





# TimeLex:

# Tools for Processing Temporal Information in Legal Texts

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#### **Outline**

- Brief Introduction
- Tools
  - lawORdate
  - Añotador
  - Event extractor
- Conclusions



**Temporal Annotation** 

### **BRIEF INTRODUCTION**

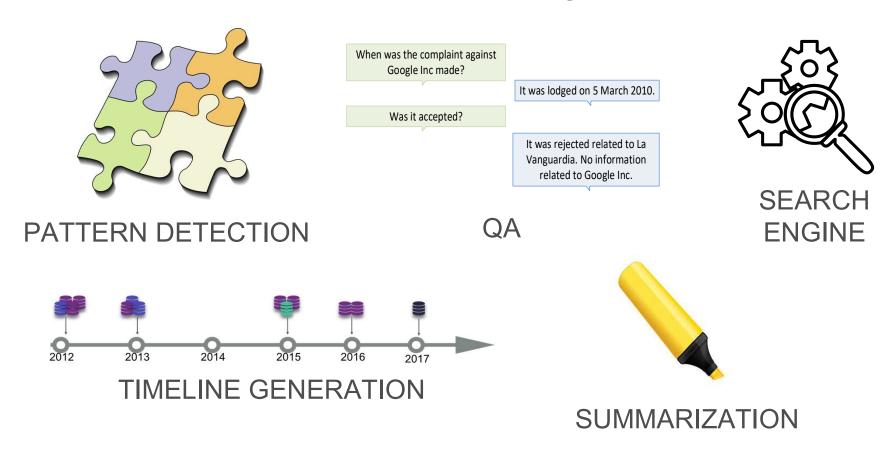
#### **Temporal Information**

Temporal information is everywhere: news, medical texts, legal documents...



#### **Temporal Information**

... and we can use it for a lot of things!



... but there are not a lot of tools to extract temporal information in Spanish and for the legal domain

Estas actividades están reguladas por Real Decreto 1341 2007, de 11 de octubre sobre la gestión de la calidad de las aguas de baño, incorporando al derecho español la Directiva 2006 7/CE del Parlamento Europeo y del Consejo de 15 de febrero de 2006 relativa a la gestión de la calidad de las aguas de baño.

These activities are regulated by Royal Decree 1341 2007, of 11th October on the management of bathing water quality, incorporating into Spanish law Directive 2006 7/ EC of the European Parliament and of the Council of 15th February 2006 on to the management of the quality of bathing waters.

#### **Most common misleading expressions**

Directiva 2012/27/UE

RD 1463/2007

Real Decreto 1341/2007

Ley Orgánica 10/1995

Ley 22/2011, de 28 de julio

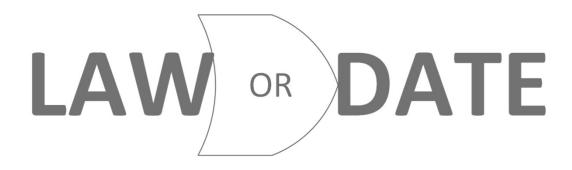
BOE: 29/07/2011

BOE de 22 de julio

BOE núm. 306, de diciembre

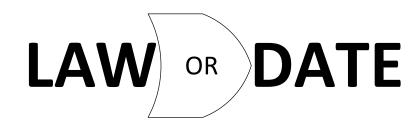
So the first step will be preprocessing the text to delete all these misleading expressions...

...and then we could start looking for temporal information.



