

# Romanian Language Technology – a view from an academic perspective

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## Abstract

The article reports on research and developments pursued by the Research Institute for Artificial Intelligence „Mihai Drăgănescu” of the Romanian Academy in order to narrow the gaps identified by the deep analysis on the European languages made by Meta-Net white papers and published by Springer in 2012. Except English, all the European languages needed significant research and development in order to reach an adequate technological level, in line with the expectations and requirements of the knowledge society.

**Keywords:** Romanian language resources and technologies, Meta-Net White papers, European Language Equality

## 1 Introduction

The technological evolution of the last decades, both in the field of hardware and communications and in the field of algorithms, representation models and automated processing flows has highlighted the exceptional value of data. The success of neural, sequence-by-sequence or transformer models, as well as the proven superiority of applications based on such models and machine learning, have placed the volume and quality of data at the forefront of the technological and scientific advancement of the information society, of the knowledge society. The awareness campaigns started by the European Commission (EC) on language technologies in the early 2000’s continued with large projects (ELSNET<sup>1</sup> - <http://www.elsnet.org>, CLARIN- <https://www.clarin.eu>, META-NET-<http://www.meta-net.eu/>, and more recently ELG - <https://www.european-language-grid.eu/>, ELRC - <https://www.lr-coordination.eu/index.php/>, ELE - <https://european-language-equality.eu/>) involving all countries from European Union. The effectiveness of these actions, associated to more research and development projects funded by EC and the national authorities is apparent as the technological levels for the targeted languages are significantly improved, although many efforts are still needed to reach all the objectives set out in the European Language Equality manifesto.

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<sup>1</sup>ELSNET (European Language and Speech Network) defined the BLARK concept - Basic Language and Resource Kit – as the minimal set of language technologies for judging the languages technological preparedness.

## 2 The Meta-Net report on European Languages

One of the most influential European initiatives in the area of Language Technologies (LT) was META-NET (<http://www.meta-net.eu/mission>), a Network of Excellence forging the Multilingual Europe Technology Alliance. Among other significant results, META-NET project made an impressive analysis of the state-of-play for European languages (White Papers) concerning their technological levels, published in 2012 by Springer. The language reports on 30 European languages (<http://www.meta-net.eu/whitepapers/overview>), Romanian included, outlined that there were tremendous deficits in technology support and significant research gaps for each language. The comparison among the languages was carried on along four domains, taking into account multiple criteria (availability, accessibility, quality, coverage, maturity, sustainability, adaptability and multilinguality):

- Speech processing: state of language technology support,
- Machine translation: state of language technology support,
- Text analysis: state of language technology support and
- Speech and text resources: state of support.

Among the main conclusions, the report highlighted the major gaps for each language:

- While some specific corpora of high quality exist, a very large syntactically annotated corpus is not available.
- Many of the resources lack standardization, i.e., even if they exist, sustainability is not given; concerted programs and initiatives are needed to standardize data and interchange formats.
- The more semantics a tool must deal with, the more difficult is to find the right data; more efforts for supporting deep processing are needed.
- Standards do exist for semantics in the sense of world knowledge (RDF, OWL, etc.); they are – however – not easily applicable in NLP tasks.
- Research was successful in designing particular high-quality software, but it is nearly impossible to come up with sustainable and standardized solutions given the current funding situations.
- For certain languages, certain technologies simply do not exist.

The report on Romanian (<http://www.meta-net.eu/whitepapers/volumes/romanian>) was the guide document for organizing and prioritizing research and development at ICIA and major LT centers in Romania (UAIC, IIT, UPB and others). For Romanian, the report showed the main shortcomings, many of them common for majority of the analyzed languages:

- Lack of large and high-quality corpora, deeply annotated (reference corpus)
- Limited open access to major resources and tools for processing Romanian Language
- Compliance with data standards and interchange formats
- Limited semantic and standardized language resources
- Few resources and tools for processing Romanian speech data
- Enhancing the resources and engines for Machine Translation
- Observing the latest trends in LT research and development.

In the period elapsed from the time of the META-NET reports, improvements were made for all languages. In the following, we will briefly comment on the major activities carried on by ICIA towards eliminating or narrowing the gaps revealed by the META-NET report.

### 3 The language resources program at ICIA

In line with the priorities of the European Commission's Artificial Intelligence programs focused on Language Technologies, ICIA has conducted advanced research and developed corpora, semantic resources, language models and applications for the Romanian language, and made them available to the repositories of the European Commission built through the European Language Grid, European Language Coordination, European Language Equality and Meta-Net projects. ICIA became the most important contributor in Romania with resources and technologies specific to the Romanian language to these repositories.

