

Память, данные, python



speak.er

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<https://github.com/xnuinside>

DataLead @



(оффтоп)

The screenshot shows the GitHub Issues page for the repository `xnuinside/simple-ddl-parser`. The page displays 35 open issues and 98 closed issues. The search bar at the top contains the query `is:issue is:open`. The main list of issues includes:

- Feature: add support of Trino (AWS Athena) dialect** (#272) - opened 14 hours ago by `roykoand`
- Snowflake dialect missing Insert and Delete values** (#270) - opened 2 weeks ago by `HalfonA`
- Column comments into dicts** (#269) - opened 3 weeks ago by `erwin-frohsinn`
- GENERATED BY DEFAULT and CONSTRAINT with CHECK** (#268) - opened 3 weeks ago by `erwin-frohsinn`
- Case Statement in postgresql not supported** (#267) - opened 3 weeks ago by `erwin-frohsinn`
- Support Parse MYSQL DDL with 'COLLATE' option** (#265) - opened last month by `bumhwan`
- MySQL - UNIQUE in Create Table with constraint name** (#262) - opened on Jun 11 by `hubg398`
- MsSQL - IDENTITY(1,1) when placed after KEY** (#261) - opened on May 27 by `hubg398`

simple-ddl-parser

REMOVE from my packages

[PyPI page](#)

[Home page](#)

Author: Iuliia Volkova

License: MIT

Summary: Simple DDL Parser to parse SQL & dialects like HQL, TSQL (MS SQL), MySQL, PostgreSQL, Oracle, etc. Converts ddl files to json/python dict with full information about columns: types, default values, constraints, etc.

Latest version: 1.5.1

Required dependencies: [dataclasses](#) | [ply](#)

Downloads last day: 9,757

Downloads last week: 87,410

Downloads last month: 274,228

Про память

проблемки

- утечки
- swap
- ООМ
- Неоптимальное использование/
неожиданные размеры

агенда

- расскажу про свой контекст
- пооптимизируем
- посмотрим на библиотеки и их поведение
- сравним разные версии питона
- вздохну про профайлеры
- проговорим очевидные вещи вслух

КОНТЕКСТ



CodeScoring

Платформа композиционного
анализа программного
обеспечения

apache airflow

Screenshot of the Apache Airflow web interface showing a list of DAGs and their execution status.

The top navigation bar includes links for Airflow, DAGs, Cluster Activity, Datasets, Security, Browse, Admin, and Docs. The time is displayed as 11:09 UTC, and there is a "JOB" button.

The main table lists 14 DAGs:

DAG ID	Last Run	Run Status	Number of Tasks	Task Status	Next Run
centos_updater	2024-07-02, 03:00:00	Success	0 3 ***	0 green, 1 red, 1 yellow	2024-07-03, 03:00:00
cisa_kev	2024-07-02, 06:30:00	Success	30 6 ***	176 green, 2 red	2024-07-03, 06:30:00
cocoapods_updater	2024-07-01, 13:30:00	Success	30 13 ***	357 green, 3 red	2024-07-02, 13:30:00
conan_updater	2024-07-02, 02:00:00	Success	0 2 ***	225 green, 1 red	2024-07-03, 02:00:00
conda_updater	2024-07-02, 04:30:00	Success	30 4 ***	334 green, 28 red	2024-07-03, 04:30:00
cpe_mapper_main	2024-07-03, 05:25:00	Success	25 1/4 ***	314 green, 3 red	2024-07-03, 09:25:00
crates_updater	2024-07-02, 08:30:00	Success	30 8 ***	312 green, 51 red	2024-07-03, 08:30:00
cveorg_updater	2024-07-02, 02:00:00	Success	0 2 ***	154 green, 5 red	2024-07-03, 02:00:00
cygwin_packages	2024-07-02, 10:00:00	Success	0 10 ***	72 green, 1 red	2024-07-02, 10:00:00
debian_bulletins_updater	2024-07-02, 05:30:00	Success	30 05 ***	115 green, 1 red	2024-07-03, 05:30:00
debian_security_updater	2024-07-02, 05:30:00	Success	30 05 ***	122 green, 2 red	2024-07-03, 05:30:00
debian_updater	2024-07-02, 01:45:00	Success	45 1 ***	164 green, 2 red	2024-07-03, 01:45:00

сельдерей

Press shift + / for Shortcuts

deferred failed queued removed restarting running scheduled skipped success up_for_reschedule up_for_retry upstream_failed no_status

Duration Jun 29, 03:00

00:02:23
00:01:11
00:00:00

branching_based_on_config

load_versions_task

get_since_new_versions_task

load_since_tars_task []

load_versions_tars []

get_tars_links

load_packages_info_from_tar...

