# Passage retrieval and intellectual property in legal texts

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In collaboration with Alfonso Rios Maat Knowledge, Spain



FLACOS, Toledo, 24-25 September 2009



#### Overview



### Introduction:

- Computational linguistics and forensic linguistics
- Tracks on legal texts
- Tracks on intellectual property (patents)
- Tracks on plagiarism detection (plagiarism of ideas)



- Question Answering
- Passage Retrieval
- CLEF-09
- QA@CLEF-09
- IP@CLEF-09
- Passage Retrieval at MAAT and Future work

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# Computational / Forensic Linguistics

• What is Computational Linguistics?

Computational linguistics is an <u>interdisciplinary</u> field dealing with the <u>statistical</u> and/or rule-based modeling of <u>natural language</u> from a computational perspective. This modeling is not limited to any particular field of <u>linguistics</u>.

http://en.wikipedia.org/wiki/Computational\_Linguistics

What is Forensic Linguistics?

Forensic linguistics is a field of <u>applied</u> linguistics involving the relationship between <u>language</u>, the <u>law</u>, and <u>crime</u>.

http://en.wikipedia.org/wiki/Forensic\_linguistic



### **Forensic Linguistics**



• The Text: Forensic Linguistics Institute

It investigates the <u>language of crime and forged texts</u> using <u>linguistic and statistical models</u>

http://wwww.thetext.co.uk/



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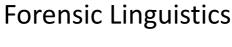
• Center for Forensic Linguistics at Aston University

It organises a <u>Summer School</u> on <u>disputed authorship</u> and <u>contested meanings</u>

http://www.forensiclinguistics.net







The International Association of Forensic Linguistics

It Forensic linguistics, forensic <u>phonetics</u>, <u>language</u> and <u>law</u>, <u>applied linguistics</u>, experts, court, evidence, <u>trademark</u>, <u>authorship attribution</u>, <u>patents</u> etc.

http://www.iafl.org/

Tittp://www.lan.org/



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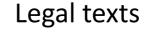
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• IAFL Conference 2009

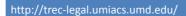






Legal track (IR) on legal texts @ TREC

The goal is to develop search technology that meets the <u>needs</u> of <u>lawyers</u> (interactive tasks and batch tasks based on feedback relevance)





• QA track on legal texts @ CLEF

JRC-Acquis collection of EU of legal treaties

http://celct.ixti.cnr.it/ResPubliQA

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# Patent analysis @ NTCIR translation / retrieval / mining



- Track on patent translation
- Track on patent retrieval
- Track on patent mining

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technical trend maps from a set research papers and patents http://www.ls.info.hiroshima-cu.ac.jp/~nanba/ntcir-8/cfp.html

The goal is to look for hidden information to mine and create

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## Patent retrieval @ CLEF



- Track on Intellectual Property
- In such a way related to the problem of Plagiarism detection of ideas



The goal is to to investigate IR techniques for patent retrieval in order to search for the state-of-the-art of a patent on a certain topic in order to determine whether or not a certain degree of plagiarism of ideas occurred; ~conflict discovery among patents (potentially, <u>reasoning about patents</u> is also possible)

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http://www.ir-facility.org/the irf/clef-ip09-track



## **Intellectual Property (Patents)**



• Information Retrieval Facility (IRF)

It is an open IR science institution: http://wwww.ir-facility.org

#### Mission:



- to maintain a facility that enables large scale IR and in-depth <u>patent</u> <u>processing</u>
- to provide access to a large and high-quality corpus of patent data
- -to support communication between the IP and IR communities
- to support and coordinate academic projects



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# **Intellectual Property (Patents)**



• Information Retrieval Facility (IRF)



#### Targets:

- $\hbox{-}\underline{\text{Industrial}} \text{ information professionals}$
- -Researchers in information retrieval
- Patent authorities and governmental institutions

Conference (next in Vienna, 2010):

http://www.ir-facility.org/irf-conference

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### **Intellectual Property (Patents)**