#### 3.1 The lexical ontology for Romanian language

The most significant semantic resource, developed since 2002 and being continuously maintained is the Romanian WordNet (Tufiş et al., 2004), a lexical ontology containing 60,000 synsets. The lexical ontology RoWordNet was constructed and validated manually. This lexical resource, one of the largest in the world, is aligned with Princeton WordNet (Miller, 1995; Fellbaum, 1998) as majority of other language specific wordnets are. The alignment with Princeton WordNet makes the navigation possible between different languages, allowing for multilingual semantic experiments and applications (e.g., word sense disambiguation). RoWordNet is available on multiple sites out of which we mention:

- <https://www.racai.ro/tools/text/rowordnet/>
- <https://github.com/dumitrescustefan/RoWordNet>
- <http://globalwordnet.org/resources/wordnets-in-the-world/>
- <http://compling.hss.ntu.edu.sg/omw/>

A parallel query of both Romanian WordNet and Princeton WordNet is available from the RELATE (Păiş et al., 2020) platform (<https://relate.racai.ro/index.php?path=rowon/queryp>). RoWordNet was the main source for extracting verbal multiword expressions (VMWE) and annotating them in running texts, according to PARSEME annotation manual (<https://parsemefr.lis-lab.fr/parseme-st-guidelines/1.1/index.php>). After the hand validation of the first version of the list of verbal multiword expressions, the RoWN-VMWEs-v.2 has been publicly released (<https://www.racai.ro/media/ro-data-mwe-v2.txt>) together with the PARSEME\_corpus.ro ([https://gitlab.com/parseme/parseme\\_corpus\\_ro](https://gitlab.com/parseme/parseme_corpus_ro)).

#### 3.2 Multilingual and monolingual textual corpora

The most used parallel corpus, JRC-Acquis, in its version 2.2<sup>2</sup> (Steinberger et al., 2006) was released in 2006 and contained a part of the body of European Union (EU) laws applicable in the EU Member States. The documents included in the corpus were only those translated in at least 10 languages. The Acquis Communautaire is a collection of parallel texts in 22 languages: Bulgarian, Czech, Danish, German, Greek, English, Spanish, Estonian, Finnish, French, Hungarian, Italian, Lithuanian, Latvian, Maltese, Dutch, Polish, Portuguese, Romanian, Slovak, Slovenian and Swedish. ICIA was responsible for processing the Romanian and, partially, Bulgarian sub-corpora of the JRC-Acquis corpus. This parallel corpus was the major source of training machine translation systems all over the world. Since parallel texts for so many languages are difficult to find, during ACCURAT project, the ICIA team developed the innovative systems EMACC (Ion et al., 2011) and PEXACC (Ion, 2012) to extract parallel text fragments from comparable texts.

Research and development on parallel and comparable corpora gave a global impetus to development of statistical machine translation systems. In ICIA, we developed a state-of-the-art, Romanian to English statistical machine translation system (Tufiş and Dumitrescu, 2012), based on the Moses toolkit (Koehn, et al., 2007). The machine translation preoccupations continued, and, within the European project Presidency, a better and professional translation system (named MT Kit) was developed with the close cooperation with TILDE company (<https://www.tilde.com/>) and DGT-UE.

<sup>2</sup>Today, JRC-Acquis corpus is available in the version 3.0



Figure 1: The welcome page of CoRoLa

It was meant mainly for the visitors of President of Romania's site for the presidency period of the Council of Europe. The result of this project was combined with the Automatic Speech Recognition and Text-To-Speech modules developed within the national projects ReTeRom and ROBIN thus producing the voice-to-voice translation system, first of the kind in Romania.

The first balanced large computational corpus for Romanian, ROMBAC (Ion et al., 2012), was created in 2012, in the context of the METANET4U EC project, containing about 36,000,000 words evenly distributed into five genres: journalistic (news and editorials), pharmaceutical and medical short texts, legalese, biographies of the major Romanian writers and critical reviews of their works, and fiction (both original and translated novels and poetry). The texts were tokenized, morpho-syntactically tagged, lemmatized, shallow-parsed (chunked) and XCES-compliant encoded.

ROMBAC was the predecessor of the much larger Reference Corpus for Contemporary Romanian the construction of which started in 2014 (Mititelu et al., 2014). The Reference Corpus for Contemporary Romanian Language, CoRoLa, is a bimodal corpus (<https://corola.racai.ro/>), built through a priority project of the Romanian Academy and continued today in the same regime. In the construction phase, the project enjoyed a close collaboration with the two institutes of the Romanian Academy (ICIA and IIT) but also with the University of Bucharest and the German Language Institute in Mannheim. The bi-modal corpus (text and voice) CoRoLa is the most important public language resource in Romania (Figure 1), with more than one billion of words (Tufiş et al., 2019). There are several annotation levels which make CoRoLa corpus the queen of Romanian resources. The text data and associated metadata may be accessed by KorAP interface (Figure 2) developed by German Language Institute in Mannheim (<https://korap.ids-mannheim.de/>), while the oral component is accessed by the OCQP interface (Figures 3 and 4) ([http://89.38.230.23/corola\\_sound\\_search/index.php](http://89.38.230.23/corola_sound_search/index.php)).

The OCQP interface also offers the possibility to listen to either the query word or to the entire sentence, spoken by native speakers. In the case of more results, the interface allows pagination and retrieval of 20 results for each page.