clean_up_alpine_data_files

DAG Run Task

alpine_updater / 2024-07-22, 03:00:00 UTC / branching_based_on_config

Clear task Mark state as... Filter Tasks

Details Graph Gantt Code Logs

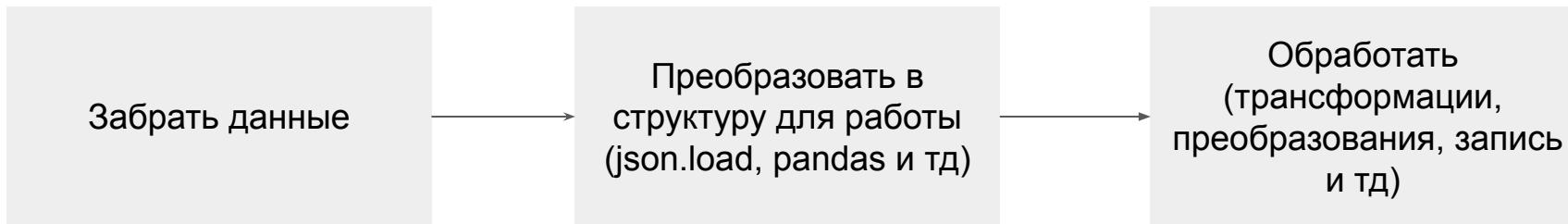
(by attempts)

1

All Levels All File Sources Wrap Download See More

```
[2024-07-22, 03:00:01 UTC] {taskinstance.py:1361} INFO - Starting attempt 1 of 4
[2024-07-22, 03:00:01 UTC] {taskinstance.py:1382} INFO - Executing <Task/_BranchPythonDecoratedOpen>
[2024-07-22, 03:00:01 UTC] {standard_task_runner.py:57} INFO - Started process 637191 to run task
[2024-07-22, 03:00:01 UTC] {standard_task_runner.py:84} INFO - Running: ['***', 'tasks', 'run', 'a']
[2024-07-22, 03:00:01 UTC] {standard_task_runner.py:85} INFO - Job 349183: Subtask branching_based
[2024-07-22, 03:00:01 UTC] {warnings.py:109} WARNING - /home/**/.local/lib/python3.11/site-packages/_SQLALCHEMY_CONN = conf.get("database", "_SQLALCHEMY_CONN")
[2024-07-22, 03:00:01 UTC] {task_command.py:416} INFO - Running <TaskInstance: alpine_updater.branching_based_on_config>
[2024-07-22, 03:00:02 UTC] {taskinstance.py:1662} INFO - Exporting env vars: AIRFLOW_CTX_DAG_OWNER=airflow
[2024-07-22, 03:00:04 UTC] {mixins.py:40} INFO - self.use_proxy=False self.proxies_list=['http://p...
[2024-07-22, 03:00:05 UTC] {alpine_updater.py:112} INFO - Since: 2024-07-21 03:47:55+02:00
[2024-07-22, 03:00:06 UTC] {python.py:194} INFO - Done. Returned value was: get_since_new_versions
[2024-07-22, 03:00:06 UTC] {python.py:227} INFO - Branch callable return get_since_new_versions_task
[2024-07-22, 03:00:06 UTC] {skipmixin.py:173} INFO - Following branch get_since_new_versions_task
[2024-07-22, 03:00:06 UTC] {skipmixin.py:239} INFO - Skipping tasks [('load_versions_task', -1)]
[2024-07-22, 03:00:06 UTC] {pg.py:280} INFO - Closing connection to replica
[2024-07-22, 03:00:06 UTC] {taskinstance.py:1400} INFO - Marking task as SUCCESS. dag_id=alpine_updater
[2024-07-22, 03:00:06 UTC] {local_task_job_runner.py:228} INFO - Task exited with return code 0
[2024-07-22, 03:00:06 UTC] {taskinstance.py:2778} INFO - 1 downstream tasks scheduled from follow...
```

каждый dag ...



