

# Testing of the Speech Recognition Systems Using Russian Language Models

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## Abstract

This article includes the results of testing an existing speech recognition systems, using the Russian language model and dictionary. Objects of the research are question-answering systems, call-center processes, methods and systems for language processing. Several problems with Russian language speech recognition were identified and studied.

## Introduction

In the research, algorithms for speech recognition are considered. These algorithms are used by the following systems for speech recognition: Sphinx [3], Yandex.Speech Kit [7, 8], Google Cloud Speech-to-Text [1, 5-6].

CMU Sphinx [3] – is a major open-source cross-platform project for speech recognition, developed in Carnegie Mellon University. It includes series of the Sphinx systems and program for studying acoustic model, which is called Sphinx Train.

Currently, CMU Sphinx includes language models for the several languages: English, Russian, German, Chinese and others. It gives an opportunity to create acoustic models for other languages. The project uses BSD license, which allows distributing the product commercially, the system also includes tools for speech recognition (keyword definition, pronunciation evaluation). The development is still in progress.

Yandex.Speech Kit – is a complex of speech technologies, developed by Yandex Company, it includes speech recognition and synthesis. Speech Kit is used as the cloud service Speech Kit Cloud and Speech Kit Mobile [7-8].

Speech Kit Cloud SDK – is a program, which allows developers to use instruments for speech recognition made by Yandex. Infrastructure of the service's design based on probability of high loads, to provide access and trouble-free system operations.

Interaction with Speech Kit Cloud is performed via HTTP API and includes different functions:

1. Interactive Voice Response

2. Automatic calls to transmit information about new services, to confirm an order or delivery, to remind about the record, the collection of meter readings.
3. Inquiries by phone without operator's participation, recording for reception and maintenance.
4. The voice interface of "smart house" systems.
5. The voice interface of robots.
6. Site management, using voice.

Speech Kit Cloud is designed to recognize small speech fragments about 30 seconds long [7].

Speech Kit Mobile SDK [8] is a program that allows to embed speech recognition and synthesis into a mobile application on iOS, Android or WindowsPhone. Speech Kit Mobile SDK is used in the following Yandex services: Yandex Search, Browser, Taxi, Maps, Navigator, Translator, Market, Music, Launcher, Auto, Keyboard.

Google Cloud Speech-to-Text is a technology, which allows developers to convert audio into text by applying neural network models, using the API, which Google Cloud Speech provides. The API supports 120 languages and options for supporting the user base. The system allows using voice commands, managing, rewriting an audio from call centers and more. It can handle streaming or pre-recorded audio in real time using Google's machine learning technology.

## 1 Deploying process of the speech recognition systems for testing the methods and algorithms

### Deploying CMU Sphinx and Google Speech Recognition.

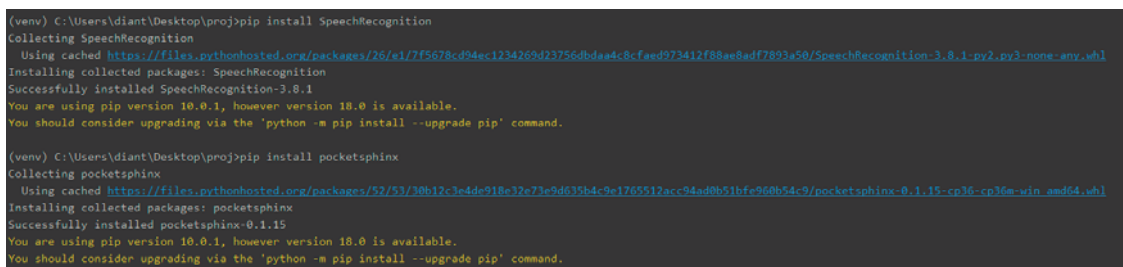
To deploy the Pocket Sphinx system and Google Speech Recognition, a solution from a third-party developer was used, it is represented as a Speech Recognition Python package. It can be installed using the Pip tool:

```
pip install SpeechRecognition
```

The installation requires Python 3.3 and later, Pip. The Python wrapper package for the Pocket Sphinx system must be installed as well:

```
pip install pocketsphinx
```

