	198894,33	JJ VBG NN
17	lateral dorsal nucleus	n	y	n	3	188592,73	JJ JJ NN
18	first	n	y	n	388	176400,00	JJ
19	anterior superior alveolar artery	n	y	n	1	175190,75	JJ JJ JJ NN
20	lateral ventricle	n	y	n	7	174564,00	JJ NN

## Radiology Corpus

1	Term	FMA	RadLex	ICD	Freq.	Score	PartOfSpeech
2	x-ray	n	y	n	253	81901,64	NN
3	imaging modality	n	y	n	6	58682,00	NN NN
4	volume imaging	n	y	n	1	57855,09	NN NN
5	molecular imaging	n	y	n	4	57850,00	JJ NN
6	mr imaging	n	y	n	9	57850,00	JJ NN
7	magnetic resonance imaging	n	y	n	44	48072,67	JJ NN NN
8	nuclear medicine imaging	n	y	n	6	43438,97	JJ NN NN
9	functional magnetic resonance imaging	n	y	n	5	36279,50	JJ JJ NN NN
10	dual energy x-ray absorptiometry	n	y	n	2	20562,47	JJ NN NN NN
11	ultrasound	n	y	n	114	15376,00	NN
12	radiation dose	n	y	n	14	12168,97	NN NN
13	magnetic resonance angiography	n	y	n	3	10046,33	JJ NN NN
14	magnetic resonance spectroscopy	n	y	n	10	9659,67	JJ NN NN
15	small	n	y	n	90	8649,00	JJ
16	nuclear	n	y	n	80	7921,00	JJ
17	3d ultrasound	n	y	n	1	7688,00	CD NN
18	first	n	y	n	83	7056,00	JJ
19	artery	y	y	n	65	6724,00	NN
20	computed tomography	n	y	n	42	5860,00	JJ NN

### Steps:

- all text sections of each corpus through the TnT part-of-speech parser (Brants, 2000)
- extract all nouns in the corpus
  - compute a relevance score (chi-square) for each
  - by comparing anatomy & radiology frequencies respectively with those in the British National Corpus

### Next:

- parse all sentences in all corpora and annotate them with predicate-structure information

# Query Pattern Mining & Dissemination



- Identified domain ontologies and set up corpora
- Extracted domain terms and relations

### Query Pattern Mining (Data-driven, bottom-up)

**Challenge:** „What are typical queries clinicians or radiologists are interested in?“

we use....

- Clinical Records (PubMed, Wikipedia)
- FMA = Anatomy Ontology
- RadLex = Radiology Annotation Vocabulary
- NCI Thesaurus = Lymphomas

...to achieve:

„Enlargement in the dimension of the lymph node in the neck?“

<Anatomical Structure> **Lymph-Node** **located-in** **Neck**

**Neck** **has-dimension** **XYZ**

joint corpora of anatomy, disease, radiology, lymphoma

... for identifying the most relevant concepts & relationships

... derive query patterns

Clinical Evaluation

### Query Pattern Mining (Data-driven, bottom-up)

Term	FMA RadLex	ICD	Freq.	Score	PartOfSpeech
1. artery	n	y	n	464.38274	JJ
2. lateral	y	y	n	452.314721	JJ
3. anterior	y	y	n	207.20181	NN
4. artery	y	y	n	219.894	JJ JJ NN
5. anterior spinal artery	y	y	n	2.118994	JJ JJ NN
6. lateral thoracic artery	y	y	n	2.217615	JJ JJ NN
7. cortex	n	y	n	369.215296	NN
8. anterior nucleus	n	y	n	6.211376	JJ NN
9. anterior cerebellar artery	y	y	n	2.20927	JJ JJ NN
10. lateral plantar artery	n	y	n	1.207546	JJ JJ NN
11. lateral sacral artery	n	y	n	6.207071	JJ JJ NN
12. lateral posterior nucleus	n	y	n	3.206880	JJ JJ NN
13. anterior tibial artery	n	y	n	8.199886	JJ JJ NN
14. anterior cecal artery	n	y	n	1.198984	JJ JJ NN
15. anterior choroidal artery	n	y	n	1.198984	JJ JJ NN
16. anterior communicating artery	n	y	n	1.198984	JJ JJ NN
17. lateral dorsal nucleus	n	y	n	1.198984	JJ JJ NN
18. feet	n	y	n	300.176400	JJ
19. anterior superior iliac artery	n	y	n	1.179190	JJ JJ NN
20. lateral ventricle	n	y	n	7.124564	JJ NN