The corpus has undergone numerous revisions, eliminating the errors discovered by many users, adding new search facilities, being used in the construction of language models useful in developing applications for the Romanian language. Different variants of vector models (Păiș and Tufiş, 2018a; 2018b) ([http://89.38.230.23/word\\_embeddings/](http://89.38.230.23/word_embeddings/)), neural language models, and specific processing

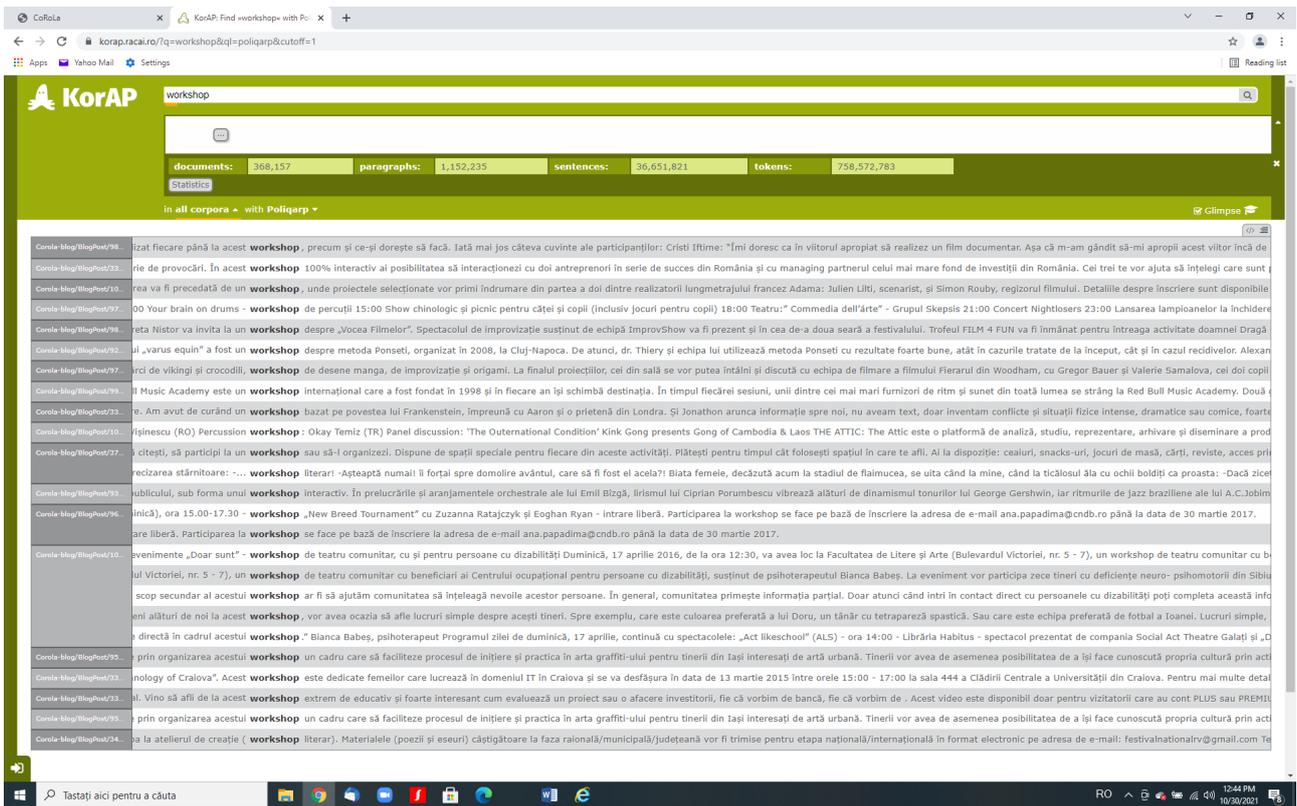


Figure 2: KorAP results for a query on CoRoLa

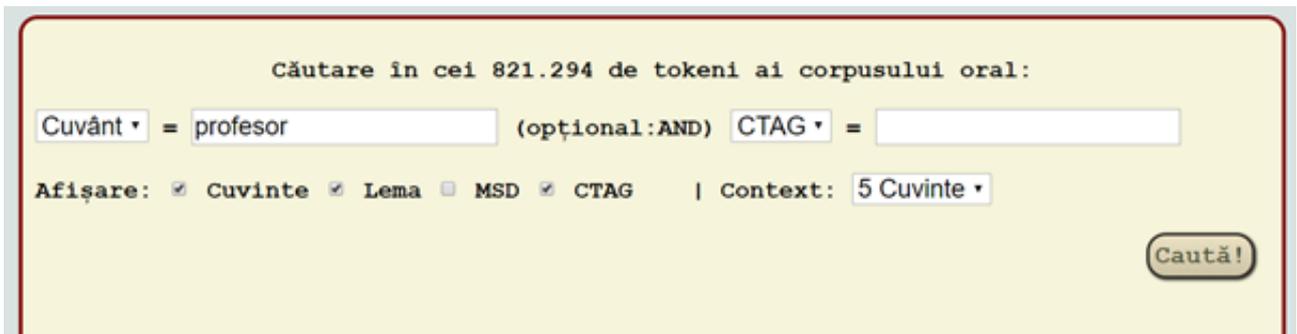


Figure 3: OCQP - Query on the oral part of CoRoLa

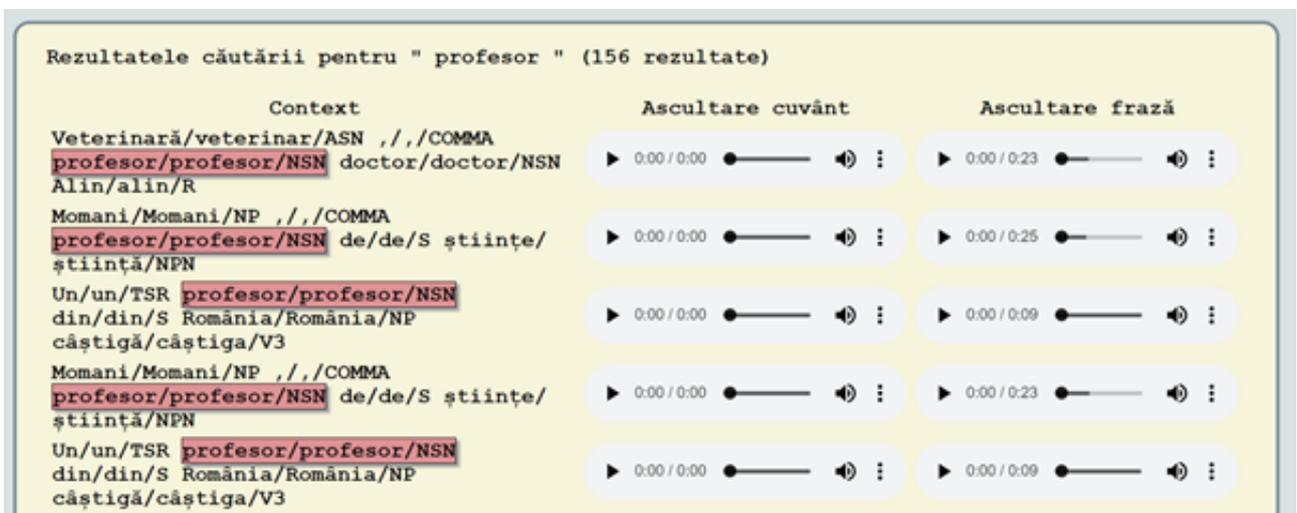


Figure 4: OCQP – results for a query on the oral part of CoRoLa

tools were created based on it. All results were made public, by publishing at specialized conferences or in professional journals, as well as by providing public access to the corpus and associated processing facilities. The bi-modal corpus (text and voice) CoRoLa is the most important public language resource in Romania. The CoRoLa corpus has been and is being used intensively for the objectives of the European projects Presidency MT-Kit, CURLICAT, Nexus-Linguarum, ELRC, ELG, ELE etc.

Another significant corpus was created during the MARCELL Project (Váradi et al., 2020) (<https://marcell-project.eu/>). This specialized multilingual corpus contains legislative documents in 7 languages. The Romanian subcorpus (MARCELL-Ro) (Tufiş et al., 2020) includes over 163,000 documents (257.803.124 distinct words) and is morpho-lexically and terminologically processed (with the annotation of the terms in IATE and EUROVOC). It is distributed free of charge, via ELRC share platform (<https://elrc-share.eu/>) to all interested parties. In addition to the textual corpus, an automatic packed processing stream (docker) was created, also distributed free of charge to all those interested. Part of the MARCELL-Ro corpus (over 265,000 words) has been annotated and manually validated with tags for named entities (organizations, locations, people, time, and legal references) and in addition provides GEONAMES codes for named entities annotated as location. The LegalNERo dataset (Păiş et al., 2021) was used to train a neural system for recognizing named entities in the legal field for the Romanian language. The results obtained (F-score of 90.36) are competitive, at the level of the best world results.