#### MatrixWare Information Services



- -It offers superior solutions and services for professional <u>information retrieval</u> to the <u>global market</u>
- -These solutions and services help organizations to face the information economy and, thereby, provide them with a distinct business advantage
- It builds strong, trusting relationships through cutting-edge, open science, open source and open <u>business concepts</u>

http://www.matrixware.com

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## Plagiarism detection



Plagiarism advice

Organisation which deals with <u>institutional policies</u> and procedures for dealing with plagiarism, in <u>education</u> etc.

http://www.plagiarismadvice.org/

Conference: International conference on plagiarism

http://wwwplagiarismconference.co.uk/



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#### Plagiary

International journal about plagiarism, falsification, etc.

cross-disciplinary studies in

http://www.plagiary.org



### Plagiarism detection

PAN workshop



Uncovering <u>plagiarism</u>, <u>authorship</u> and <u>social software misuse</u> (e.g. vandalism on Wikipedia)

3<sup>rd</sup> edition: http://www.webis.de/pan-09



#### 1st Competition on plagiarism detection

Participants: 13 teams from (result ranking order): Germany, Czech Republic, Italy, Ukraine, Austria, Nigeria and South Korea, Greece, Israel, Brazil, Canada, Spain, UK, USA

Sponsor: Yahoo!Research

Aims: corpus creation, comparison of methods, introduction of (standard) measures

http://www.webis.de/pan-09/competition.php



#### Question Answering

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## **Question Answering**



What is Question Answering?

Question Answering can be viewed as a particular form of Information Retrieval (IR), in which the <u>amount of information</u> to return is the minimum required to satisfy the user needs expressed by a specific question.



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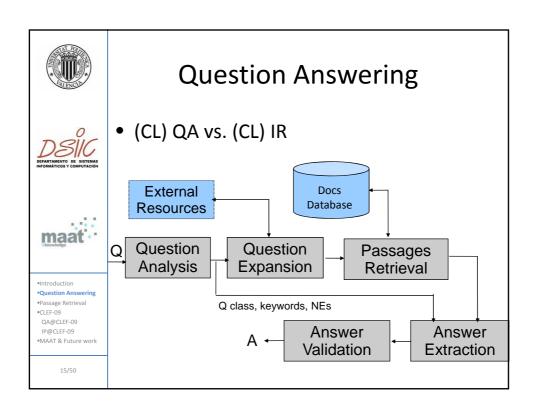
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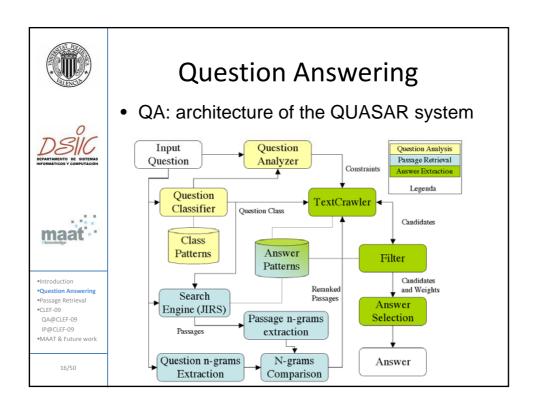
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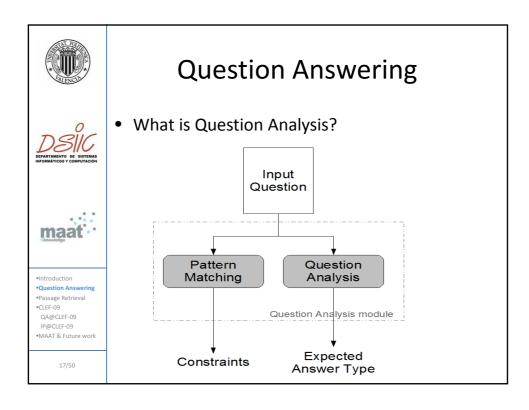
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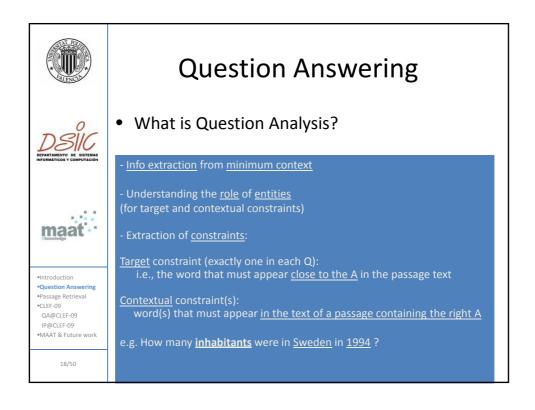
In information retrieval, question answering (QA) is the task of automatically answering a question posed in natural language. To find the answer to a question, a QA computer program may use either a pre-structured database or a collection of natural language documents (a text corpus such as the World Wide Web or some local collection).

