

## 1. Исследование работы модульных и интеграционных тестов

Далее на рисунке 1 приведен скриншот страницы запуска автоматических тестов на GitHub, демонстрирующий успешную работу модульных и интеграционных тестов.

```
(exp) amedvedev@amedvedev:~/Workspace/expert$ pytest -W ignore::DeprecationWarning --disable-pytest-warnings
===== test session starts =====
platform linux -- Python 3.9.1, pytest-7.2.2, pluggy-1.0.0
Using --randomly-seed=3789657601
rootdir: /home/amedvedev/Workspace/expert
plugins: cov-4.0.0, asyncio-0.20.3, randomly-3.12.0, anyio-3.6.2
asyncio: mode=strict
collected 48 items

test/unit/core/test_insult_detector.py ... [ 6%]
test/unit/data/test_feature_extraction.py ... [ 12%]
test/unit/core/test_contradiction.py ... [ 16%]
test/unit/core/test_audio_emotions.py ... [ 18%]
test/unit/data/test_face_detector.py ... [ 25%]
test/unit/core/test_aggression_model.py ..... [ 33%]
test/unit/core/test_congruence.py ... [ 35%]
test/unit/data/test_diarization.py ... [ 37%]
test/unit/core/test_terms_extractor.py ... [ 41%]
test/unit/core/test_text_emotions.py ... [ 45%]
test/unit/data/test_video_reader.py ... [ 54%]
test/unit/core/test_evasiveness.py ..... [ 61%]
test/unit/data/test_summarization.py ..... [ 93%]
test/unit/core/test_distortion_model.py ... [100%]

===== 48 passed, 8 warnings in 62.85s (0:01:02) =====
```

Рисунок 1 – Скриншот страницы запуска автоматических тестов на GitHub

## 2. Исследование возможностей решения прикладных задач ИИ в промышленности

Рассмотренные примеры доступны по ссылке:  
<https://github.com/expertspec/expert/tree/main/examples>.

### 2.1 Описание эмоционального состояния и оценка рассогласованности эмоций (модуль конгруэнтности)

```
Data preprocessing

Usage of FeatureExtractor from the expert/data folder to transcribe audio, get speech time intervals, and extract faces

>
import torch
import pandas as pd

from expert.data.feature_extractor import FeatureExtractor
from expert.data.annotation.speech_to_text import get_phrases

[ ]

video_path = "mj_test.mp4"

[2]

feature_extractor = FeatureExtractor(video_path=video_path, stt_mode="local", device=torch.device("cpu"))

[3]
.. INFO: Created TensorFlow Lite XNNPACK delegate for CPU.

Feature extraction. get_features method returns the path to the folder with the reports which are json files with the features.

[ ]
features_path = feature_extractor.get_features()
```

## Transcription

```
import json

with open(features_path + "/transcription.json") as f:
    transcription = json.load(f)

phrases = get_phrases(transcription)

pd.set_option('display.max_rows', 162)
pd.set_option('display.max_colwidth', 10000)

pd.DataFrame(phrases)
```

	time	text
0	[0.98, 11.66]	Not from unnamed sources and not from unsanctioned, but for me. So that you can get a good idea of
1	[11.66, 22.78]	how I'm feeling, ask me questions, and hear what I truly believe at this moment in time about usada, and it's ongoing examination of me. I
2	[22.78, 32.92]	have been patient. I have been cooperative, and I have done all I can do to provide you, so with information that I have knowledge of, because I believe in
3	[32.92, 43.1]	a drug free sport, and having a drug free Olympic team. Throughout all of this, I have maintained my sincere belief that if the process is fair,
4	[43.7, 53.82]	that in the end, the truth would prevail, and my name would be cleared. However, the events of the last several weeks have led me more
5	[53.82, 64.72]	in sadness than in anger, to the conclusion that you sawdda is not engaged in a fair process. Let's all review the facts. I
6	[64.72, 74.9]	have never, ever failed a drug test. I have taken over 160 drug tests. I have taken tests
7	[74.9, 85.22]	before, during, and after the 2000 Olympics, and have never failed a test. Musada has no information
8	[85.22, 95.46]	that shows that I have ever failed a test, because simply I have never failed a test, and no information exists anywhere
9	[95.46, 105.54]	to even suggest that I have ever failed a test. I have truthfully answered every question asked of me under oath by
10	[105.54, 115.6]	the government and the federal grand jury during the Balco investigation. I took the extraordinary step of asking for this grand jury testimony to
11	[115.6, 126.34]	be made public to assist Musada in its examination and its efforts to get to the truth. I truthfully answered every question asked
12	[126.34, 136.58]	of me by Usada during the three hour May 24th meeting, a meeting that took place only because I asked for the meeting. I made publicly
13	[136.58, 147.48]	available the Balco information that Usada presented to me and questioned me about, and I have demonstrated that the information had no connection to me. There
14	[147.48, 157.64]	exists no one who can truthfully testify that I have ever used performance enhancing drugs simply for the reason that I never have. Despite
15	[157.64, 169.1]	the file loaded and summarizing. He has been to and done a single check of credible information against me. There