Step 1

**LAWORDATE** 



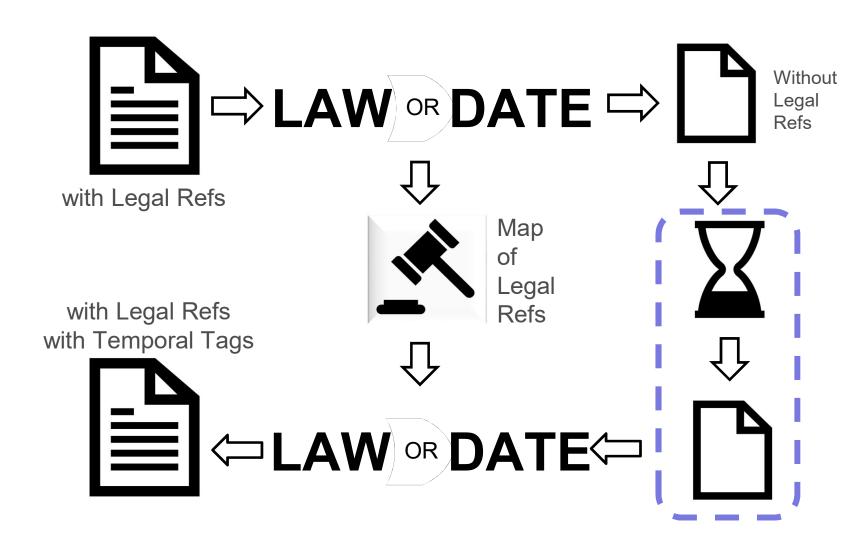
http://legalwhen.appspot.com/

http://ceur-ws.org/Vol-2049/04paper.pdf

lawORdate [1] is a webapp that takes a text with legal references including dates and returns it without them. Once the temporal tagging is done, the references are restored in the text.

An example: "En la presente base de datos se recogen los elementos inscritos en el registro creado via el **Real Decreto 2093/2008, de 19 de diciembre**. Ha sido actualizado por ultima vez el <u>13 de agosto de 2017."</u>

#### **lawORdate**



Once we have the text free of misleading expressions, we can start looking for temporal information.



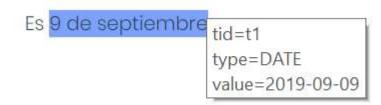
Step 2

# **AÑOTADOR**



#### http://annotador.oeg-upm.net/

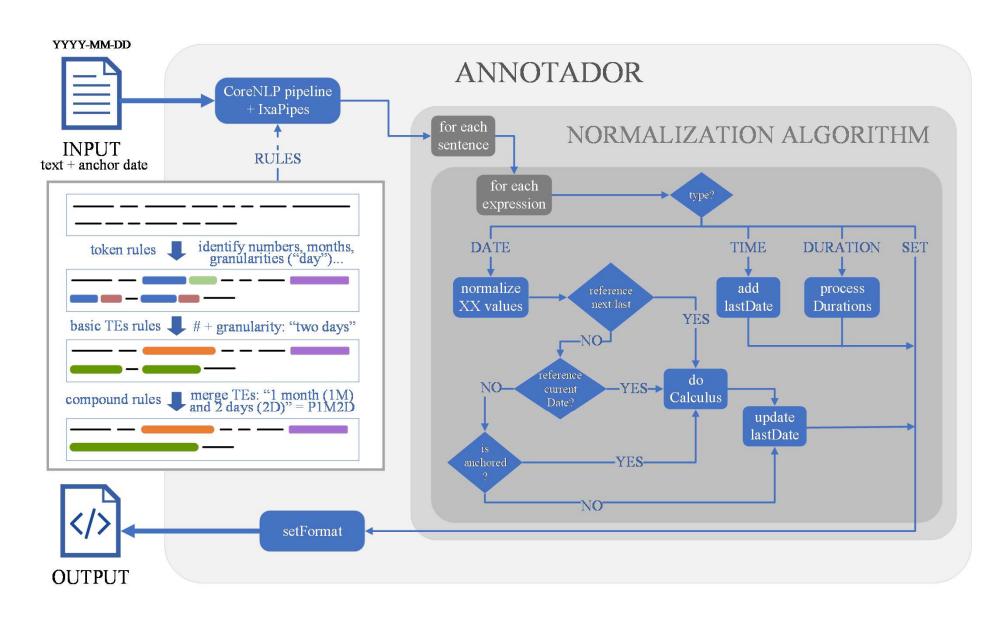
Añotador (aka Annotador) [2] is a temporal tagger for Spanish and English. It is able to find and normalize dates, times, durations and sets (temporal expressions that repeat periodically, such as "monthly", "twice a year" or "every Tuesday").