Term	FMA RadLex	ICD	Freq.	Score	PartOfSpeech
1. artery	n	y	n	263.01901	64 NN
2. imaging modality	n	y	n	6.69882	00 NN NN
4. volume imaging	n	y	n	1.67966	00 NN NN
5. molecular imaging	n	y	n	4.67960	00 JJ NN
6. mr imaging	n	y	n	9.67976	00 JJ NN
7. magnetic resonance imaging	n	y	n	44.48027	67 JJ NN NN
8. nuclear medicine imaging	n	y	n	6.43436	07 JJ NN NN
9. functional magnetic resonance imaging	n	y	n	6.26279	20 JJ NN NN
10. dual energy x-ray absorptiometry	n	y	n	2.20562	47 JJ NN NN NN
11. ultrasound	n	y	n	14.15376	00 NN
12. radiation dose	n	y	n	14.12168	07 NN NN
13. magnetic resonance angiography	n	y	n	3.16546	33 JJ NN NN
14. magnetic resonance spectroscopy	n	y	n	10.16659	67 JJ NN NN
15. small	n	y	n	90.9849	00 JJ
16. nuclear	n	y	n	60.7921	00 JJ
17. 3d ultrasound	n	y	n	1.7686	00 CD NN
18. feet	n	y	n	83.7666	00 JJ
19. artery	n	y	n	66.6724	00 NN
20. computed tomography	n	y	n	43.6860	00 JJ NN

**Relations**

Term	FMA RadLex	ICD	Freq.	Score	PartOfSpeech
1. lymphoma	n	y	n	367.11481	00 n y
2. proliferation	n	y	n	69964	00 n y
3. gene	n	y	n	367.11481	00 n y
4. lymphoma	n	y	n	61236	29 n n n
5. lymphoma	n	y	n	367.11481	00 n y
6. lymphoma	n	y	n	98056	00 n n
7. protein	n	y	n	1624	00 n y
8. protein	n	y	n	9397	31 n y
9. lymphoma	n	y	n	367.11481	00 n y
10. diagnosis	n	y	n	69186	09 n y
11. lymphoma	n	y	n	367.11481	00 n y
12. lymphoma	n	y	n	367.11481	00 n y
13. lymphoma	n	y	n	367.11481	00 n y
14. lymphoma	n	y	n	367.11481	00 n y
15. lymphoma	n	y	n	367.11481	00 n y
16. lymphoma	n	y	n	367.11481	00 n y
17. lymphoma	n	y	n	367.11481	00 n y
18. lymphoma	n	y	n	367.11481	00 n y
19. lymphoma	n	y	n	367.11481	00 n y
20. lymphoma	n	y	n	367.11481	00 n y

**Visualize**

### LREC, May 2008

**Title:** "Towards a Human Anatomy Data Set for Query Pattern Mining based on Wikipedia and Domain Semantic Resources"

**Contents:** Paper reports on the construction of an anatomy corpus based on the Wikipedia Anatomy category.

This corpus is then used for the statistical profiling of the Foundational Model of Anatomy Ontology & the RadLex Thesaurus to derive query patterns.

**Conference:** Was presented at the LREC International Conference / Building Biomedical Resources Workshop - May 2008

Presentation online: [http://www.nactem.ac.uk/workshops/lrec08\\_ws/studies/Wennerberg\\_et\\_al.pdf](http://www.nactem.ac.uk/workshops/lrec08_ws/studies/Wennerberg_et_al.pdf)

### ACL BioNLP, June 2008

#### Statistical Term Profiling for Query Pattern Mining

Paul Buitelaar<sup>1</sup>, Pinar Ozden Wemmerberg<sup>2</sup>, Sonja Zillner<sup>3</sup>