## Congruence

```
import torch

from expert.core.congruence import CongruenceDetector
```

By default, for preprocessing reports, "temp" directory and a folder named as the analysed video file are created in it. All other files are taken by the name of the modules

```
cong_detector = CongruenceDetector(video_path=video_path,
                                   features_path=features_path + "/features.json",
                                   face_image=features_path + "/faces/0.jpg",
                                   diarization_path=features_path + "/diarization.json",
                                   transcription_path=features_path + "/transcription.json",
                                   device=torch.device("cpu"))
```

get\_congruence method returns the dictionary with features ("emotions": emotions\_data, "congruence": cong\_data) and creates json files in correspondig folder.

```
results = cong_detector.get_congruence()
```

## Visualization of results

Pyplot is used to create interactive data. There may be a conflict with pytorch-lightning, it is not used in congruence

!pip install plotly

!pip install nbformat>=4.2.0

```
import plotly.express as px
import plotly.graph_objects as go

video_emo = pd.DataFrame(results["emotions"]["video"])
audio_emo = pd.DataFrame(results["emotions"]["audio"])
text_emo = pd.DataFrame(results["emotions"]["text"])

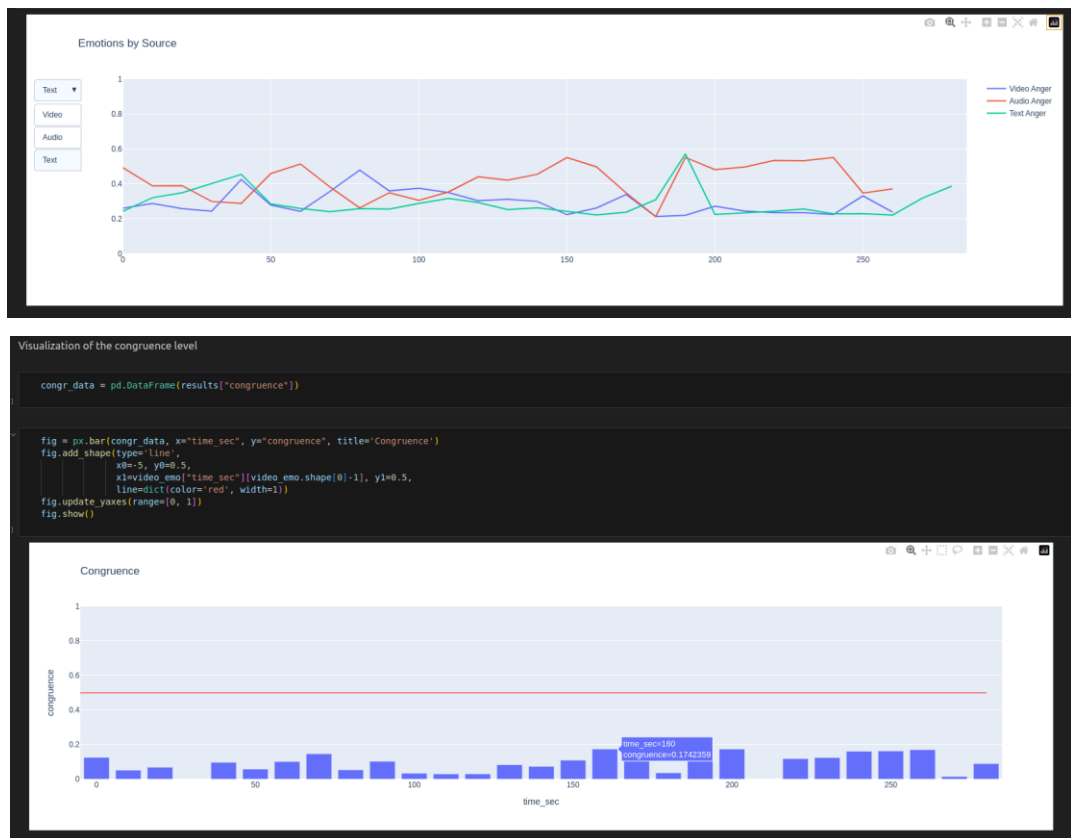
Visualization of the emotions by the modality

trace_video = go.Scatter(x=video_emo['time_sec'], y=video_emo['video_anger'], names='Video Anger')
trace_audio = go.Scatter(x=audio_emo['time_sec'], y=audio_emo['audio_anger'], names='Audio Anger')
trace_text = go.Scatter(x=text_emo['time_sec'], y=text_emo['text_anger'], name='Text Anger')

# Create buttons to switch between datasets
updatemenus = [{"buttons": [
    {'method': 'update', 'label': 'Video', 'args': [{'y': [video_emo['video_anger'], video_emo['video_neutral'], video_emo['video_happiness']]}]},
    {'method': 'update', 'label': 'Audio', 'args': [{'y': [audio_emo['audio_anger'], audio_emo['audio_neutral'], audio_emo['audio_happiness']]}]},
    {'method': 'update', 'label': 'Text', 'args': [{'y': [text_emo['text_anger'], text_emo['text_neutral'], text_emo['text_happiness']]}]}
], 'direction': 'down', 'showactive': True}]

# Create layout with buttons
layout = go.Layout(title='Emotions by Source', updatemenus=updatemenus)

fig = go.Figure(data=[trace_video, trace_audio, trace_text], layout=layout)
fig.update_xaxes(range=[0, text_emo['time_sec'].max()+5])
fig.update_yaxes(range=[0, 1])
fig.show()
```