разнообразно



diff data

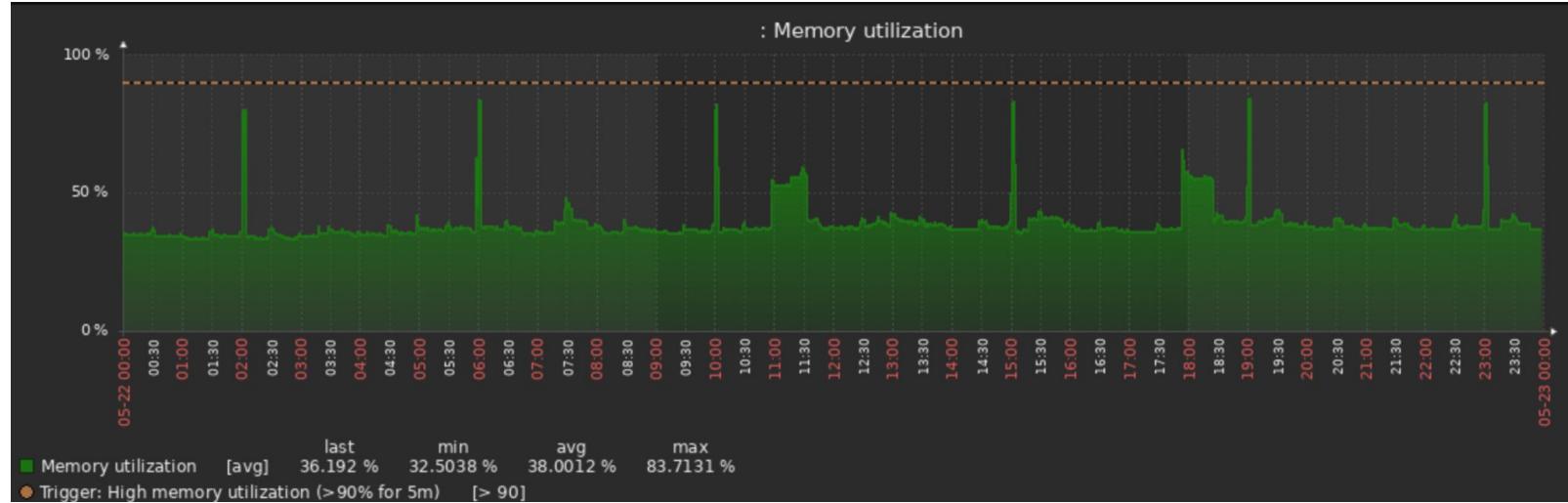
< 50 Mib



питончика достаточно



НО ИНОГДА...



привет, оом!

```
standard_task_runner.py:57} INFO - Started process 1199650 to run task
standard_task_runner.py:84} INFO - Running: ['***', '
standard_task_runner.py:85} INFO - Job 315100: Subtask
settings.py:109} WARNING - /home/***/.local/lib/python3.11/site-packages/**/settings.py:1
'database", "SQLALCHEMY_CONN")
task_command.py:416} INFO - Running <TaskInstance
TaskInstance.py:1662} INFO - Exporting env vars: /
loaders.py:56} INFO - Start loading
loaders.py:69} INFO - Current version 2024-06-18T18:39:07.967
loaders.py:70} INFO - Last version 2024-06-18T22:53:33.457
loaders.py:79} INFO - Load vulnerabilities
local_task_job_runner.py:228} INFO - Task exited with return code -9
TaskInstance.py:2778} INFO - 0 downstream tasks scheduled from follow-on schedule check
```

привет, оом!

```
standard_task_runner.py:57} INFO - Started process 1199650 to run task
standard_task_runner.py:84} INFO - Running: ['***', '
standard_task_runner.py:85} INFO - Job 315100: Subtask
settings.py:109} WARNING - /home/***/.local/lib/python3.11/site-packages/***/settings.py:1
'database", "SQLALCHEMY_CONN")
task_command.py:416} INFO - Running <TaskInstance
TaskInstance.py:1662} INFO - Exporting env vars: /
loaders.py:56} INFO - Start loading
loaders.py:69} INFO - Current version 2024-06-18T18:39:07.967
loaders.py:70} INFO - Last version 2024-06-18T22:53:33.457
loaders.py:79} INFO - Load vulnerabilities
local_task_job_runner.py:228} INFO - Task exited with return code -9
TaskInstance.py:2778} INFO - 0 downstream tasks scheduled from follow-on
```

Если для вас это
проблема - помните
о ограничении
памяти процессом

ЧТО МОГЛО ПОЙТИ НЕ ТАК



ПИТОН ИНОГДА ООООООЧЕНЬ РАССЛАБЛЯЕТ

```
def load_vulnerabilities(self, url: str) -> None:
    self.logger.info('Load vulnerabilities')

    response = self.fetch(url=url, method='GET')
    zip_file = ZipFile(BytesIO(response.content))

    vulnerabilities = []
    vulnerable_packages = set()

    for file_ in zip_file.filelist:
        with zip_file.open(file_) as f:
            content = f.read()

            file_json = orjson.loads(content)

            for vulnerability in file_json:
                parsed = Parser(**vulnerability)

    vulnerabilities.append(tuple(parsed.model_dump().values()))
```

шаг 1

```
def load_vulnerabilities(self, url: str) -> None:  
    self.logger.info('Load vulnerabilities')  
  
    response = self.fetch(url=url, method='GET')  
    zip_file = ZipFile(BytesIO(response.content))  
  
    vulnerabilities = []  
    vulnerable_packages = set()  
  
    for file_ in zip_file.filelist:  
        with zip_file.open(file_) as f:  
            content = f.read()  
  
            file_json = orjson.loads(content)  
  
            for vulnerability in file_json:  
                parsed = Parser(**vulnerability)  
  
    vulnerabilities.append(tuple(parsed.model_dump().values()))
```

тут что-то загрузили

шаг 2

```
def load_vulnerabilities(self, url: str) -> None:  
    self.logger.info('Load vulnerabilities')  
  
    response = self.fetch(url=url, method='GET')  
    zip_file = ZipFile(BytesIO(response.content))  
  
    vulnerabilities = []  
    vulnerable_packages = set()  
  
    for file_ in zip_file.filelist:  
        with zip_file.open(file_) as f:  
            content = f.read()  
  
            file_json = orjson.loads(content)  
  
            for vulnerability in file_json:  
                parsed = Parser(**vulnerability)  
  
    vulnerabilities.append(tuple(parsed.model_dump().values()))
```