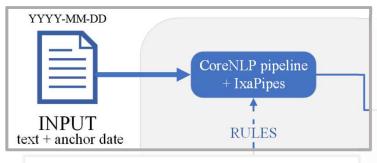


There is a demo available in its webpage, and can be called as webservice or downloaded from GitHub (where all the code and a docker image are available).

#### Results:

- Outperforms other Spanish taggers in general texts, including colloquial and Hispanic American expressions [2].
- Outperforms other English taggers in legal European English texts (from the European Court of Human Rights and the European Court of Justice).





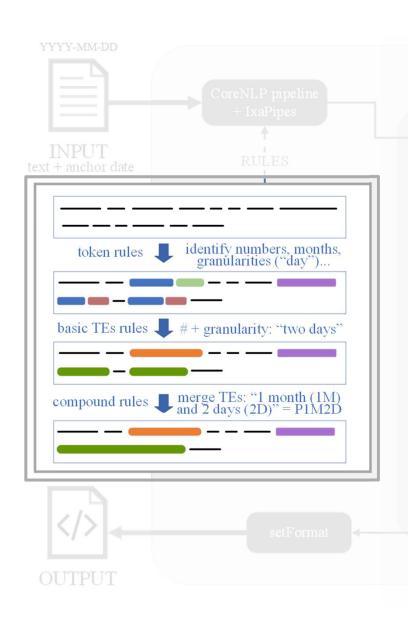


#### **ANNOTADOR**

#### 1. Preprocessing:

- We get as input the text and the anchor date (if none, we assume the current day)
- We use CoreNLP for lemmatizing, sentence splitting...
- We added IxaPipes models for Spanish to improve the quality of the output.





#### 2. Rules:

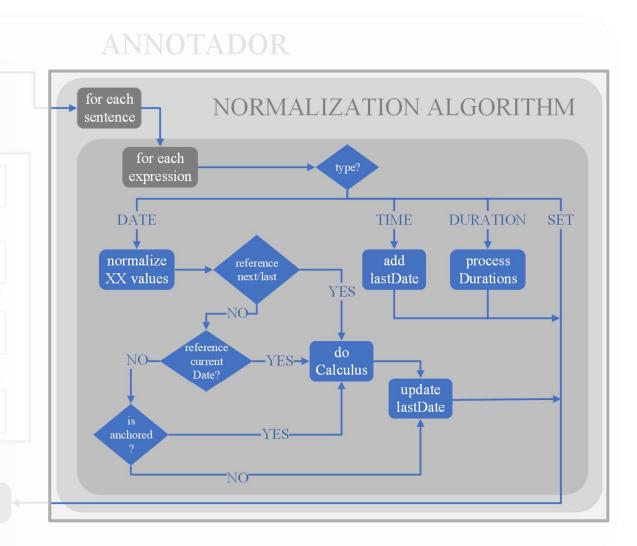
More than 100 rules written in CoreNLP TokensRegex format.