2.2 Анализ обращения в колл-центр. Аннотация, выделение фрагментов, статистика и выделение тематик.

### Audio preprocessing

```
import torch

from examples.cases import example_utils
from examples.cases.call_stats import DialogStats, call_statistic
from expert.data.annotation import speech_to_text
from expert.data.diarization.speaker_diarization import SpeakerDiarization

file_path = "examples/cases/test_aud.wav"

Diarization = SpeakerDiarization(audio=file_path, device=torch.device("cpu"))
speakers = Diarization.apply()

transcription = speech_to_text.transcribe_video(file_path, lang="ru")

all_words = speech_to_text.get_all_words(transcription)[0]

timestamps = []
for speaker in speakers:
    for elem in speakers[speaker]:
        timestamps.append((elem, speaker))

sentences = example_utils.sentences_with_time(timestamps, all_words)
```

```
Connecting sentences with speech intervals form diarization

ci = example_utils.place_words(timestamps, sentences[1])

for num, i in enumerate(ci):
    timestamps[i][0][0] = min(timestamps[i][1][0][0], sentences[1][num][1])

timestamps.sort()

sentences = example_utils.sentences_with_time(timestamps, all_words)

sentences[0]

{0: (' Здравствуйте', ([0, 3], 'SPEAKER_01')),
 1: (' Мне нужна помощь. Я забыла, но вдруг внезапно обнаружила, что у меня есть карточка вашего банка. И на ней написано И тут я вспоминаю, что мне в паре карточку впалили.', ([2, 36], 'SPEAKER_00')),
 2: (' Проверьте', ([36, 37], 'SPEAKER_01')),
 3: (' и скажите, что мне надо делать с этой карточкой, какие плюшки она мне дает.', ([37, 42], 'SPEAKER_00')),
 4: (' ДС?', ([42, 44], 'SPEAKER_01')),
 5: (' Нет, через 0 в секунду', ([44, 50], 'SPEAKER_00')),
 6: (' Я даже не знаю, какой кот у этой карточки. Сейчас посмотрим, скажу вам.', ([50, 57], 'SPEAKER_01')),
 7: (' ', ([51, 55], 'SPEAKER_00')),
 8: (' Обычно на карточках расписываются. У меня тут подлинные стихи.', ([63, 68], 'SPEAKER_00')),
 9: (' ', ([68, 69], 'SPEAKER_01')),
10: (' Так, дата рождения ваша?', ([74, 76], 'SPEAKER_01')),
11: (' Четвёртая, двенадцать, с отощенного.', ([76, 80], 'SPEAKER_00')),
12: (' Так, и Да, верно назвали. Так, у вас пакет', ([84.0, 92], 'SPEAKER_01')),
13: (' услуг нового.', ([92, 95], 'SPEAKER_00'))}
```