<sup>1</sup>ICL, <sup>2</sup>ICL, <sup>3</sup>ICL

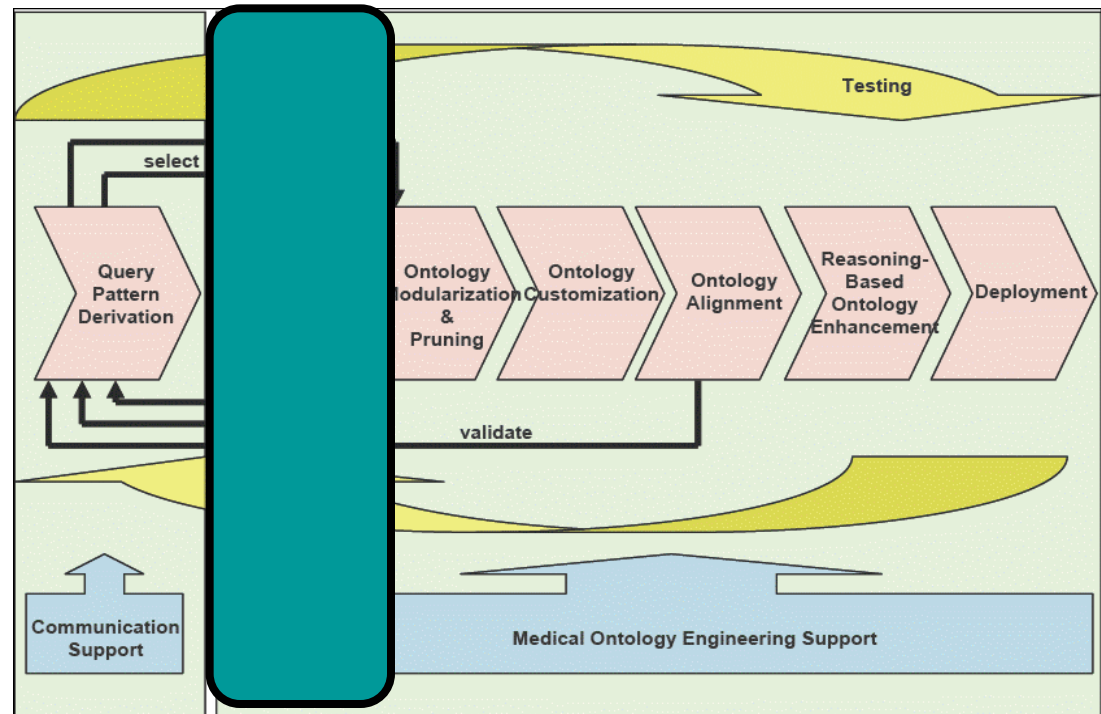
**Introduction:** THESEUS-Medico & Query Pattern Mining

**Method and Results:** Statistical Term Profiles & Relation Extraction

**Conclusions:** THESEUS-Medico is a novel approach to the problem of identifying potential query patterns from domain-specific corpora using statistical term profiling and relation extraction.

- ### Dissemination:
- Published and presented in international conferences
  - Patent pending

# Ontology Identification



## Criteria for selecting MEDICO relevant ontologies and thesauri

- Three perspectives
  - the **anatomical spatial**: **body parts** and **their locations**,
  - the **radiology**: relationships between various **image modalities** and **anatomical regions** as shown on medical images,
  - the **disease-pathology**: distinction between **normal** and **abnormal** imaging features
  
- Representation Language
  - as predefined by MEDICO either in OWL or easily transferable
  
- Comprehensiveness
  - most comprehensive (e. g., FMA) to avoid missing relevant important information
  
- Popularity: being non-experts, popularity is our guide...
  - how well known
  - how well documented
  - how many projects using the ontology
  