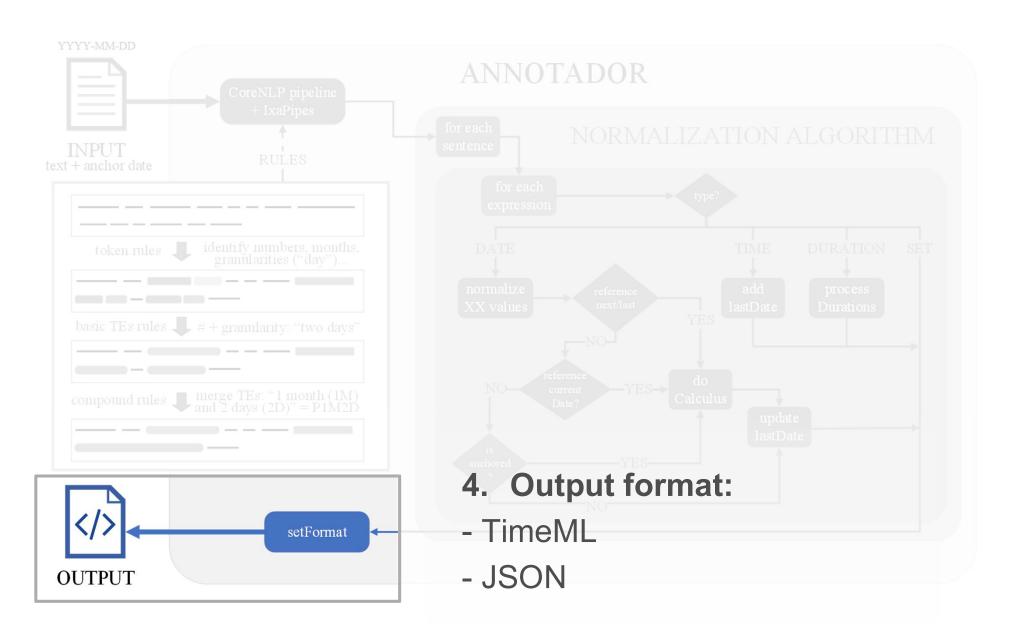
- 1. Token-based rules for expressions such as numerals, granularities...
- 2. Basic temporal expression rules, working on previously found basic expressions
- 3. Compound expression rules, for inheritance values or composition.
- 4. Literal expression rules, for specific expressions such as "previously", polysemic expressions (Spanish "mañana") or expressions including tokens that can appear in other temporal expressions, requiring a dedicated approach.

# 3. Normalization algorithm:

- Works for each sentence sepparately.
- Different

   approaches for
   each type of
   expressions.
- Can take into account different reference dates.





OK, now we know "when"... but we are also interested in "what", "who", "where"...

We need events!



Step 3

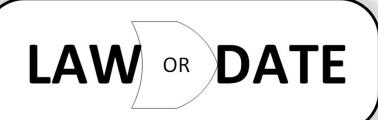
**EVENTS** 

#### **Current work**

We are currently working on the detection of events, specifically trying to define what are legal *relevant* events in judgments.

We have already some results on:

- Theorical analysis [3, 4].
- Detection within contracts (ContractFrames [5]).





Legal Event Extractor

lawORdate prepares the legal document in order to make it is easier to be processed by the other tools



Añotador finds and normalizes all the temporal expressions.



With the tool we are currently developing, we find the relevant legal events in a text.

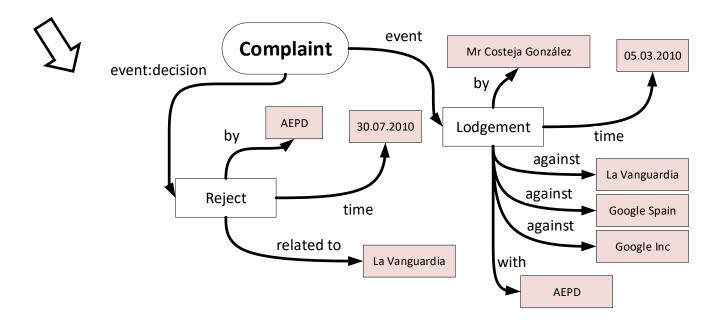
#### From text to event representation

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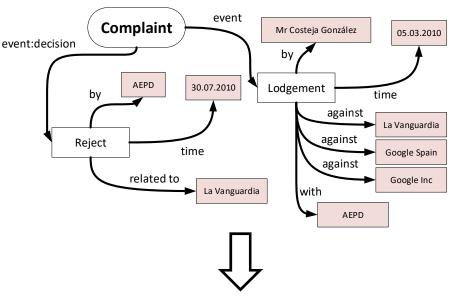
On **5 March 2010**, Mr Costeja González, a Spanish national resident in Spain, <u>lodged</u> with the AEPD a complaint against La Vanguardia Ediciones SL, which publishes a daily newspaper with a large circulation, in particular in Catalonia (Spain) ('La Vanguardia'), and against Google Spain and Google Inc. The complaint was based on the fact (...)

