

# Integration of computer algebra tools into OSTIS applications

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**Abstract**—From the standpoint of the need for convergence and unification of intelligent computer systems of a new generation, the issues of technology development and modernization, integration of the OSTIS metasystem with the Wolfram Mathematica computer algebra system are discussed. The current results and plans for the semantic representation of abstract mathematics on the Wolfram Language platform are noted as benchmarks. The software solutions implemented in the Wolfram Knowledgebase are marked and illustrated with examples.

**Index Terms**—Semantic analysis, Wolfram Mathematica, Wolfram Knowledgebase, Entity

## I. INTRODUCTION

Following the assessment given in [1] of the current state of work in the field of Artificial Intelligence (AI), we can note the active local development of various areas (non-classical logic, formal ontologies, artificial neural networks, machine learning, soft computing, multi-agent systems, etc.), but there is no comprehensive increase in the level of intelligence of modern intelligent computer systems. What is especially relevant at the moment? Convergence and integration of all areas of Artificial Intelligence and the corresponding construction of a general formal theory of intelligent computer systems (ICS) are required.

It is important to transform the modern variety of tools (frameworks) for the development of various components of ICS into a single technology for integrated design and support of the full life cycle of these systems, which guarantees the compatibility of all components being developed, as well as the compatibility of ICS themselves as independent entities interacting with each other within complex automation systems of complex types of collective human activity. Convergence and unification of intelligent computer systems of the new generation and their components is necessary. At the same time, convergent solutions mainly mean optimized complexes containing everything necessary to solve AI problems, organized or configured for the effective use of information resources, to simplify implementation processes; in particular, it should be possible to solve certain tasks with optimization requirements and achieve maximum performance, and in all implementations – optimized for ease of use. The key reasons of methodological problems of the current state of Artificial Intelligence, as well as a number of required actions to solve them are indicated in [1]. Supporting these concepts, we note

that such problems are solved when developing, improving, systematically updating the content and expanding the capabilities of computer algebra systems. The following examples illustrate several methodological and technical solutions for convergence and integration of various types of knowledge implemented in the computer algebra system Wolfram Mathematica (WM), Wolfram Language (WL).

## II. WOLFRAM MATHEMATICA. THE SEMANTIC REPRESENTATION OF PURE MATHEMATICS. THE CURRENT STATE, PLANS

**The current state.** Based on more than thirty years of research, development and use throughout the world, Mathematica and the Wolfram Language are aimed at a long-term perspective and are particularly successful in computational mathematics. About 6000 characters embedded in the Wolfram Language allow you to represent and manipulate a huge variety of computational objects in the system – from special functions to graphics and geometric areas. In addition, the Wolfram Knowledgebase [2] and the associated entity structure [3] allow you to explain/interpret/formalize hundreds of specific "things (facts/situations/objects)". For example: people, cities, food, structures, planets, ... are represented by objects that can be manipulated, they can be cheated.

**Wolfram Mathematica. Immediate plans.** Despite a rapidly and ever-increasing number of domains known to WL, many knowledge domains still await computational representation. In his blog "Computational Knowledge and the Future of Pure Mathematics" Stephen Wolfram presented a grand vision for the representation of abstract mathematics, known variously as the Computable Archive of Mathematics or Mathematics Heritage Project (MHP). The eventual goal of this project is no less than to render all of the approximately 100 million pages of peer-reviewed research mathematics published over the last several centuries into a computer-readable form.

**Wolfram Mathematica. The semantic representation of pure mathematics.** In the blog [4], leading Wolfram specialists present their vision of the future semantic representation of abstract mathematics using two examples: abstract mathematical concepts of functional, topological spaces; concepts and theorems of general topology. It seems that such concepts

and approaches should be used in solving methodological problems of the current state of Artificial Intelligence.