We used Python 3.6. Installation was performed in the Windows terminal from PyCharm (using virtual environment) (Figure 1).



```
(venv) C:\Users\diant\Desktop\proj>pip install SpeechRecognition
Collecting SpeechRecognition
  Using cached https://files.pythonhosted.org/packages/26/e1/7f5678c094ec1234269d23756dbda4c8cfaed973412f88ae8ad7893a50/SpeechRecognition-3.8.1-py2.py3-none-any.whl
Installing collected packages: SpeechRecognition
Successfully installed SpeechRecognition-3.8.1
You are using pip version 10.0.1, however version 18.0 is available.
You should consider upgrading via the 'python -m pip install --upgrade pip' command.

(venv) C:\Users\diant\Desktop\proj>pip install pocketsphinx
Collecting pocketsphinx
  Using cached https://files.pythonhosted.org/packages/52/53/30b12c3e4de918e32e73e9d635b4c9e1765512acc94ad0b51bf960b54c9/pocketsphinx-0.1.15-cp16-cp36m-win_amd64.whl
Installing collected packages: pocketsphinx
Successfully installed pocketsphinx-0.1.15
You are using pip version 10.0.1, however version 18.0 is available.
You should consider upgrading via the 'python -m pip install --upgrade pip' command.
```

Figure 1. Installing the Speech Recognition package

By default, only the model for English is installed, the model for Russian is available by reference:

<https://sourceforge.net/projects/cmusphinx/files/Acoustic%20and%20Language%20Models/Russian/>

Files of one of the downloaded models should be placed in the pocket sphinx-data folder in the folder of the speech\_recognition package (Figure 2).

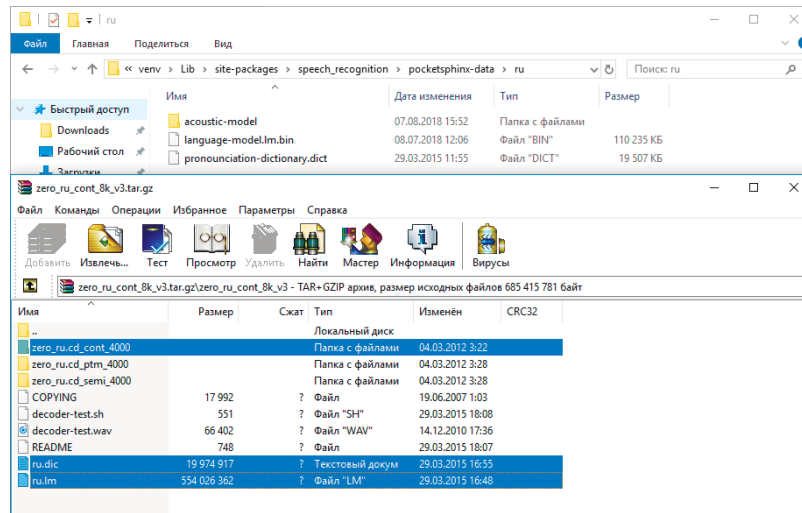


Figure 2. Replacing files

After that, the launch of the following Python script will display the result of speech recognition in both systems (the data from the pre-recorded audio file is recognized - Figure 3).

The GitHub repository of the SpeechRecognition package and installation instructions:

[https://github.com/Uberi/speech\\_recognition](https://github.com/Uberi/speech_recognition)

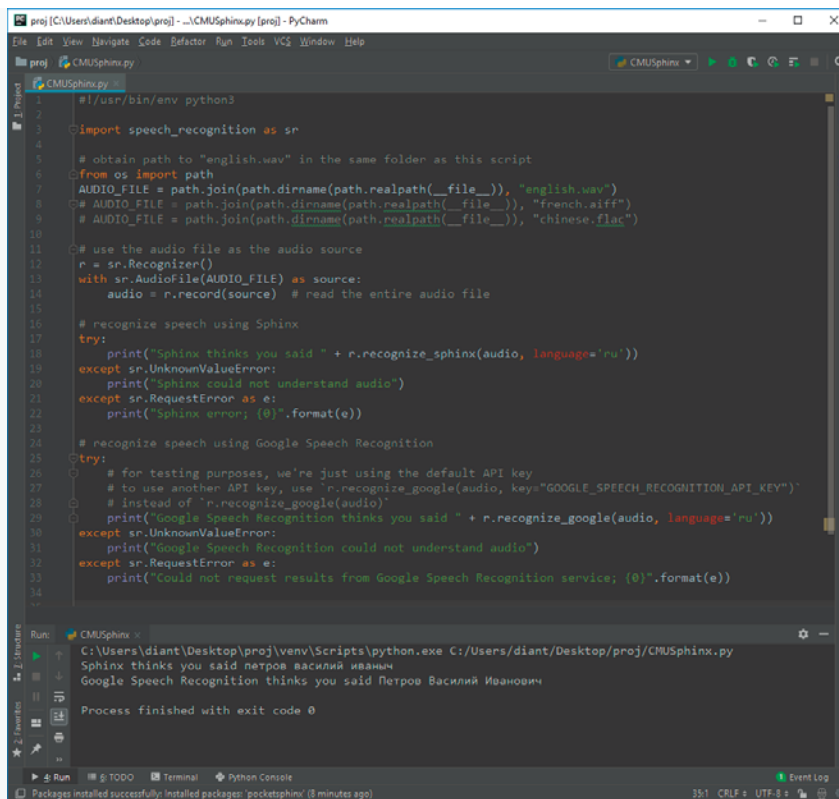


Figure 3. Launch of the script and speech recognition results output

### Deploying Yandex.SpeechKit

In order to work with the system, a key must be obtained on the site: <https://developer.tech.yandex.ru/>. The test key (Figure.4) only works for a month and has a limit on the number of requests.