## Extracting of specific statistics

```
from examples.cases.call_stats import DialogStats, call_statistic

report = call_statistic(Diarization.audio, Diarization.sr, sentences[0], speakers)

Перебивал SPEAKER_00
00:02 - 00:03
Перебивал SPEAKER_01
00:36 - 00:36
Перебивал SPEAKER_00
00:37 - 00:37
Перебивал SPEAKER_01
00:42 - 00:42
Перебивал SPEAKER_00
00:44 - 00:44
Перебивал SPEAKER_01
00:50 - 00:50
```

pd.DataFrame(report)														Python
Продолжительность разговора сек	Тишина в начале сек	Тишина в конце сек	Длительность тишины сек	Доля тишины	Продолжительность речи SPEAKER_00	Скорость речи SPEAKER_00	Количество интервалов SPEAKER_00	Доля речи SPEAKER_00	Продолжительность речи SPEAKER_01	Скорость речи SPEAKER_01	Количество интервалов SPEAKER_01	Доля речи SPEAKER_01	Продолжительность одновременной речи	одное
414.84	0	-0.16	69.0	6.012174	218.52	128.983018	21	0.631853	227.32	127.887393	24	0.657298	50	

# Analysis of emotions by speech

```
from expert.core.congruence import audio_emotions

speakers = example_utils.get_rounded_intervals(speakers)

CoAudio = audio_emotions.audio_analysis.AudioAnalysis(video_path=file_path,
                                                       stamps=speakers,
                                                       speaker="SPEAKER_00",
                                                       sr=44100)
```

## Emotions of the first speaker

```
audio_0_emotions = CoAudio.predict()

[W NNPACK.cpp:53] Could not initialize NNPACK! Reason: Unsupported hardware.
```

## Emotions of the second speaker

```
CoAudio = audio_emotions.audio_analysis.AudioAnalysis(video_path=file_path,
                                                       stamps=speakers,
                                                       speaker="SPEAKER_01",
                                                       sr=44100)
audio_1_emotions = CoAudio.predict()

emo_audio_0 = pd.DataFrame(audio_0_emotions)
emo_audio_1 = pd.DataFrame(audio_1_emotions)
```

```
anger_speaker_1 = emo_audio_1.loc[(emo_audio_1['audio_anger'] > emo_audio_1['audio_neutral']) & (emo_audio_1['audio_anger'] > emo_audio_1['audio_happiness'])]
happy_speaker_1 = emo_audio_1.loc[(emo_audio_1['audio_happiness'] > emo_audio_1['audio_neutral']) & (emo_audio_1['audio_happiness'] > emo_audio_1['audio_anger'])]

anger_speaker_0 = emo_audio_0.loc[(emo_audio_0['audio_anger'] > emo_audio_0['audio_neutral']) & (emo_audio_0['audio_anger'] > emo_audio_0['audio_happiness'])]
happy_speaker_0 = emo_audio_0.loc[(emo_audio_0['audio_happiness'] > emo_audio_0['audio_neutral']) & (emo_audio_0['audio_happiness'] > emo_audio_0['audio_anger'])]
```

```
from termcolor import colored
from datetime import datetime
```

Show sentences of the first speaker said with aggression

```
for time in anger_speaker_0['time_sec']:
    for elem in sentences[0]:
        if sentences[0][elem][1][1] == 'SPEAKER_00' and sentences[0][elem][1][0][0] <= time and sentences[0][elem][1][0][1] >= time:
            print(datetime.fromtimestamp(time).strftime("%M:%S"), ' ', colored(sentences[0][elem][0], 'red'))
```

03:03 Сейчас по комиссии.

Show sentences of the first speaker said with happiness

```
for time in happy_speaker_0['time_sec']:
    for elem in sentences[0]:
        if sentences[0][elem][1][1] == 'SPEAKER_00' and sentences[0][elem][1][0][0] <= time and sentences[0][elem][1][0][1] >= time:
            print(datetime.fromtimestamp(time).strftime("%M:%S"), ' ', colored(sentences[0][elem][0], 'green'))
```

01:32 услуг нового.  
02:32 скачать это приложение. И, конечно, это не так. Я живу. Какие у меня еще варианты есть? В отделении банка. В отделении банка спрашивают, вам помогут активировать вам ва  
02:43  
03:08 Я не очень поняла, когда  
03:13 не очень поняла, когда просто пустая карта смысл в ее. Но вроде как, какая-то сумма должна быть или что-то там должно покупаться с этой карты.

An example of the result obtained with AutoTM analysis for every speaker

```
result = pd.read_csv('./AutoTM/src/result.csv')
```

```
result[['speakers', 'topic_1', 'topic_2']]
```

	speakers	topic_1	topic_2
0	speaker_00	Тарифный план по обслуживанию карты	Бонусы при использовании карты
1	speaker_01	Тарифный план по обслуживанию карты	Бонусы при использовании карты