### III. THE WOLFRAM KNOWLEDGEBASE. EXAMPLES

Powering WolframAlpha and WL, the ever-growing Wolfram Knowledgebase (WKB) is by far the world's largest and broadest repository of computable knowledge. WKB, covering thousands of fields, contains carefully selected expert knowledge directly derived from primary sources ([4]). It includes not only trillions of data elements, but also immense number of algorithms encapsulating methods and models from almost every field. The main subject fields of WKB are illustrated in Fig. 1.



Figure 1. The main subject fields of WKB.

The Wolfram Knowledgebase relies on three decades of computable knowledge acquisition. All data in the Wolfram database can immediately be used for computation in WL. Every millisecond of every day, WKB is updated with the latest data.

Let's note a few examples. With a trove of statistics for hundreds of thousands of educational institutions around the world, WolframAlpha can compute answers to intricate questions about education. You can request which academic degrees students of prestigious universities receive. You can also compute the average salary for teachers in your local school district, learn more about student scores, and compare student-teacher ratios among countries and much more. Fig. 2 illustrates the response to the request for the number of students in the Republic of Belarus.

The comparison for the universities of BSU and BSUIR is illustrated in Fig. 3.

### IV. THE WOLFRAM KNOWLEDGEBASE. REPRESENTATION AND ACCESS TO IT

Access to WKB is deeply integrated into WL. Free-form linguistics makes it easy to identify many millions of entities and many thousands of properties and automatically generate precise WL representations suitable for extensive further computation. The Wolfram Language also supports custom entity stores that allow the same computations as the built-in knowledgebase, and can be associated with external relational databases. Note the main groups of WM functions for working with WKB: Entity & EntityClass & EntityValue, Transformations & Computations on Entity Classes, Standard Properties,



Figure 2. How many high school students are there in Belarus.

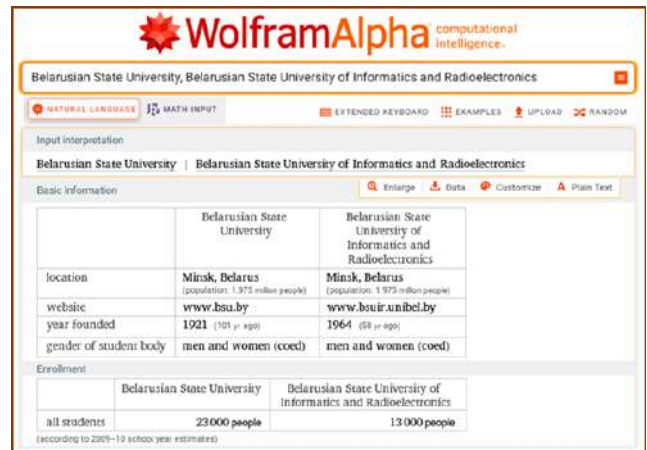


Figure 3. How many high school students are there in Belarus.

Specific Domains, Setting Up Custom Entity Stores, Wolfram Data Repository, Wolfram Data Drop, Setting Up Custom Entity Stores, External Knowledgebases, External Database Connectivity, Web Content, Textual Question Answering, System Configuration. There are more than three subgroups in each of the listed groups. For example, the Textual Question Answering group includes:

- *FindTextualAnswer* attempt to find answers to questions from text;
- *SemanticInterpretation* convert free-form linguistics to Wolfram Language for; *SemanticInterpretation*["string"] attempts to give the best semantic interpretation of the specified free-form string as a Wolfram Language expression;
- *SemanticImport* import data, converting entities etc. to Wolfram Language form,
- *Interpreter* interpret input of various types (e.g. "City", "Date", etc.); Interpreter attempt to interpret strings of a wide variety of types; *Interpreter*[form] represents an interpreter

object that can be applied to an input to try to interpret it as an object of the specified form.

## V. SEMANTIC ANALYSIS

Humans interact with each other through speech and text, and this is called Natural language. Computers understand the natural language of humans through Natural Language Processing (NLP). NLP is a process of manipulating the speech of text by humans through Artificial Intelligence so that computers can understand them. Human language has many meanings beyond the literal meaning of the words. There are many words that have different meanings, or any sentence can have different tones like emotional or sarcastic. It is very hard for computers to interpret the meaning of those sentences.