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# **Question Answering**



• Question classification



e.g. How many inhabitants were in Sweden in 1994?

Expected answer type In this case a <u>quantity</u>)

Ontology-based approach

Pattern matching (regular expressions)

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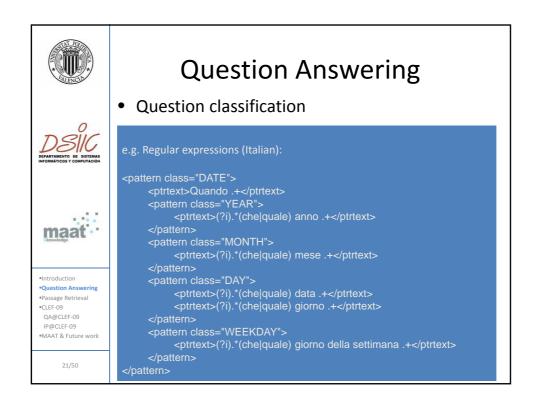


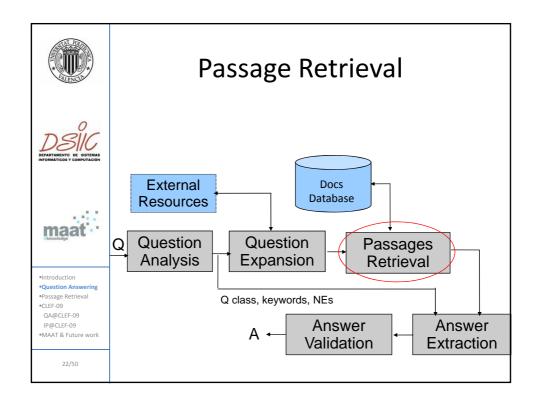


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# **Question Answering**

04	05	06
QDPH	DFURQ\P	
	SHUVRQ	
	MIMOH	
	OR FDWIR Q	FRXQWU\
		FIW\
		JHR JUDSKIFDO
GHIIQ IWIR Q		
GDWH	GD\	
	PRQWK	
	\HDU	
	Z HHNGD\	
TXDQWIW\	P R Q H \	
	G IP HQ VIR Q	
	DJH	







### Passage Retrieval



• What is Passage Retrieval?



A Passage Retrieval (PR) system is an <u>IR system</u> which, given a list of keywords (e.g.: "Electricity," "Motor", etc..) or a question such as:

e.g. Where is the Europol Drugs Unit?

A PR returns fragments of texts (<u>passages</u>) that are relevant to the user needs

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JIRS is a open-source PR, developed in the UPV:

http://sourceforge.net/projects/jirs/

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## Passage retrieval system: JIRS



Most of nowadays PR systems are <u>not oriented</u> to the specific question answering problem, because they only take into account the keywords of the question in order to obtain the relevant passages.