тут бахнули
все в память

шаг 3

```
def load_vulnerabilities(self, url: str) -> None:  
    self.logger.info('Load vulnerabilities')  
  
    response = self.fetch(url=url, method='GET')  
    zip_file = ZipFile(BytesIO(response.content))  
  
    vulnerabilities = []  
    vulnerable_packages = set()  
  
    for file_ in zip_file.filelist:  
        with zip_file.open(file_) as f:  
            content = f.read()  
  
            file_json = orjson.loads(content)  
  
            for vulnerability in file_json:  
                parsed = Parser(**vulnerability)  
  
    vulnerabilities.append(tuple(parsed.model_dump().values()))
```

а тут мы типа
умные,
используем
orjson

профайлер



`memory_profiler`

профайлер

Pympler



memory_profiler

профайлер

`resource.getusage()`

Pympler



`psutil.virtual_memory()`

`memory_profiler`

профайлер

`resource.getusage()`

GUPPY

Pympler



TRACEALLOC

`psutil.virtual_memory()`

`memory_profiler`

профайлер

CODE
SCORING



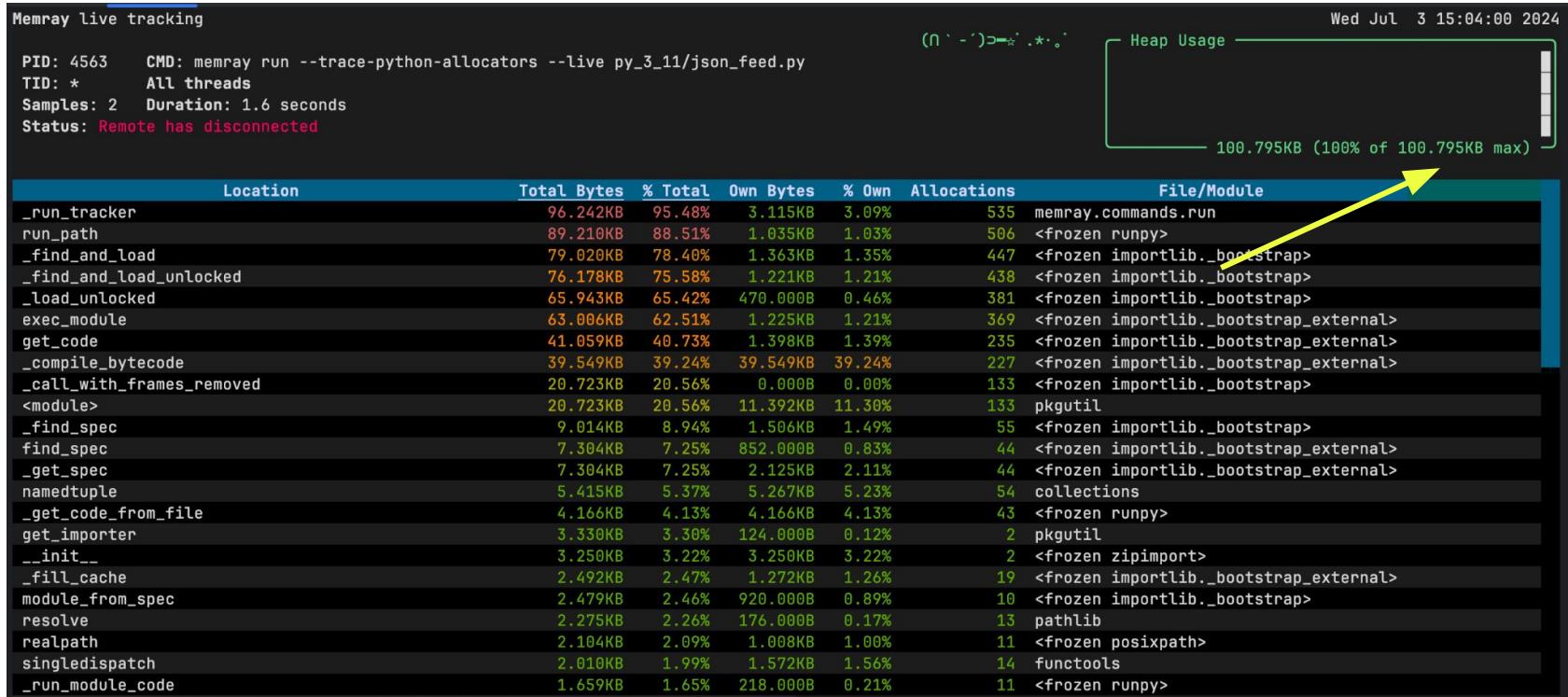
конфигурация

- M1 Pro