**Key #3**  
Подключение сервиса  
SpeechKit Cloud

Ответьте, пожалуйста, на несколько вопросов:

\* Фамилия

\* Имя

\* Тип проекта

коммерческий (для решения бизнес-задач)

некоммерческий (личный, благотворительный, образовательный)

Описание проекта

Я согласен получать сообщения о технологии SpeechKit.

\*  Я принимаю условия использования сервиса Yandex SpeechKit Cloud.

Figure 4. Obtaining a key

Speech Kit Cloud API is a WebAPI, which means that in order to work with the system, a POST request should be sent, and then an XML file with the recognition results will be processed (Figures 5-6). Instructions for interacting with Speech Kit Cloud API are presented in [7].

```
import urllib.request as req
from xml.dom import minidom

key = '1e692527-ad23-4fdb-b463-b34e545f9a13'
uuid = 'aaaaaaaaaaaaaaaaaaaaaaaaaaaaab'
file = 'english.wav'

def read_file():
    with open(file, 'rb') as f:
        return f.read()

def get_text_xml(data):
    request = req.Request(url='https://asr.yandex.net/asr_xml?uuid=' + uuid +
        '&key=' + key + '&topic=queries',
        headers={'Content-Type': 'audio/x-wav', 'Content-Length': len(data)})
    response = req.urlopen(url=request, data=data)
    return response.read()

def parse_xml(xml_string):
    xmldoc = minidom.parseString(xml_string)
    if
    xmldoc.getElementsByTagName('recognitionResults')[0].attributes['success'].value
    == '1':
    return xmldoc.getElementsByTagName('variant')[0].childNodes[0].nodeValue

binary = read_file()
xml = get_text_xml(binary)
best_variant = parse_xml(xml)
print(best_variant)
```

Figure 5. Python script for Yandex.SpeechKit

```

Run: YandexSpeechKit >
C:\Users\diant\Desktop\proj\venv\Scripts\python.exe C:/Users/diant/Desktop/proj/YandexSpeechKit.py
петров василий иванович
Process finished with exit code 0

```

Figure 6. Output result of the script for Yandex.SpeechKit

## 2. Research and testing of the speech recognition methods and algorithms

This section presents the results of testing speech recognition methods and algorithms using existing systems Sphinx Speech Recognition, Yandex Speech Kit and Google Speech Recognition.

Fragments of the testing results for the Sphinx Speech Recognition system are presented in Tables 1-4. It includes only cases with errors.

Table 1 –Recognition of names

| Voiced text        | CMU Sphinx result | List of errors<br>(0 – if none is present) | Yandex Speech Kit result | List of errors<br>(0 – if none is present) | Google Speech Recognition result | List of errors<br>(0 – if none is present) |
|--------------------|-------------------|--|--------------------------|--|----------------------------------|--|
| <b>Names</b>       |                   |  |                          |  |                                  |  |
| Евгений            | нет не имею       | Wrong word                                 | евгений                  | 0  | Евгений                          | 0  |
| Борис              | боец              | Wrong word                                 | борис                    | 0  | Борис                            | 0  |
| Коля               | о-ля-ля           | Wrong word                                 | коля                     | 0  | Коля                             | 0  |
| Колян              | калям             | Wrong word                                 | колян                    | 0  | Колян                            | 0  |
| <b>Last names</b>  |                   |  |                          |  |                                  |  |
| Алексеев           | алексеев          | 0  | алексей                  | Wrong ending                               | Алексеев                         | 0  |
| Иванин             | и вания           | Wrong word                                 | иван                     | Wrong ending                               | иванин                           | 0  |
| Петренко           | ветрянка          | Wrong word                                 | петренко                 | 0  | Петренко                         | 0  |
| Сидоров            | сидорову          | Wrong ending                               | сидоров                  | 0  | Сидоров                          | 0  |
| <b>Patronymics</b> |                   |  |                          |  |                                  |  |
| Андреевич          | андреич           | Wrong ending                               | андреевич                | 0  | Андреевич                        | 0  |
| Аркадьевич         | акакиевич         | Wrong word                                 | аркадьевич               | 0  | Аркадьевич                       | 0  |
| Григорьевич        | рекой эридж       | Wrong word                                 | григорьевич              | 0  | Григорьевич                      | 0  |
| Иосифович          | привозят ходили   | Wrong word                                 | иосифович                | 0  | Иосифович                        | 0  |
| Леонидович         | да я не дали      | Wrong word                                 | леонидович               | 0  | Леонидович                       | 0  |
| Львович            | да вловивцо       | Wrong word                                 | львович                  | 0  | Львович                          | 0  |
| Павлович           | палыча            | Wrong word                                 | павлович                 | 0  | Павлович                         | 0  |