**NLP. Main applications, tools implemented in the Wolfram Mathematica system:** Speech Recognition, Voice Assistants and Chatbots, Auto Correct and Auto prediction, Email Filtering, Sentiment Analysis, Divertissements to Targeted Audience, Translation, Social Media Analytics, Recruitment, Text Summarisation.

Several representative examples with explanations of the functions of the WL groups Structural Text Manipulation, Text Analysis, Natural Language Processing are mentioned below. In a sense, these categories are conditional, there are a lot of functions and capabilities implemented by them. For example, the Structural Text Manipulation subgroup may include the following: *TextCases* – extract symbolically specified elements (*TextCases*[text,form] gives a list of all cases of text identified as being of type form that appear in text); *TextSentences* – extract a list of sentences (*TextSentences*["string"] gives a list of the runs of characters identified as sentences in string); *TextWords* – extract a list of words (*TextWords*["string"] gives a list of the runs of characters identified as words in string); *SequenceAlignment* – find matching sequences in text; *TextStructure*["text"] generates a nested collection of *TextElement* objects representing the grammatical structure of natural language text [5].

An example and the result of executing the *TextStructure* function to the text "Open Semantic Technologies for Intelligent Systems" with the option "ConstituentTree" is shown in Fig. 4

Open	Semantic	Technologies	for	Intelligent	Systems
Verb	Proper Noun	Proper Noun	Preposition	Proper Noun	Proper Noun
Noun Phrase			Noun Phrase		
				Prepositional Phrase	
					Noun Phrase
					Verb Phrase
Sentence					

Figure 4. The result of executing the *TextStructure* function with the option "ConstituentTree".

Variants for visualizing the components of the analyzed phrase with the settings "ConstituentGraphs", "DependencyGraphs" are shown in Fig. 5.

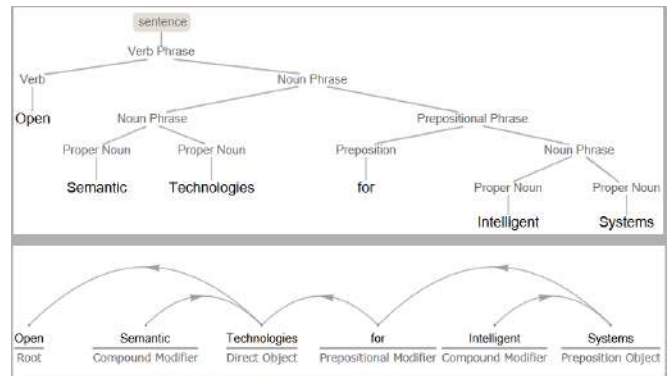


Figure 5. Results of executing the *TextStructure* function with the settings "ConstituentGraphs", "DependencyGraphs".

**NLP. Examples of using the FindTextualAnswer function.** Answer questions in natural language from the text [6].

*FindTextualAnswer*[text,"question",n] gives a list of up to n answers that appear most probable. *FindTextualAnswer*[text,"question",n,prop] gives the specified property for each answer.

In the two examples below, the processing object is text *International scientific and technical conference proceedings "Open Semantic Technologies for Intelligent Systems (OSTIS)". Established: 2011. Scientific areas of the conference: 05.13.11, 05.13.15, 05.13.17.* In the query variant with the option "Date of establishment of the conference?" the answer is

"2011"

In the request variant with the options "Date of the conference establishment?", "Scientific directions of the conference?" the answer is a list

"2011", "05.13.11, 05.13.15, 05.13.17"

In the following example, the processing object is text *International scientific and technical conference proceedings Open Semantic Technologies for Intelligent Systems (OSTIS). Established: 2011. Scientific areas of the conference: Theory of Informatics, Software for Computers, Computer Complexes and Networks, Computing Machines and Complexes and Computer Networks.*