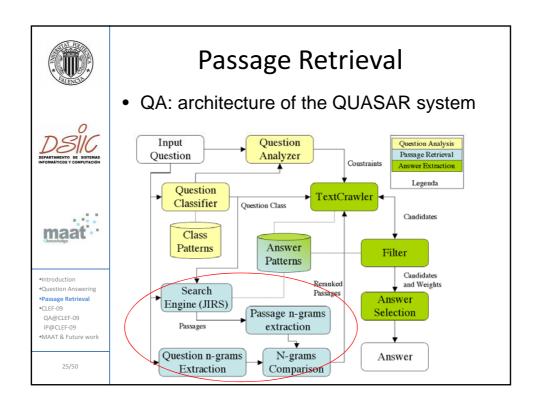
JIRS is a PR engine based on n-grams

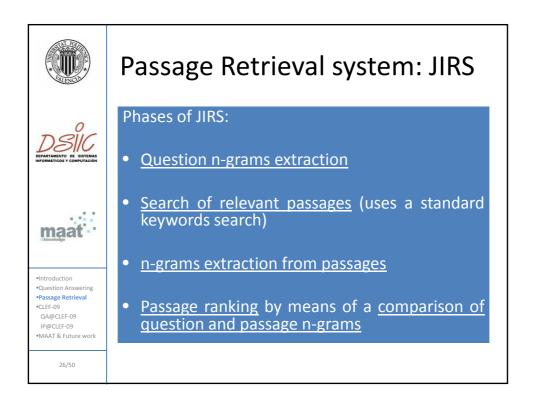
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JIRS is based on the premise that in a large collection of documents, an n-gram associated with a question must be found in this collection at least once (redundancy)







## Passage Retrieval system: JIRS



JIRS example:

Let us suppose that we have a database of <u>publications of a newspaper</u>. Using the JIRS system we aim at finding in the document of the collection an answer to a question such as:

e.g. Who is the president of Colombia?"



For instance, the system could retrieve the following two passages:

- ..Giorgio Napolitano is the president of Italy..."

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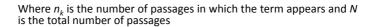
Of course, the first passage should be given more importance because it contains the <u>5-gram</u> "is the president of Colombia", whereas the second passage contains only the <u>4-gram</u> "is the president of".

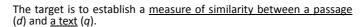


# JIRS: Weighting

The weight of each term is set to:

$$w_k = 1 - \frac{\log(n_k)}{1 + \log(N)}$$





$$sim(d,q) = \frac{\sum_{j=1}^{n} \sum_{x \in Q} h(x,D_{j})}{\sum_{j=1}^{n} \sum_{x \in Q} h(x,Q_{j})}$$

The function  $h(x, D_j)$ , returns a weight for the <u>j-gram</u> x with respect to the <u>set of j-grams</u>  $D_j$  in the passage and it is defined as:

$$h\big(x,D_j\big) = \begin{cases} \sum_{k=1}^{|x|} W_x & if \ x \in D_j \\ 0 & otherwise \end{cases}$$





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# JIRS: Weighting

Q: "What is the capital of Croatia?"

#### Passage 1

Yesterday, the delegation visited Zagreb, the capital of Croatia, and after their stay in Sarajevo they are traveling to Belgrade.

the capital of Croatia 1 x 4-gram the capital of capital of Croatia the capital 2 x 3-gram

capital of 3 x 2-gram of Croatia

of Croati the capital of

Croatia







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JIRS: Weighting



4 x 1-gram

#### Passage 2

Yeltsin invited Tudjman and Milosevic to the capital of Russia to find a political solution to the Croatia and Bosnia conflicts.