Table 2 – Recognition of age, addresses, things

| Voiced text                             | CMU Sphinx result                                   | Errors description<br>(0 – if none is present) | YandexSpeech Kit result                 | Errors description<br>(0 – if none is present) | GoogleSpeechRecognition result          | Errors description<br>(0 – if none is present) |
|---|---|--|---|--|---|--|
| <b>Age</b>                              |   |  |   |  |   |  |
| 3 года 9 месяцев                        | три года в девять месяцев                           | Extra word "в"                                 | 3 года 9 месяцев                        | 0  | 3 года 9 месяцев                        | 0  |
| 4 года 6 месяцев                        | четыре года на шесть месяцев                        | Extra word "на"                                | 4 года 6 месяцев                        | 0  | 4 года 6 месяцев                        | 0  |
| 87 лет 2 месяца                         | восемь если те моменту баррис                       | Wrong words                                    | 87 лет 2 месяца                         | 0  | 87 лет 2 месяца                         | 0  |
| <b>Addresses</b>                        |   |  |   |  |   |  |
| Дачная, дом 59                          | да что там добытый содеять                          | Wrong words                                    | дачная дом 59                           | 0  | дачная дом 59                           | 0  |
| Улица Дорожная, дом 42                  | улицы дорожная дом сорок два                        | Wrong ending                                   | улица дорожная дом 42                   | 0  | улица дорожная дом 42                   | 0  |
| Улица Гагарина, дом 25                  | молятся когда дом двадцать пять                     | Wrong words                                    | улица гагарина дом 25                   | 0  | улица гагарина дом 25                   | 0  |
| Улица Ленина, дом 112                   | улица оленя на дом сто двенадцать                   | Wrong word                                     | улица ленина дом 112                    | 0  | улица ленина дом 112                    | 0  |
| Лесная, дом 6                           | не знаю дом шесть                                   | Wrong word                                     | лесная дом 6                            | 0  | лесная дом 6                            | 0  |
| Улица Мира, дом 32                      | улица методом идется тако                           | Wrong words                                    | улица мира дом 32                       | 0  | улица мира дом 32                       | 0  |
| Улица Набережная, дом 8                 | улица набережная довольства                         | Wrong words                                    | улица набережная дом 8                  | 0  | улица набережная дом 8                  | 0  |
| Улица Советская, дом 1                  | улица совет сказал мата                             | Wrong words                                    | улица советская дом 1                   | 0  | улица советская дом 1                   | 0  |
| Свердловская область город Полевской    | тьеро носка область и город по мирской              | Wrong words                                    | свердловская область город полевской    | 0  | свердловская область город полевской    | 0  |
| улица Карла Маркса корпус 2 квартира 87 | улица карла маркса корпус впал в парке живых систем | Wrong words                                    | улица карла маркса корпус 2 квартира 87 | 0  | улица карла маркса корпус 2 квартира 87 | 0  |
| <b>Things (goods)</b>                   |   |  |   |  |   |  |
| Дрель                                   | далее   | Wrong word                                     | дрель                                   | 0  | дрель                                   | 0  |
| Мультиварка                             | ну и чего там                                       | Wrong word                                     | мультиварка                             | 0  | мультиварка                             | 0  |
| Наушники                                | но уже фиат   | Wrong word                                     | наушники                                | 0  | наушники                                | 0  |
| Ноутбук                                 | но у губ  | Wrong word                                     | ноутбук                                 | 0  | ноутбук                                 | 0  |

|                |                 |            |                |   |                |   |
|----------------|-----------------|------------|----------------|---|----------------|---|
| Плита          | да              | Wrong word | плита          | 0 | плита          | 0 |
| Пылесос        | вы отсос        | Wrong word | пылесос        | 0 | пылесос        | 0 |
| Тостер         | то вздыхать     | Wrong word | тостер         | 0 | тостер         | 0 |
| Весы напольные | езде на вольная | Wrong word | весы напольные | 0 | весы напольные | 0 |

### 3. Conclusion

Based on the information presented above, we can conclude that the Yandex system is good at recognizing short expressive phrases, as well as numerals. On contrary, the Google API is good at recognizing long phrases and terms. The Sphinx system is struggling with recognition of Russian speech. The results of this research are being used in development of the automatic system that calls the customers of TWIN.

### 4. Acknowledgments

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