In the query variant with the option "Scientific areas of the conference?" the answer is –

"Theory of Informatics, Software for Computers, Computer Complexes and Networks, Computing Machines and Complexes and Computer Networks"

Next example illustrates the search in the text and the fixation of three signs. The object of processing is text *International scientific and technical conference proceedings Open Semantic Technologies for Intelligent Systems (OSTIS). Established: 2011. Program Committee: Kuznetsov Oleg Co-Chair, Dr. of Techn. Sciences, Professor, Academician of the Russian*

Academy of Natural Sciences, Moscow, Russia; Golenkov Vladimir Co-Chair, Dr. of Techn. Sciences, Professor, Minsk, Belarus; ... Arefiev Igor Dr. of Techn. Sciences, Professor, Szczecin, Poland; ... Globa Larisa Dr. of Techn. Sciences, Professor, Kyiv, Ukraine ... .

In the query variant with the options "City", "Country", "Date", the response is –

```
<|"City" -> "Moscow", "Minsk", "Szczecin", "Kyiv",
"Country" -> "Russian", "Russia", "Belarus", "Poland",
"Ukraine", "Date" -> "2011">
```

## VI. EXAMPLES OF EXTRACTING KNOWLEDGE, ENTITIES, OR TOPICS FROM WIKIPEDIA ARTICLES

WikipediaData utilizes MediaWiki's API to retrieve article and category contents and metadata from Wikipedia [7]. An article may be specified as a string or a Wolfram Language entity. The extraction of articles associated with language entities is provided by the WM TextSentences function, in particular, you can work with Wikipedia resources. *TextSentences*["string"] gives a list of the runs of characters identified as sentences in string [8]. *WikipediaData*[article] gives the plain text of the specified Wikipedia article. *Entity*["type",name] represents an entity of the specified type, identified by name. *WikipediaData*[article,property,options] gives the value of the specified property, modified by optional parameters, for the given Wikipedia article. Below are the results of executing the *TextSentence* function, with the parameters *WikipediaData*, *Entity*, "Person", "AlexeiLeonov" and displaying a list of language versions of Wikipedia (*LanguagesList*) containing the corresponding article (in Fig. 6)

```
TextSentences[WikipediaData[Entity["Person", "AlexeiLeonov"]];]; 3]
Alexei Arkhipovich Leonov (30 May 1934 – 11 October 2019)
was a Soviet and Russian cosmonaut, Air Force major general, writer, and artist.
On 18 March 1965, he became the first person to conduct a spacewalk, exiting the
capsule during the Voskhod 2 mission for 12 minutes and 9 seconds.
He was also selected to be the first Soviet person to land on the Moon although the project was cancelled.)

WikipediaData["Alexei Leonov", "LanguagesList"]
{Afrikaans, Aragonese, Arabic, Egyptian Arabic, Asturian, Azerbaijani, Belarusian,
Belarusian (Taraskevica orthography), Bulgarian, Bangla, Bosnian, Catalan, Czech, Chuvash, Welsh, Danish,
German, Greek, Esperanto, Spanish, Estonian, Basque, Persian, Finnish, Faroese, French, Scottish Gaelic, Galician,
Hebrew, Hungarian, Armenian, Indonesian, Ido, Italian, Japanese, Georgian, Korean, Kyrgyz, Latin, Luxembourgish,
Lithuanian, Latvian, Malagasy, Macedonian, Malayalam, Malay, Dutch, Norwegian Nynorsk, Norwegian Bokmål, Polish,
Portuguese, Quechua, Romanian, Russian, Scots, Serbo-Croatian, Sinhala, Simple English, Slovak, Slovenian,
Serbian, Swedish, Tamil, Tajik, Thai, Turkish, Tatar, Ukrainian, Vietnamese, Wu Chinese, Mingrelian, Chinese}
```

Figure 6. TextSentences. WikipediaData. Entity. AlexeiLeonov. Languages-List.