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By decision of 30 July 2010, the AEPD <u>rejected</u> the complaint in so far as it related to La Vanguardia (...)



#### From event representation to applications



Mr Buivids made a video recording in a station of the Latvian national police The Administratīvā apgabaltiesa (Regional Administrative Court, Latvia) dismissed the appeal brought by Mr Mr Buivids published the recorded video Buivids against the decision of the administratīvā rajona which showed police officers, on the tiesa (District Administrative Court) internet site www.youtube.com The National Data Protection Mr Buivids filed an appeal in cassation before the referring Agency requested Mr Buivids to court, the Augstākā tiesa (Supreme Court, Latvia), against remove that video from the the judgment of the Administratīvā apgabaltiesa (Regional internet site www.youtube.com Administrative Court) and from other websites In those circumstances, the Augstäkä tiesa (Supreme Court) Mr Buivids brought an action be decided to stay the proceedings and to refer the following before the administratīvā rajona questions to the Court of Justice for a preliminary ruling tiesa (District Administrative Court, Latvia) claiming REQUEST for a preliminary ruling from the compensation Augstākā tiesa (Supreme Court, Latvia) to the ECJ The administratīvā rajona tiesa FINAL DECISION by the (District Administrative Court, ECJ (Second Chamber) Latvia) dismissed the action

An event-based representation of judgments would facilitate the understanding of legal documents to both layman and legal practitioners by allowing, among others, the generation of:

- Timelines
- Event-based summaries
- Pattern-based analysis of judgments
- Question Answer systems
- ... and more!



Future work

#### **CONCLUSIONS**

#### Results:

- lawORdate: Preprocessing of legal documents to facilitate the task of temporal taggers (Añotador).
- Añotador: Detection of temporal expressions to facilitate event detection and anchoring in Spanish and English texts.

#### Current work:

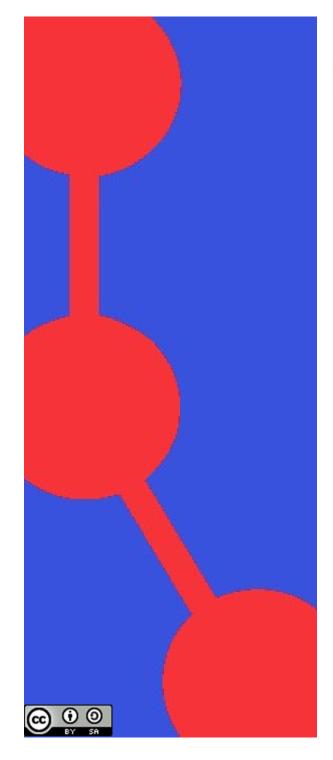
 Event extractor in the legal domain: Detection of relevant events in the legal domain.

#### Application:

TimeLex suite offers tools that allow to represent legal documents as sets of events to facilitate tasks such as summarization, question answering, timeline generation, pattern detection...

#### References

- 1. Navas-Loro, M. (2017). LawORDate: a Service for Distinguishing Legal References from Temporal Expressions. Proceedings of TeReCom 2017: Workshop on Technologies for Regulatory Compliance at JURIX (TeReCom 2017).
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- 5. Navas-Loro, M., Rodríguez-Doncel, V., Satoh, K., ContractFrames: Bridging the Gap Between Natural Language and Logics in Contract Law In: Kojima K., Sakamoto M., Mineshima K., Satoh K. (eds) New Frontiers in Artificial Intelligence. JSAI-isAI 2018. Lecture Notes in Computer Science, vol 11717. Springer, Cham. doi: 10.1007/978-3-030-31605-1\_9.