Other datasets, MoNERo (Mitrofan et al., 2019) – publicly released ([https://www.racai.ro/media/MoNERo\\_2019.7z](https://www.racai.ro/media/MoNERo_2019.7z)) and its syntactically parsed version SiMoNERo (Barbu Mititelu, V., Mitrofan, M., 2020), are gold standards for biomedical domain, manually annotated with four types of domain-specific named entities. They were created for the purpose of training and evaluating NER systems in the medical domain. These datasets (LegalNERo, MoNERo and SiMoNERo) are multiple level annotated (lexical, morphologic, and syntactic), hand validated and corrected by experts, thus being extremely valuable for building, fine-tuning, and evaluating various applications (creating or enriching specific terminologies, machine translation systems, anonymization tools, etc.).

### 3.3 Speech resources and datasets for Romanian language

Besides the textual linguistic resources mentioned before, ICIA developed other language resources for supporting speech data processing. RoLEX is a phonological lexicon, developed in the ReTeRom project, providing morphosyntactic information, lemma, syllabification, stress, and phonetic transcription of words. Within the ReTeRom project, multiple technologies for Romanian language were developed. These include text-to-speech synthesis with expressivity, speech recognition models, technologies for processing written Romanian language and a thesaurus with audio and textual resources, annotated at different acoustic and linguistic levels. In this context, RoLEX was constructed based on the vocabulary extracted from the textual component of a speech corpus that contained data from the Romanian Wikipedia, news, interviews, talk-shows, spontaneous speech, fairy tales, novels. Syllabification, stress, and phonetic transcription information is based, partially, on previous resources like RoSyllabiDict (Barbu, 2008) and MaRePhor (Toma et al., 2017). The MaRePhor vocabulary contains a total of 72,375 entries from the Romanian Scrabble Association's official list of words and the entries from an additional 15,517 words dictionary, developed according to the SpeechDat (<https://www.speechdat.org/>) specifications. Following the automatic processing, and manual corrections on the RoLEX lexicon, the outcome was the largest validated resource of this type available for Romanian language (330,866 entries).

The ReTeRom project also created extensive bi-modal resources, managed by an innovative platform, COBILIRO (Cristea et al., 2020), developed by UAIC and on which partners from UPB, UTCN and ICIA uploaded bimodal resources which were further processed with TEPROLIN ([http://relate.racai.ro/?path=teprolin/doc\\_dev](http://relate.racai.ro/?path=teprolin/doc_dev)), the processing flow implemented by ICIA.