- 32 Гб
- Sonoma 14.4.1

Python 3.11



ПОЧТИ ПУСТОЙ файл

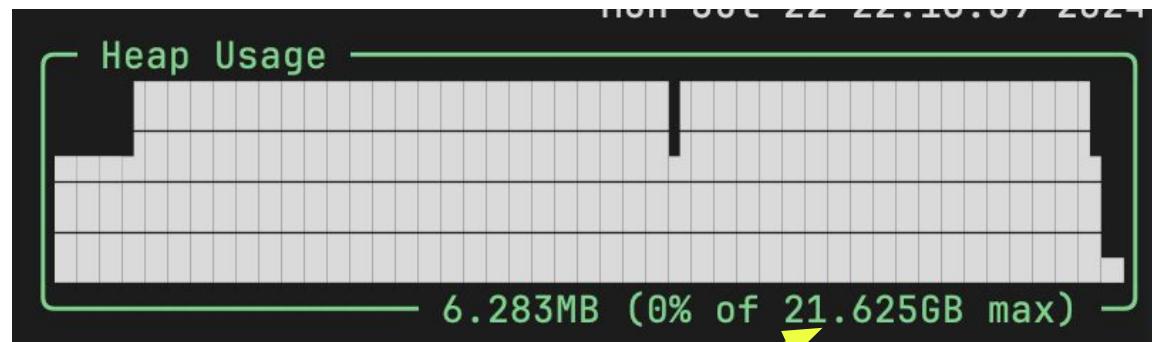


просто прочтем файл

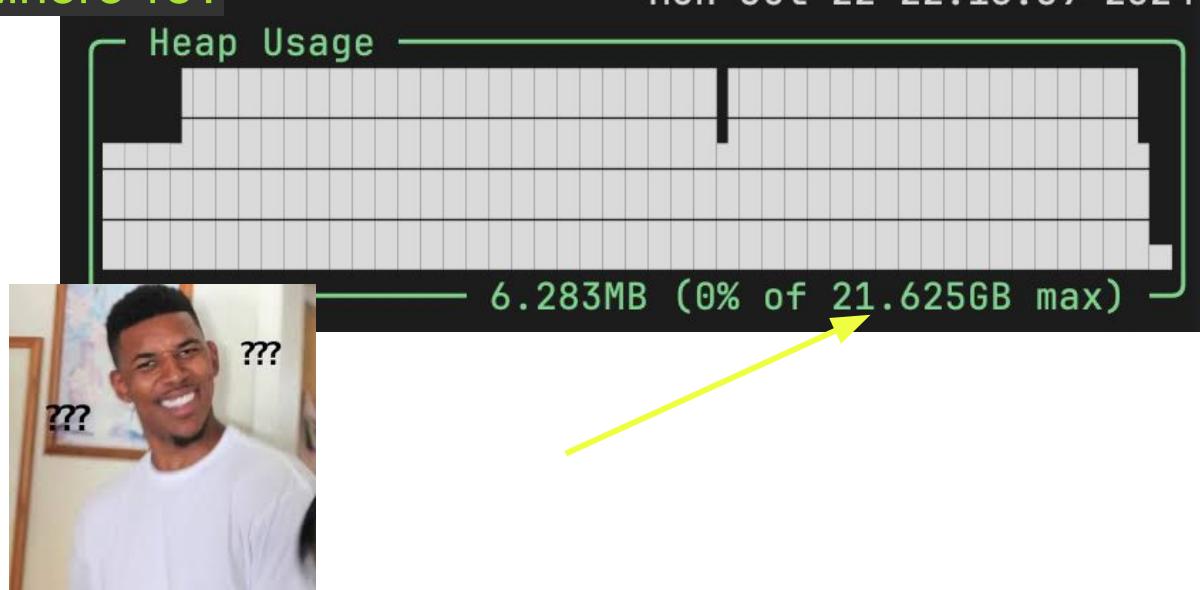
```
def read_only_file():
    with open(full_feed, 'r') as f:
        data = f.read()
```



Во сколько превратились
4,64 Гб json ?



А чЕ так
много то?



нельзя “просто” прочитать в utf-8

```
def read_only_file():
    with open(full_feed, 'r') as f:
        data = f.read()
```



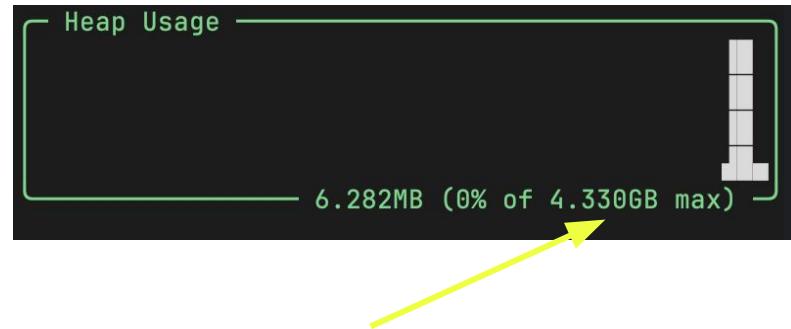
ПОМНИМ про 'b'

```
def read_only_file():
    with open(full_feed, 'rb') as f:
        data = f.read()
```



ПОМНИМ про 'b'

```
def read_only_file():
    with open(full_feed, 'rb') as f:
        data = f.read()
```



ПОМНИМ про 'b'

```
import sys
from pympler import asizeof

def read_only_file():
    with open(full_feed, 'rb') as f:
        data = f.read()

        print('sys.getsizeof(json_data): ', 
              sys.getsizeof(data) >> 20, 'mb')
        print('pympler (asizeof): ', 
              asizeof.asizeof(data) >> 20, 'mb')
```

ПОМНИМ про 'b'