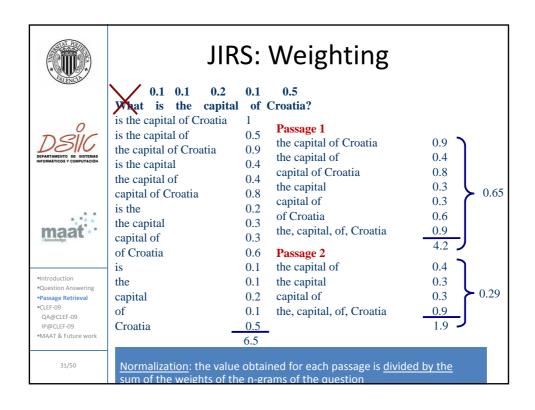
the capital of 1 x 3-gram

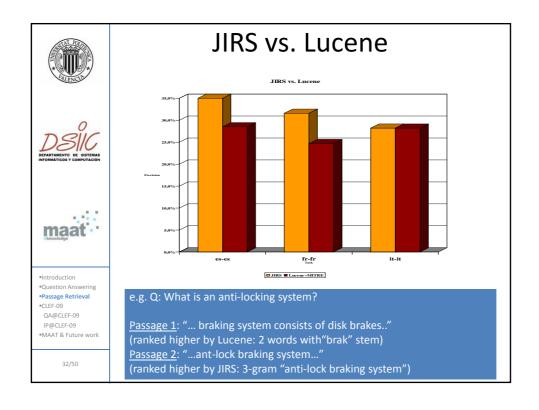
the capital capital of 2 x 2-gram

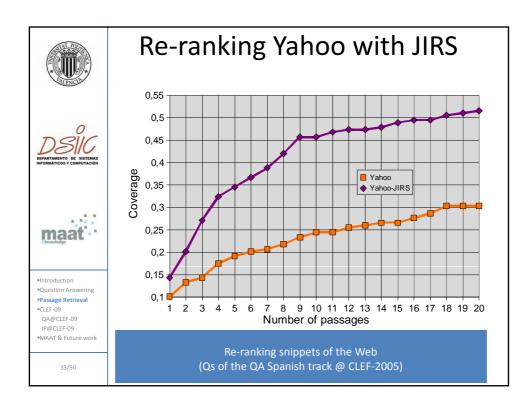
the capital

of 4 x 1-gram

Croatia









### CLEF-09



The Cross-Language Evaluation Forum (CLEF), organises competitions for the assessment of multilingual information retrieval systems www.clef-campaign.org/



In CLEF-2009 edition, due to the growing interest in Natural Language Processing (NLP) of legal texts from both the university and the business sector, tracks such as ResPubliQA and IP have been organised.

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### **QA Track**

ResPubliQA@CLEF-2009 competition address the problem of <u>question answering in the restricted</u> <u>domain of legal texts</u> (previous editions: open domain)

Given a pool of <u>500</u> independent natural language <u>questions</u>: e.g. Where is the Europol Drugs Unit?

Each system must <u>return the passage</u> (not the exact answer)

<u>JRC-Acquis</u> collection of <u>EU legal traits</u> (aligned documents): <u>inter-language QA systems comparison</u>







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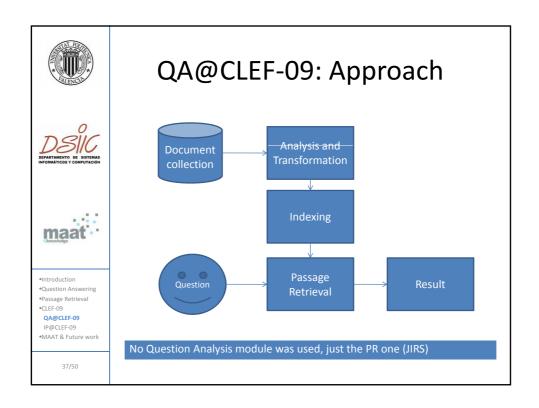
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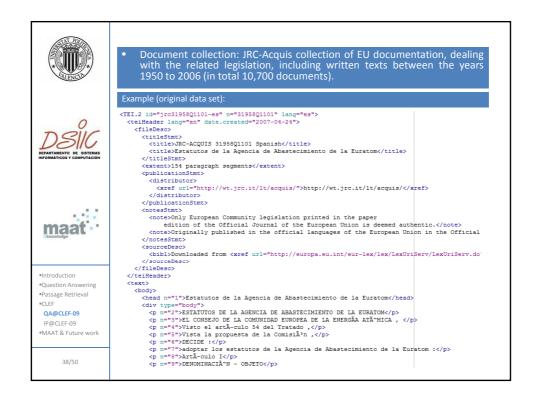
#### **IP Track**

The CLEF IP track is coordinated by <u>Information Retrieval Facility</u> (IRF) and <u>Matrixware</u>. Its aim is to investigate IR techniques for patent retrieval in order to search for the prior <u>state-of-the-art of a patent</u> on a certain topic in order to determine whether or not a certain degree of <u>plagiarism of ideas</u> occurred.

The track provided a <u>collection of more than 1M patent</u> <u>documents</u>, mainly derived from <u>European Patent Office</u> sources, in three languages: <u>English French and German</u>.

A total of 500 patents are analysed using the supplied corpus to determine their prior state-of-the art; for each one of them the systems must return a list of 1000 documents with their score ranking.