Fig. 7 illustrates the system's response to the execution of the *WikipediaData* function with the parameters "Voskhod 2", "ImageList":

**List of rules representing links between categories.** *WikipediaData*["Category"->category,property,options] gives the value of the specified property, modified by optional parameters, for the given Wikipedia category. "MaxLevelItems" – number of links to follow at each level. "MaxLevel" – number of levels to search outward from the specified page.

Fig. 8 shows the result of the function *WikipediaData*["Category"->"Artificial intelligence", "CategoryLinks",

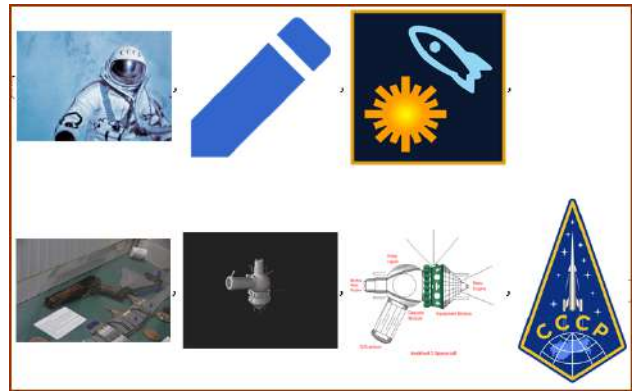


Figure 7. TextSentences. WikipediaData. Entity. Voskhod 2. ImageList.

"MaxLevelItems"->5, "MaxLevel"->3] execution in the form of a graph:

You can output all categories separately, for example, for Applications of artificial intelligence, the system will output: "Category:Agent-based software", "Category:Applied data mining", "Category:Applied machine learning", "Category:Automated planning and scheduling", "Category:Computer vision software".

Examples of **extracting in the knowledge cloud, entities or topics, lists of rules representing relationships between categories** are given in the description of the *WordCloud* function. (*WordCloud*[ $s_1, s_2, \dots$ ] generates a word cloud graphic in which the  $s_i$  are sized according to their multiplicity in the list.) The illustration in Fig. 9 is obtained in Wolfram Mathematica, the functions *Delete stop words* and *Text Words* are used. (*DeleteStopwords*[list] deletes stopwords from a list of words; *TextWords*["string"] gives a list of the runs of characters identified as words in string.)

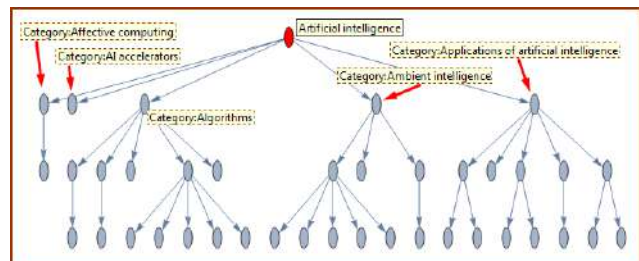


Figure 8. Graph for "Artificial intelligence".

## VII. INTELLECTUALIZATION OF USER INTERFACES. EXAMPLES OF IMPLEMENTATION IN WOLFRAM MATHEMATICA

Currently, the user interfaces of many computer systems (including intelligent computer systems) in most implementations are not semantically friendly. For users, interaction with computer systems is often a "bottleneck" that has a significant impact on the efficiency of automation of human activities. The basis of the modern organization of user interaction with a computer system is the paradigm of a trained, competent user