ROBIN, another complex project in which ICIA coordinated one of the component projects (ROBIN-Dialog) provided the community with important linguistic resources for dialogues in Romanian with the robot PEPPER in specified discourse universes (a complex dictionary, a corpus of dialogues) and a general module for managing communication with the robot (Tufiş et al., 2019), (Ion et al., 2020). The ROBIN Technical Acquisition Speech Corpus (RTASC) (Păiş et al., 2021) was

created as a read speech corpus in Romanian language to be used for the development of a speech-mediated dialog system with a personal robot. It was recorded by 6 native Romanian speakers of different genders (3 males and 3 females) and ages. The text component of the corpus was automatically annotated with information such as lemma, part-of-speech tags, and dependency parsing. In addition to text and audio data, metadata was stored, containing corpus and speaker characteristics, including number of sentences, total duration, speaker's gender and age, number of recorded files by each speaker, information about recording device used. To anonymize the speaker related data, the name is not given and the age is stored only as intervals (for example "40-50" years). All the new linguistic resources were further converted to linguistic linked data format, to open more ways for its exploitation as well as to allow linking with other corpora and facilitate queries that span multiple datasets. We adhered to the linguistic link open data in the context of the challenging Nexus Linguarum COST action (<https://nexuslinguarum.eu/>).

Participation in COST projects (LITHME, NEXUS-Linguarum, PAN) as well as in the dissemination of EC policies in the field of language technologies (European Language Grid, European Language Equality and European Language Resource Coordination) has placed ICIA among the European institutions of excellence in the field of artificial intelligence focused on natural language technologies.

### 3.4 Recent developments of language technologies for Romanian language

The research topics of the institute are aligned with the current priorities in the field of artificial intelligence, machine learning and natural language processing, capitalizing on the achievements of previous years:

- Processing texts in Romanian with the help of complex neural networks
- Linguistic resources for Romanian language processing in the current global context (Link Linguistic Open Data) in close collaboration with the Nexus-Linguarum project
- Intelligent systems for stylistic and pragmatic analysis, from a polyphonic perspective, of language on the social web
- Affective computing system for human voice analysis

In all the projects in which the researchers of the institute participated, remarkable results were obtained: linguistic resources (both textual and oral) of great size and special quality, new tools, superior to the previous ones and internationally competitive, publications at international reference conferences and associated workshops (LREC, EMNLP, NAACL, NLDB, Global WordNet Conference, RANLP, SpeD, etc.), in ISI journals (Artificial Intelligence Reviews, Proceedings of the Romanian Academy, Studies in Informatics and Control) as well as book chapters in volumes published by prestigious publishing houses (Springer, ACL, Hungarian Academy Publishing House).

The newest (neural) processing tools of the Romanian language have been made public on the git-hub site of the institute (<https://github.com.racai.ai/repositories>). This new architecture, called RODNA (Romanian Deep Neural Network Architectures) is a Python 3/TensorFlow /Keras project and includes high-performance, essential modules specifically targeted at Romanian text processing (sentence splitter, tokenizer, morphology analyzer, POS tagger, dependency parser).

A remarkable achievement, with great impact among the NLP community is the RELATE portal (<https://relate.racai.ro/>) which provides users with all the fundamental tools (BLARK) for processing the Romanian language, written or spoken (Păiș et al., 2019, 2020), (Păiș, 2020). It includes technologies and language resources developed by ICIA and its partners in several projects: COROLA, RETEROM, ROBIN, PRESIDENCY, MARCELL, CURLICAT. Additionally, it allows for creation of manually annotated gold corpora and was successfully used for creating the LegalNERo named entity corpus and the RTASC speech corpus.

The Basic Language Advanced Research Kit for Romanian (BLARK-Ro) is available as a configurable processing chain, ensuring text normalization, diacritical marks restoration, punctuation restoration, phrase and lexical segmentation, syllable division, accent identification, phonetic transcription, expanded abbreviations, morpho-lexical annotation, lemmatization, recognition of named