<u>Pre-processing and analysis of documents</u>: The collection of the competition is made of documents in <u>XML format</u>, each one divided into <u>paragraphs</u> delimited by the tag . Therefore, each paragraph has been defined as a document, tagged with the name of the document where it is contained and the <u>paragraph number</u> that corresponds to it.







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<DOC>
<DOCNO>
<DOCNO>
<TDCNO>

Tre31958Q1101-es.xml:1
</DOCNO>

CTEXT>

Estatutos de la Agencia de Abastecimiento de la Euratom
</TEXT>

C/DOCNO

DOCNO>

TEXT>

ESTATUTOS DE LA AGENCIA DE ABASTECIMIENTO DE LA EURATOM
</TEXT>

C/DOCNO>

CDOCNO>

DOCNO>

DOCNO>

TEXT>

EL CONSEJO DE LA COMUNIDAD EUROPEA DE LA ENERGÍA ATÓMICA ,
</TEXT>

C/DOCNO>

CTEXT>

EL CONSEJO DE LA COMUNIDAD EUROPEA DE LA ENERGÍA ATÓMICA ,
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CDOCNO>

TEXTS

EL CONSEJO DE LA COMUNIDAD EUROPEA DE LA ENERGÍA ATÓMICA ,
</TEXT>

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TO
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 Indexing: Once all the documents have been extracted from the collection, they have been <u>indexed</u> <u>in JIRS according to the language</u> that has been analysed



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<u>Passage Retrieval</u>: searched for the answer to each question of the track



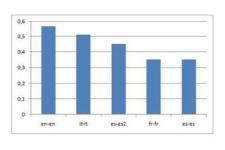




 Question Answering Passage Retrieval •CLFF-09 QA@CLEF-09 IP@CLEF-09 •MAAT & Future work We submitted <u>5 runs</u> for the following <u>monolingual tasks</u>: <u>English</u>, <u>French</u>, <u>Italian and Spanish</u>, and in an additional experiment, we present another approach for the monolingual run in <u>Spanish</u> making use of the <u>multilingual collection</u>

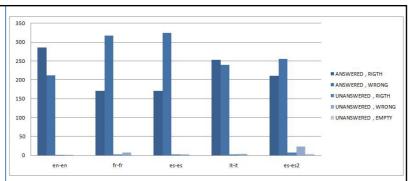
 $\label{thm:continuous} \begin{tabular}{ll} Table. Results for submitted runs. Ans: Answered, Unans: Unanswered, A.R.: Answered Rigth, A.W.: Answered Wrong, U.F.: Unanswered Empty, Overall: Overall accuratory, PACD: Proportion of answers correctly discarded, c@1: c@1 measure. \\ \end{tabular}$ 

task	Ans.	Unans.	A.R.	A.W.	U.R.	U.W.	U.E.	Overall	PACD	c@1
en-en	498	2	286	212	1	1	0	0,57	0,5	0,57
fr-fr	488	11	171	317	3	8	0	0,35	0,73	0,35
es-es	495	5	171	324	2	3	0	0,35	0,6	0,35
it-it	493	7	253	240	3	4	0	0,51	0,57	0,51
es-es2	466	34	211	255	7	23	4	0,44	0.68	0.45









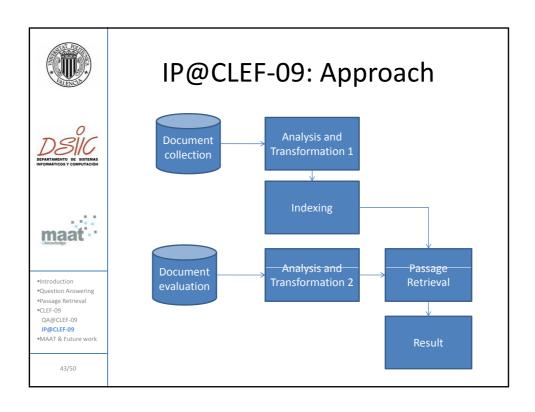


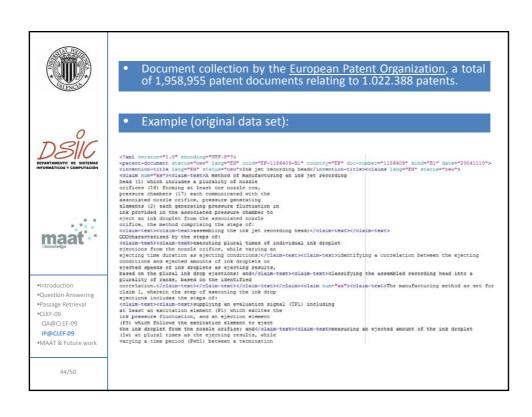
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#### Some comments:

- Question Analysis would have helped in predictingthe kind of question: a multilingual domain-specific ontology (legal traits) is needed
- Anaphora problem (in legal texts)
- Performance varies depending on the way to explain legal traits <u>in languages</u> (<u>style</u> may vary among languages)
- Exploiting the <u>aligned corpora</u> seems to help to <u>improve results</u>







 <u>Pre-processing and analysis of documents</u> (1): We decided to <u>eliminate all the irrelevant information</u> (just <u>title</u> and <u>description</u>)



#### Example (after pre-processing):



<DOCNO> EP0381261 </DOCNO>

<TEXT>
Liquid detergent product

A non-aqueous liquid detergent comprises liquid phase preferably includes nonionic surfactant dispersed particulate phase includes carbonate mixed carbonate/bicarbonate builder carboxylic acid polymer maleic/acrylic copolymer calcium carbonate crystal growth inhibitor The compositions exhibit good physical stability performance Other ingredients oxygen bleach system lipase enzymes present

</TEXT>

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• <u>Indexing</u>: Once all the documents have been extracted from the collection, they have been <u>indexed with JIRS according to the language that has been analysed</u>.



• Document evaluation: A total of <u>500 patents</u>



 Pre-processing and analysis of documents (2): the <u>query</u> is composed by the <u>title of the patent</u> followed by the most <u>relevant n-grams</u> composed by the heaviest terms, according to the <u>weights assigned</u> <u>using the random walks method</u> (method for <u>summarisation</u>)



#### Example (after preprocessing):

Topic: EP1445166

Name: Foldable baby carriage

Words extracted with random-walks: surface, seating Question to JIRS: Foldable baby carriage, surface seating

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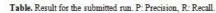
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• <u>Passage Retrieval</u>: searched for the <u>rank of the patents in the data</u> <u>base</u> relevamt to each "question" of the track



We submitted <u>1 run</u> for the task size S (500 topics), obtain the following results:





P	R	MAP	nDCG	
0,0016	0,2547	0,0289	0,3377	



The obtained <u>results</u> (interms of Precision, Recall, Mean Average Precision and Normalized Discounted Cumulative Gain) were not satisfactory (excuse: the track was organised for the  $\mathbf{1}^{\text{st}}$  time this year)

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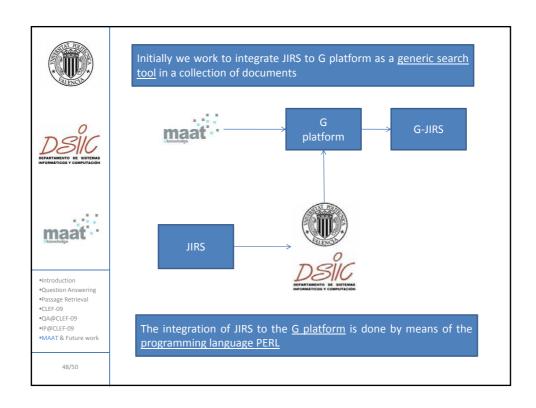
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#### Possible <u>reasons</u>:

- -reduction process carried out on the provided corpus;
- <u>JIRS</u> is more suitable to work <u>at passage level than at document</u> level (patents)

However we believe that the assumptions made in the approximation still constitute a valid approach, capable of returning appropriate results (next year?)





### **Future Work**





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Due to the growing interest in <u>NLP-based approaches</u> for the analysis of <u>legal texts</u> and <u>patents</u> (tacks of CLEF, TREC, NTCIR) from both the <u>university</u> (e.g. Technical University of Valencia) and the <u>business sector</u> (e.g. Maat Knowledge), we plan to employ JIRS in other <u>commercial applications</u>.



## Thanks / Gracias / Grazie





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