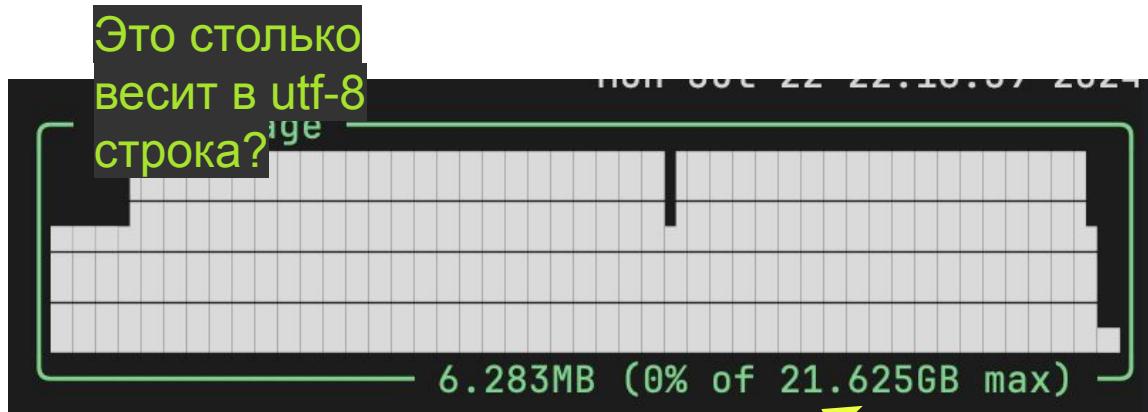
```
import sys
from pympler import asizeof
```

```
def read_only_file():
    with open(full_feed, 'rb') as f:
        data = f.read()

        print('sys.getsizeof(json_data): ',
              sys.getsizeof(data) >> 20, 'mb')
        print('pympler (assizeof): ',
              assizeof(assizeof(data)) >> 20, 'mb')
```

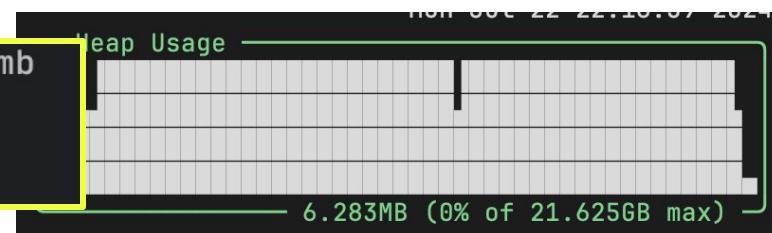
```
os.path.getsize(full_feed): 4427 mb
sys.getsizeof(data): 4427 mb
pympler (assizeof): 4427 mb
```

возвращаемся к mode = 'r'



возвращаемся к mode = 'r'

```
os.path.getsize(full_feed): 4427 mb
sys.getsizeof(data): 8707 mb
pympler (asizeof): 8707 mb
```



откуда max?

<https://github.com/python/cpython/blob/main/Objects/unicodeobject.c#L160>

```
/* Generic helper macro to convert characters of different types.  
   from_type and to_type have to be valid type names, begin and end  
   are pointers to the source characters which should be of type  
   "from_type *".  to is a pointer of type "to_type *" and points to the  
   buffer where the result characters are written to. */
```

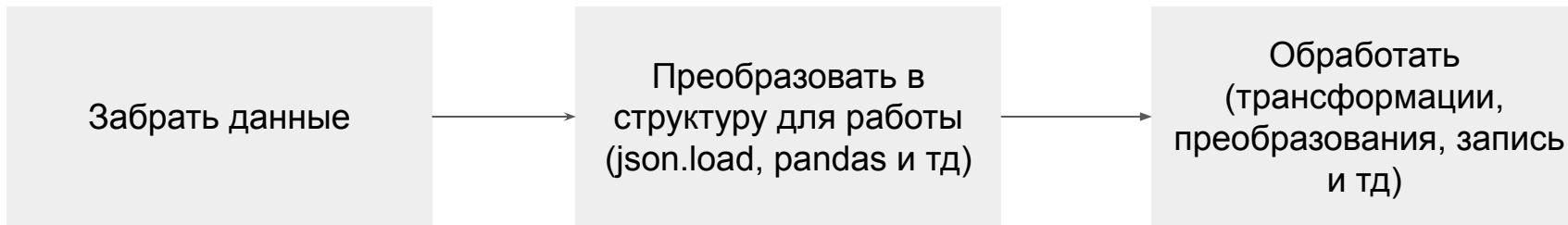
```
_PyUnicodeWriter_WriteCharInline(_PyUnicodeWriter *writer, Py_UCS4 ch);  
static inline void  
_PyUnicodeWriter_InitWithBuffer(_PyUnicodeWriter *writer, PyObject *buffer);  
static PyObject *  
unicode_encode_utf8(PyObject *unicode, _Py_error_handler error_handler,  
                   const char *errors);
```