- Semantic Formalism
  - Description Logics as predefined by THESEUS-MEDICO

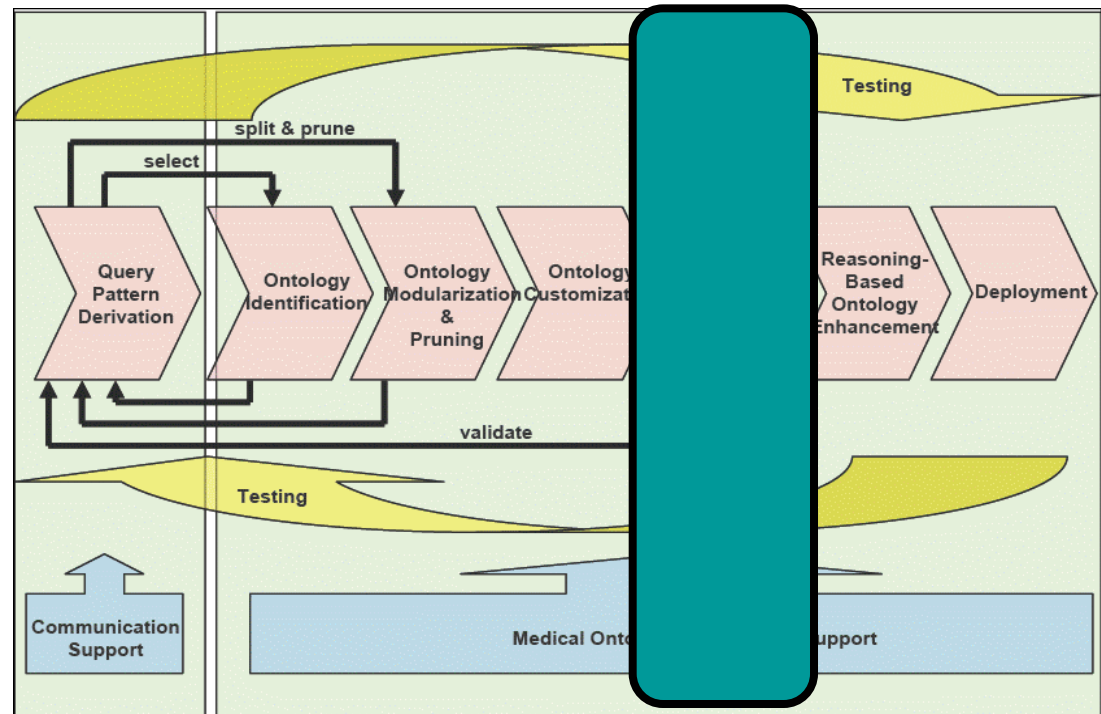
## Relevant domain ontologies for MEDICO

Ontology	Perspective	# of Concepts	# of Rel. Types	# of Syns.	Format	Data File
FMA	anatomy	71.202	170	28.488 (up to 6 per concept)	OWL, Frames, OBO*	<a href="http://depts.washington.edu/ventures/UW_Technology/Express_Licenses/FMA.php">http://depts.washington.edu/ventures/UW_Technology/Express_Licenses/FMA.php</a>
RadLex	radiology	11.962	14		XML, Frames	<a href="ftp://ftp.ihe.net/RadLex">ftp://ftp.ihe.net/RadLex</a>
NCI Cancer Thesaurus	disease	34.000	182		OWL, Text, OBO	<a href="ftp://ftp1.nci.nih.gov/pub/cacore/EVS/NCI_Thesaurus/">ftp://ftp1.nci.nih.gov/pub/cacore/EVS/NCI_Thesaurus/</a>

\* OBO Foundry

# Ontology Alignment –

Current Focus &  
Work in Progress



- Often, there is a need to use the knowledge from multiple ontologies
- Thus we need to integrate knowledge from disparate domain ontologies about **anatomy, radiology and disease/pathology** (i.e. the three perspectives)
- Semantic Integration → **Ontology Alignment** → Identify equivalent concepts (and relations) from disparate domain ontologies

- Leveraging on the current technologies
  - Hybrid (Schema based and Instance based)
- Combinatory
  - Linguistic-based (transformation rules and formal grammars)
  - Corpus-based (observation of co-occurrences)
  - Dialogue-based (interaction with user, relevance feedback)