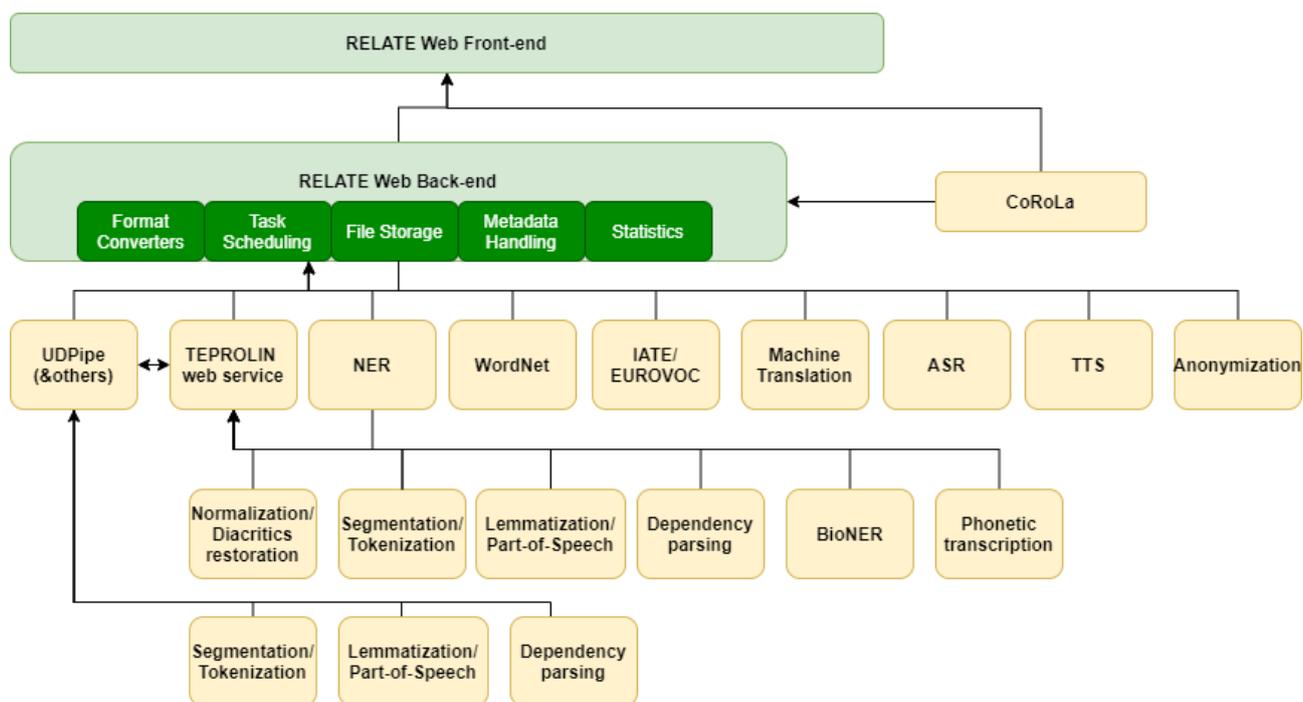


Figure 5: The architecture of RELATE portal

entities, syntactic analysis). Besides basic processing modules, the RELATE portal integrates the interfaces to CoRoLa corpus query and RoWordNet lexicons, EUROVOC classification of documents, anonymization of texts and automatic text and voice translation (ro-en). The RELATE portal is open source (<https://github.com/racai-ai/RELATE>) and offers users a range of (neural) language models and pre-trained semantic vectors, ready to be incorporated into practical applications. The implementation of the RELATE portal is aligned with the development philosophy of European Language Grid (<https://www.european-language-grid.eu/>), relying on WEB services, REST APIs and DOCKERs packaging of processing flows. The services may be distributed on multiple network nodes and may be consumed directly from the partners. Being heavily used for deep processing of large and very large corpora (more than 200,000 documents) in our international running projects, we may say that RELATE reached a maturity implementation level and it is a robust infrastructure, allowing for both CPU and GPU processing.

Architecturally, RELATE has two main components (see figures 5 and 6): a Web Front-end (freely accessible) and a Web back-end (accessible after log-in with free access credentials). Both interfaces offer the full set of 18 (for now) processing modules for text and speech data and various visualization modes. While the Web Front-end allows processing of a single document, the Web back-end facilitates processing of mass textual data by parallel processing (task scheduling, services from multiple nodes). Additionally, the back-end offers services for corpora management (create, upload, download, archive, annotate, statistics, visualize, converting among formats CoNLL-U, CoNLL-U Plus, XML, JSON, RDF), metadata management, statistics, creation of gold corpora: integrates BRAT for NER, speech recorder for speech-text aligned corpora.

The RELATE portal offers its users a series of pretrained neural language models and semantic vectors (word embeddings): ROBERT (available in two versions, cased and uncased), word embeddings from CoRoLa corpus, annotation models for lemma, UPOS/XPOS tagging, classification and dependency parsing models.

### 3.5 Open access to resources and technologies for Romanian language

As mentioned several times, almost all the language resources and processing tools are open source, available in the github of the institute (<https://github.com/racai-ai>). The content of this github complements the resources and tools for Romanian available on the ELRC-share platform (Figure 9).