... вернемся

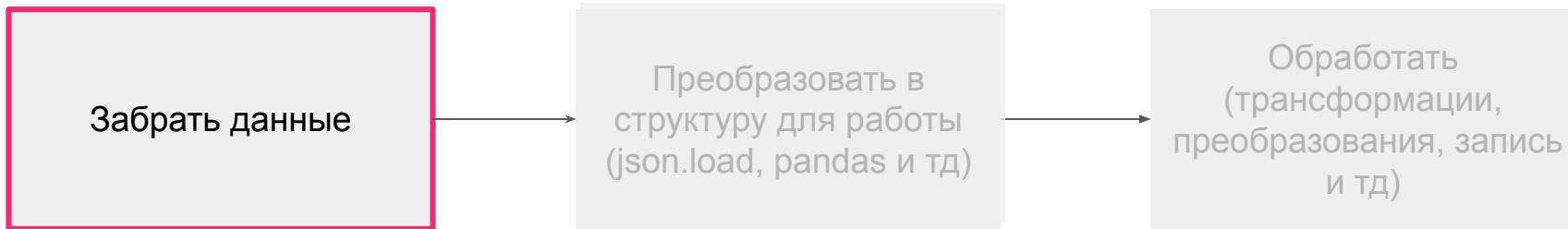
вспомнили про:

- байты
- буферизацию
- декодинг
- максимальное
потребление памяти

вы уже наверно забыли ...

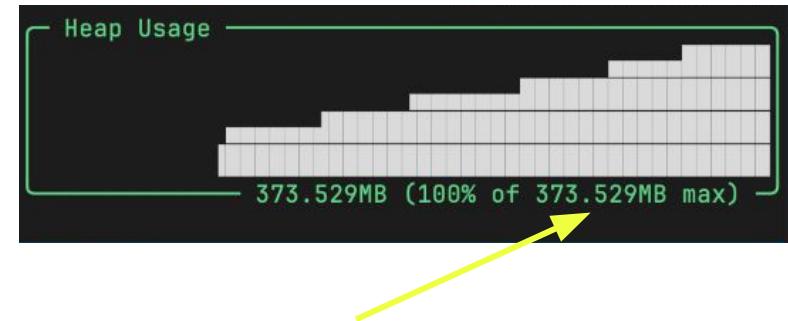


Вы уже наверно забыли ...



скачать-закачать

```
def load_vulnerabilities(self, url: str) -> None:  
    self.logger.info('Load vulnerabilities')  
  
    response = self.fetch(url=url, method='GET')  
    zip_file = ZipFile(BytesIO(response.content))
```



Конечно тут
gzip

СТРИМИНГ

<https://www.python-httplib2.org/quickstart/#streaming-responses>

Streaming Responses

For large downloads you may want to use streaming responses that do not load the entire response body into memory at once.

You can stream the binary content of the response...

```
>>> with httpx.stream("GET", "https://www.example.com") as r:  
...     for data in r.iter_bytes():  
...         print(data)
```

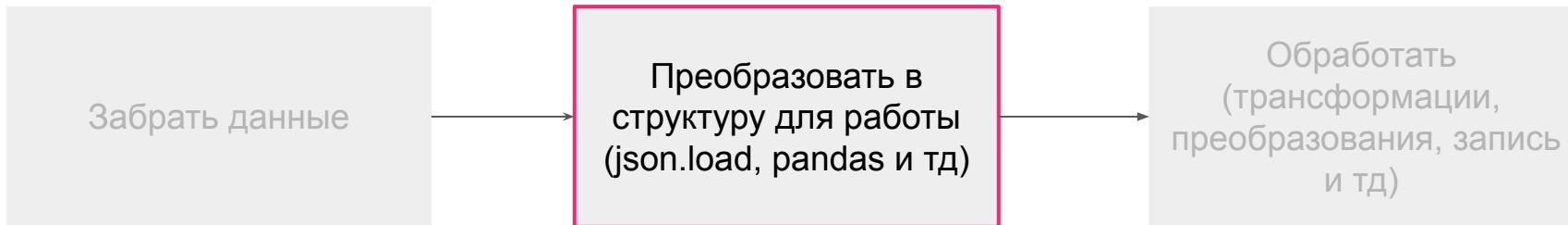
переписали на стриминг



стало: 98 MB

было: 373 MB

далее



json

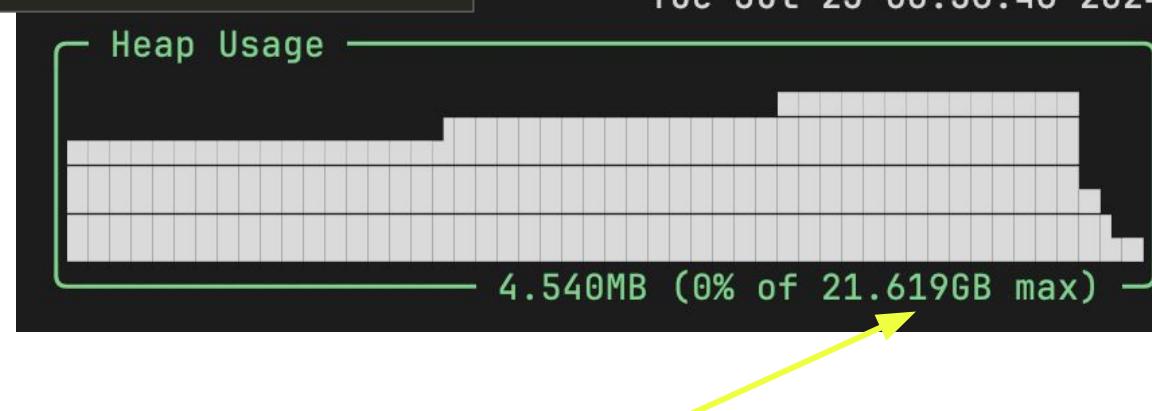
```
import json

def load_python_pure_json():
    with open(full_feed, 'rb') as f:
        json_loaded = json.load(f)
```

json

```
import json

def load_python_pure_json():
    with open(full_feed, 'rb') as f:
        json_loaded = json.load(f)
```