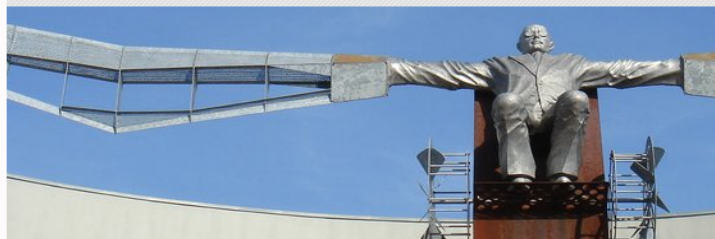


# Final Remarks

- Ontology engineering in the medical domain is challenging not only because of technical issues but also because of communication mismatches.
- Medical ontologies have specific characteristics (large, complex, opaque semantics...), which requires special treatment.
- Expert knowledge is not always available in the medical domain because the doctors are almost always in lack of time. This requires finding alternative solutions to acquire expert knowledge.
- Medical image semantics requires integration of information across three dimensions; anatomy, radiology and diseases, pathology.
- Clinicians/radiologists are not aware of the technologies available to them. One important step is to inform them about all what they could demand.

fois2008

5th international conference on formal ontology in information systems



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## Welcome to FOIS 2008, the 5th International Conference on Formal Ontology in Information Systems

Saarbrücken, Germany

Oct 31st - Nov 3rd 2008

co-located with ISWC 2008, Karlsruhe, Germany (Oct 26 - 30)

**Registration is now open!**

Since its inception ten years ago, the International Conference on Formal Ontology in Information Systems has explored the multiple perspectives on the notion of ontology that have arisen from such diverse research communities as philosophy, logic, computer science, cognitive science, linguistics, and various scientific domains.

As ontologies have been applied in new and exciting domains such as the World Wide Web, bioinformatics, and geographical information systems, it has become evident that there is a need for ontologies that have been developed with solid theoretical foundations based on philosophical, linguistic, and logical analysis. Similarly, there is also a need for theoretical research that is driven by the issues that have been raised by recent work in the more applied domains.

FOIS is intended to be a forum in which to explore this interplay between the theoretical insights of formal ontology and their application to information systems and emerging semantic technologies.

### Cases on Semantic Interoperability for Information Systems Integration:

#### Practices and Applications

A book edited by Dr. Yannis Kalfoglou, Ricoh Europe Plc, UK

## Book Chapter: "Cases on Semantic Interoperability"

#### Introduction

Semantic interoperability and integration is concerned with the use of explicit semantic descriptions to facilitate information and systems integration. Semantic technologies provide the means to attach meaning to conventional concepts which makes it possible to automatically process and integrate large amounts of information without human intervention.

#### The Overall Objective of the Book

This case book will be a concise and elaborate analysis of the state-of-the-art in the emergent field of semantic interoperability and integration. It will include a number of cases covering the need for the use of semantics to enable intelligent information integration in organizational and personal computing settings. The case book will explain in depth, the issues involved with integrating large amounts of heterogeneous information, and point to the deficiencies of current systems. It will complement existing publications in this field and provide the reader with a clear understanding of why semantics are needed and how to make use of them in information integration tasks.

#### The Target Audience

Research practitioners in academia and industry, research students, information and business analysts, information management professionals, engineers, and software developers. The book will assist in practitioners' quest for knowledge on applying semantic technologies to their information management tasks; research students and associates will find this resource as a one stop reference resource for the semantic integration and interoperability field; information management practitioners will find this resource a valuable aid in their task on improving everyday practice; engineers and software developers will find this resource a repository of cases where detailed engineering procedures and methods are exposed for the benefit of replicating the solution to similar settings.

#### Recommended topics include, but are not limited to, the following:

- Use of ontology mapping technology to semantic interoperability
- Use of semantic technology in Enterprise Application Integration (EAI) settings
- Use of semantic technology for Intelligent Information Integration (I<sup>2</sup>) applications
- Cost of integration using semantic technologies lessons learnt from applying and/or deploying semantic technologies for integration
- Scope and benefits of semantic technologies for integration
- Theoretical underpinnings of semantic integration
- Impact of Semantic Web and Web 2.0 to integration solutions

#### Submissions

Accepted Papers

Venue

Registration

Program

News

Printable

Flyer

Conference Booklet

## Disseminating MEDICO

- We would like to thank our [project partners](#):
  - DFKI Saarbrücken Language Technology Lab
  - DFKI Kaiserslautern Knowledge Management
  - University of Erlangen

for their valuable contributions...

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Thank you!