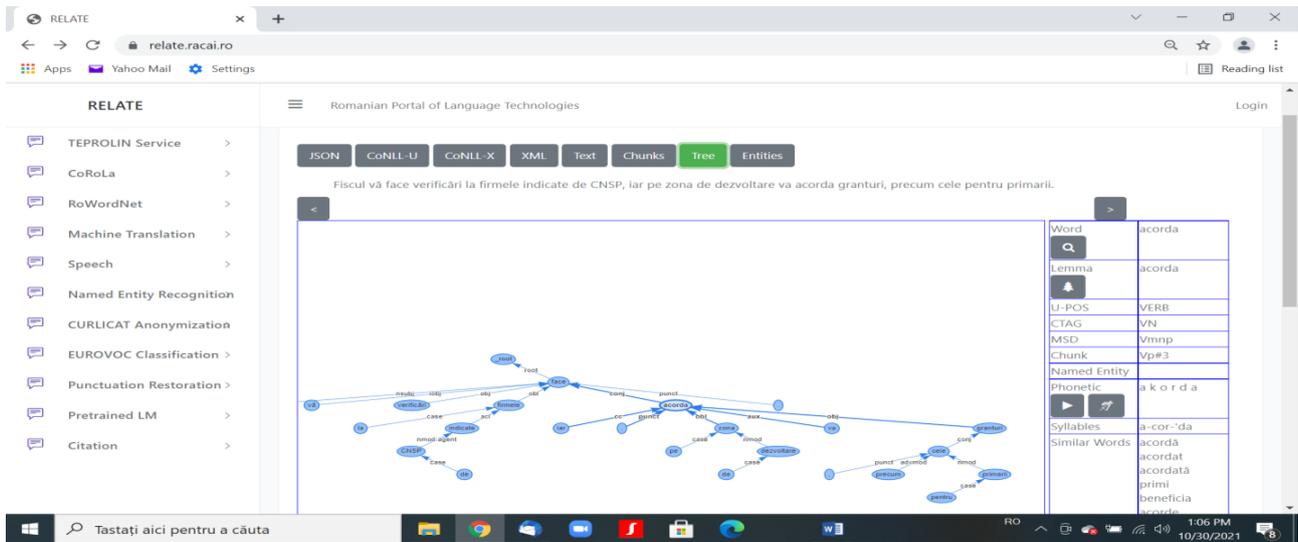


Figure 6: The visualization of a parse tree

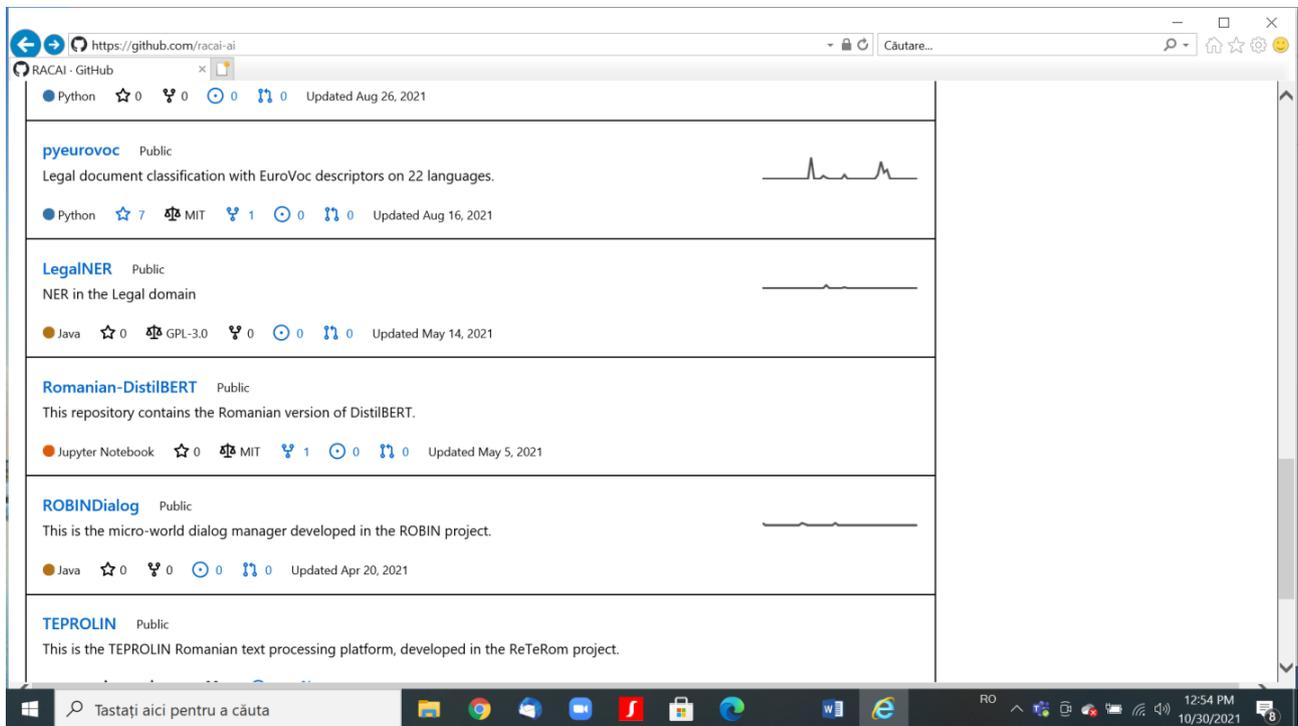


Figure 7: Some open-source tools and language resources available in the github of the institute

The screenshot displays the GitHub profile for RACAI (Research Institute for Artificial Intelligence "Mihai Drăgănescu", Romanian Academy). The page features a navigation menu with 'Overview', 'Repositories', 'Packages', 'People', and 'Projects'. Under the 'Popular repositories' section, several projects are listed:

- pyeurovoc**: Legal document classification with EuroVoc descriptors on 22 languages. (Python, 7 stars, 1 fork)
- RobinASR**: Romanian Automatic Speech Recognition from the ROBIN project. (Python, 2 stars, 4 forks)
- RELATE**: RELATE platform for processing Romanian language. (JavaScript, 1 star)
- RoLLOD**: Tools for Romanian Linguistic Linked Open Data. (Java, 1 star)
- IATE-EUROVOC-Annotator**: (Public repository)
- TermEval2020**: Automatic Term Extraction (ATE) system that participated in the TermEval 2020 competition. (Public repository)

On the right side, the 'People' section indicates that the organization has no public members. Below it, 'Top languages' and 'Most used topics' are shown as 'Loading...'. The browser's address bar shows the URL 'https://github.com/racai-ai' and the Windows taskbar at the bottom displays the time as 12:49 PM on 10/30/2021.