# TimeLex:

# a Suite of Tools for Processing Temporal Information in Legal Texts

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#### Results against the Hourglass corpus

In the HourGlass corpus, Añotador always shows the best performance.

Tagger	Attribute	strict			lenient			average		
		P	R	F1	P	R	F1	P	R	F1
Annotador	value	0.7231	0.7068	0.7148	0.7949	0.7769	0.7858	0.7590	0.7419	0.7503
	type	0.7923	0.7744	0.7833	0.8846	0.8647	0.8745	0.8385	0.8195	0.8289
	extent	0.8333	0.8145	0.8238	0.9462	0.9248	0.9354	0.8897	0.8697	0.8796
Heidel	value	0.5672	0.4762	0.5177	0.6358	0.5338	0.5804	0.6015	0.5050	0.5490
	type	0.6060	0.5088	0.5531	0.8239	0.6917	0.7520	0.7149	0.6003	0.6526
	extent	0.6239	0.5238	0.5695	0.8716	0.7318	0.7956	0.7478	0.6278	0.6826
SUTime	value	0.3019	0.0802	0.1267	0.4528	0.1203	0.1901	0.3774	0.1003	0.1584
	type	0.4717	0.1253	0.1980	0.8019	0.2130	0.3366	0.6368	0.1692	0.2673
	extent	0.4717	0.1253	0.1980	0.8868	0.2356	0.3723	0.6792	0.1805	0.2851

Value means the normalization is correct

Type means that the temporal expression was correctly classified Extent means that the temporal expression was correctly marked in the text

#### Results against the TempEval2 corpus

Results of the temporal taggers in the TempEval 2 corpus. HeidelTime is slightly better at finding the normalized value (0.0027 on average), but Añotador is better in the rest of metrics. SUTime shows good Precission.

Tagger	Attribute	strict			lenient			average		
		P	R	F1	P	R	F1	P	R	F1
Annotador	value	0.8021	0.7778	0.7897	0.8281	0.8030	0.8154	0.8151	0.7904	0.8026
	type	0.8438	0.8182	0.8308	0.9063	0.8788	0.8923	0.8750	0.8485	0.8615
	extent	0.8646	0.8384	0.8513	0.9323	0.9040	0.9179	0.8984	0.8712	0.8846
Heidel	value	0.8418	0.7525	0.7947	0.8644	0.7727	0.8160	0.8531	0.7626	0.8053
	type	0.8531	0.7626	0.8053	0.8870	0.7929	0.8373	0.8701	0.7778	0.8213
	extent	0.9040	0.8081	0.8533	0.9435	0.8434	0.8907	0.9237	0.8258	0.8720
SUTime	value	0.6377	0.2222	0.3296	0.8261	0.2879	0.4270	0.7319	0.2551	0.3783
	type	0.6522	0.2273	0.3371	0.9275	0.3232	0.4794	0.7899	0.2753	0.4082
	extent	0.6667	0.2323	0.3446	0.9565	0.3333	0.4944	0.8116	0.2828	0.4195

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#### **References - Taggers**

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#### Temporal taggers:

- 1) Detect temporal expressions:
  - DATE DURATION
  - SET TIME
- 2) Normalize them.

```
The 3rd of April 2016 is OK, but the 20th May would be better.
```

```
<?xml version="1.0"?>
<!DOCTYPE TimeML SYSTEM "TimeML.dtd">
<TimeML>
<TIMEX3 tid="t4" type="DATE" value= 2016-04-03" The 3rd of April 2016</TIMEX3>
is OK, but <TIMEX3 tid="t6" type="DATE" value= 2016-05-20" the 20th May</TIMEX3>
would be better.
</TimeML>
```

3) Additionally, event and relation extraction