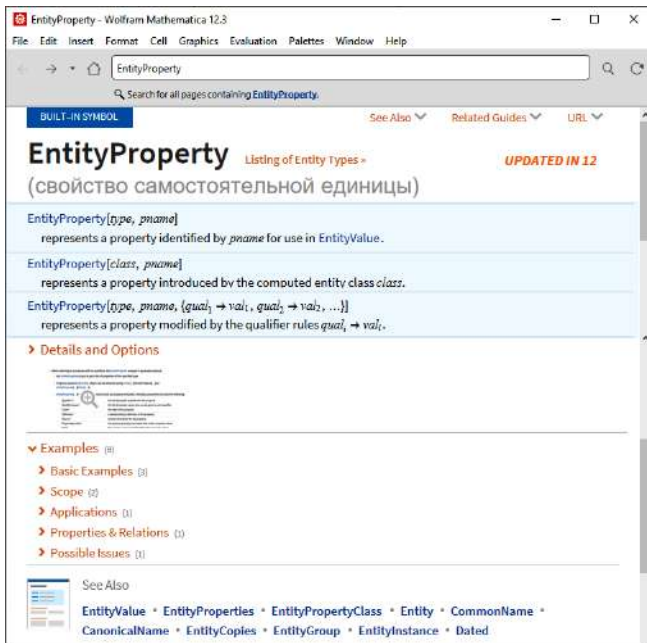


Figure 11. EntityProperty. Article-description ( notebook document) structure

Figure 12 shows the steps of work when the country (United States) is changed (Belarus) in the basic example, and then queries are selected following the prompts in the tooltips.

It should be noted that it is also possible to state certain successes in solving problems of underground hydrodynamics [9], forest fires [10] on the formation and filling of knowledge bases with Wolfram Mathematica tools during processing, accumulation and interpretation of the results of computational experiments.

### VIII. CONCLUSION

Several representative examples of working with knowledge bases by means of the Wolfram Mathematica system are discussed. Since the functions of the Mathematica core can be used in programs developed on other platforms, presented results can be interpreted as proposals for innovative improvement of existing tools, components of intelligent computer systems.

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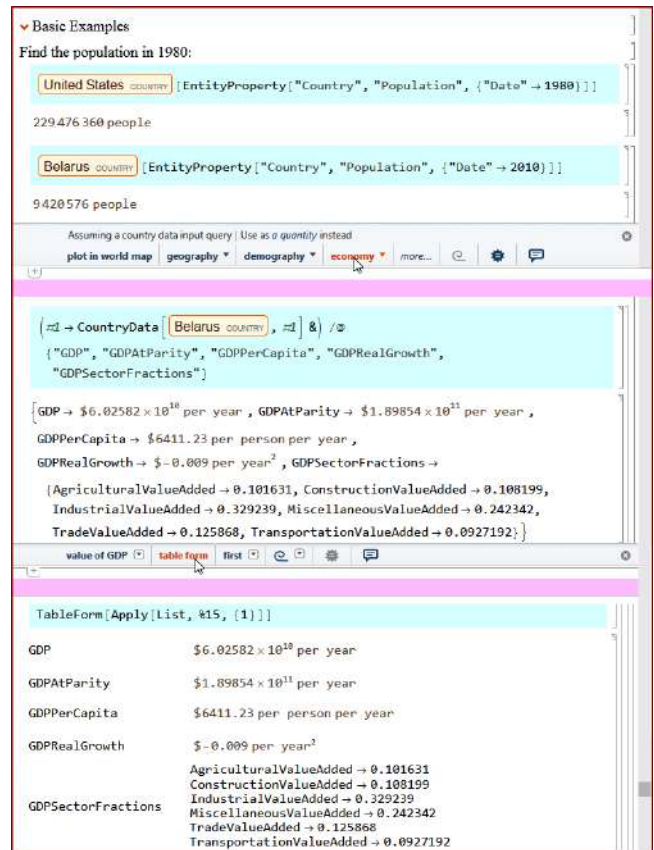


Figure 12. An illustration of the use of a ruler (palette) of suggestions for the following calculations.

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## Интеграция инструментов компьютерной алгебры в приложения OSTIS

Таранчук В. Б.

С позиций необходимости конвергенции и унификации интеллектуальных компьютерных систем нового поколения обсуждаются вопросы технологии разработки и модернизации, интеграции средств метасистемы OSTIS с системой компьютерной алгебры Wolfram Mathematica.

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