Figure 8: Other open-source tools and language resources available in the github of the institute

## 4 Conclusions and further work

The resources and technologies available for Romanian, developed since the publishing of META-NET report, filled most of the identified gaps. The running ELE (European Language Equality) and ELG (European Language Grid) projects will publish the Strategic Agenda and Roadmap for reaching the goal of technological European language equality by 2030. The language reports will be updated to reflect the current state of play in European language technology. The ICIA actions reported here answered the commandments defined 10 years ago. The advancement of language science and technology, certainly, will call for new priorities and more efforts to meet the Agenda and the roadmap for reaching the digital language equality by 2030.

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This article is a tribute to Prof. Ioan Dzițac, to whom this special issue of the journal is dedicated. He was not only the heart of this journal, but also the champion of Romanian information and communication science promotion. As one of the managers of the International Journal of Computers, Communication and Control, for which he was one of the founders, Ioan managed, in less than one year, to include the journal in the mainstream publications. The regular editions (biennial) of the Conference on Computers Communications and Control (ICCCC) he founded, were masterly managed and being among the highest quality scientific events in Romania got quickly international reputation and thus, attracted top lecturing scholars. One of these, was Prof. Lotfi Zadeh, a giant of the information science, who honoured Prof. Dizițac, Acad. Fl. Filip and myself in co-organizing the reference workshop From

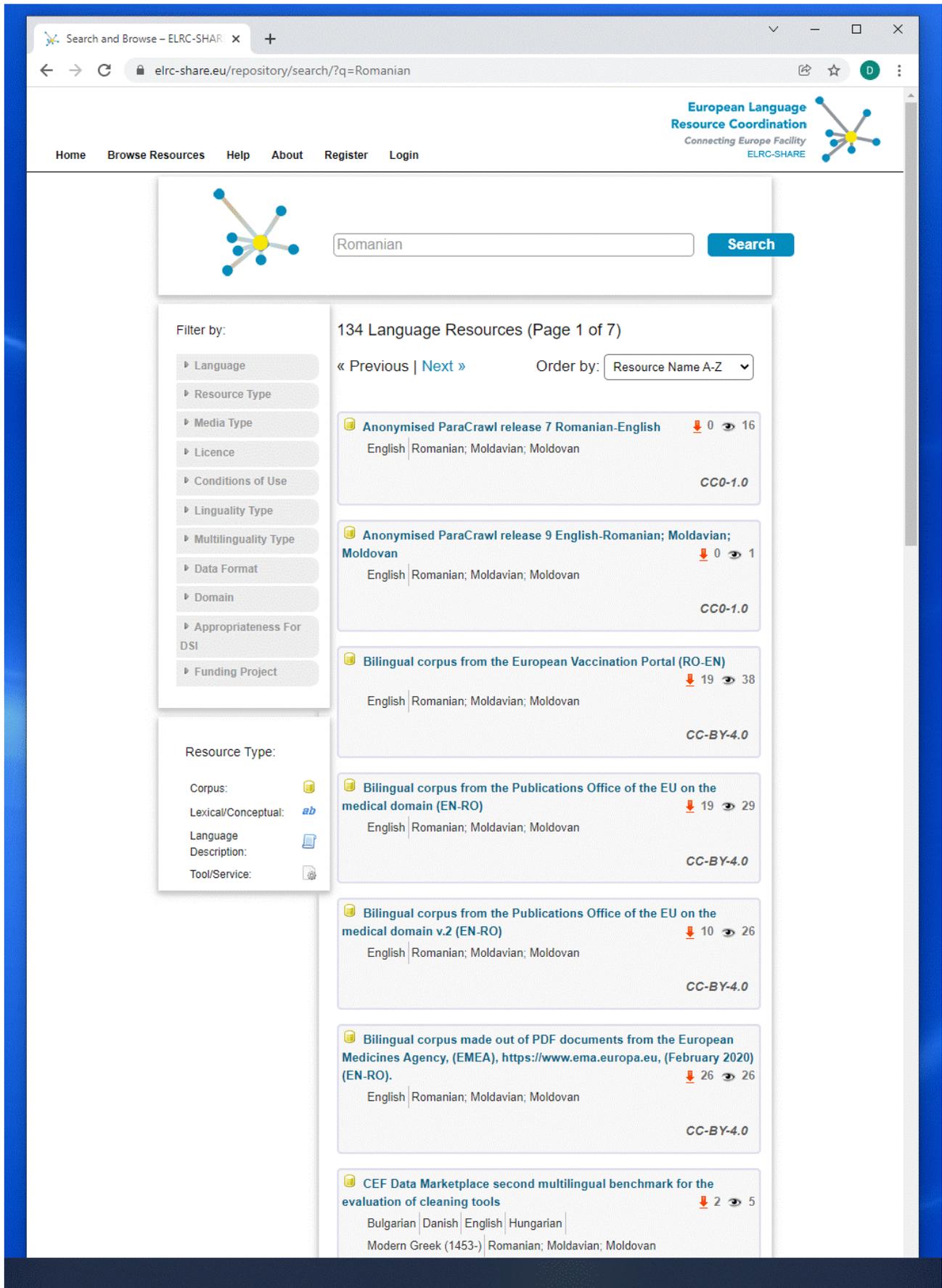


Figure 9: ELRC-Share lists 134 language resources and tools for Romanian language

Natural Language to Soft Computing: New Paradigms in Artificial Intelligence (Zadeh et al., 2008). This year, ICCCC will be the 8th edition and everybody will miss Ioan Dziţac but will feel him around with his always warm and carrying presence.

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