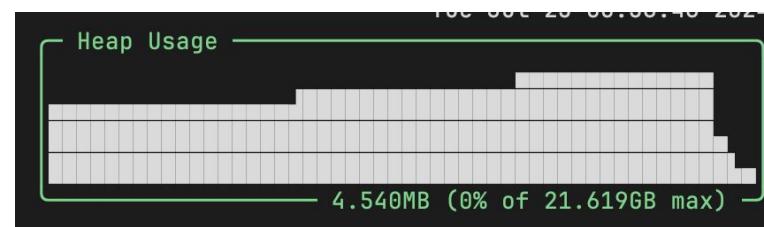


json

```
sys.getsizeof(data): 0 mb  
pympler (asizeof): 7470 mb
```



Рымплер
работает
ооооочень
медленно



НО У НАС ЖЕ И ТАК БЫЛ orjson!

```
with zip_file.open(file_) as f:  
    content = f.read()  
  
    file_json = orjson.loads(content)  
  
    for vulnerability in file_json:  
        parsed = Parser(**vulnerability)  
  
    vulnerabilities.append(tuple(parsed.model_dump().values()))
```

<https://github.com/ijl/orjson>



orjson

```
import orjson

def load_orjson():

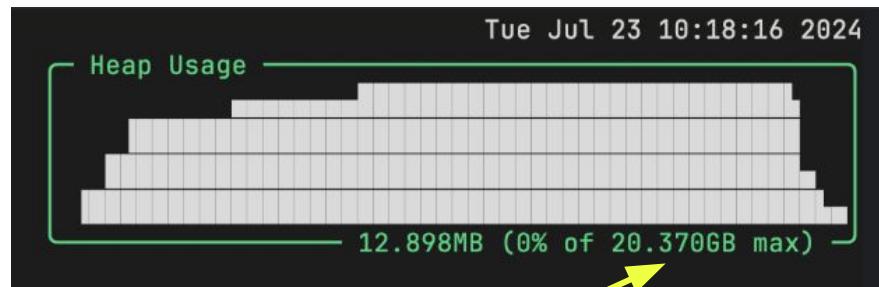
    with open(full_feed, 'rb') as f:
        data = f.read()
        json_data = orjson.loads(data)
```

orjson

```
import orjson

def load_orjson():

    with open(full_feed, 'rb') as f:
        data = f.read()
        json_data = orjson.loads(data)
```

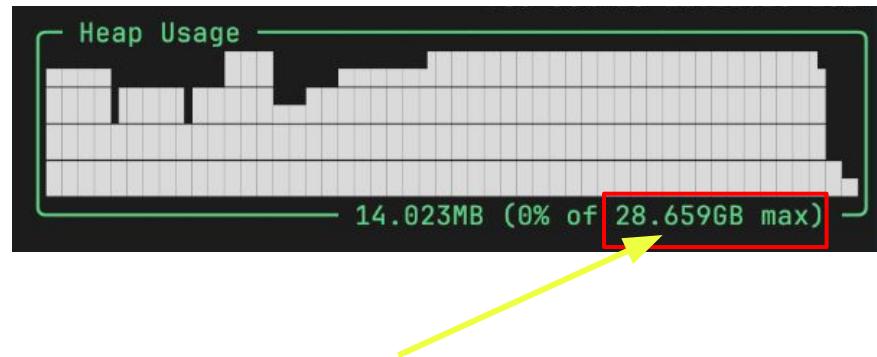


orjson + 'r'

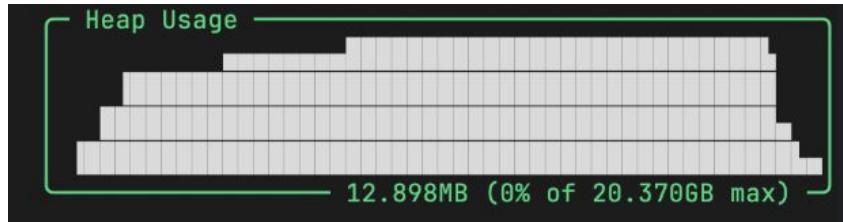
```
with open(full_feed, 'r') as f:
```

orjson + 'r'

```
with open(full_feed, 'r') as f:
```



orjson: 'rb' vs 'r'



'rb': 20.37 GB



'r': 28.659 GB

msgspec

```
import msgspec

def load_mspspec():
    with open(full_feed, 'rb') as f:
        data = f.read()
        json_data = msgspec.json.decode(data)
```

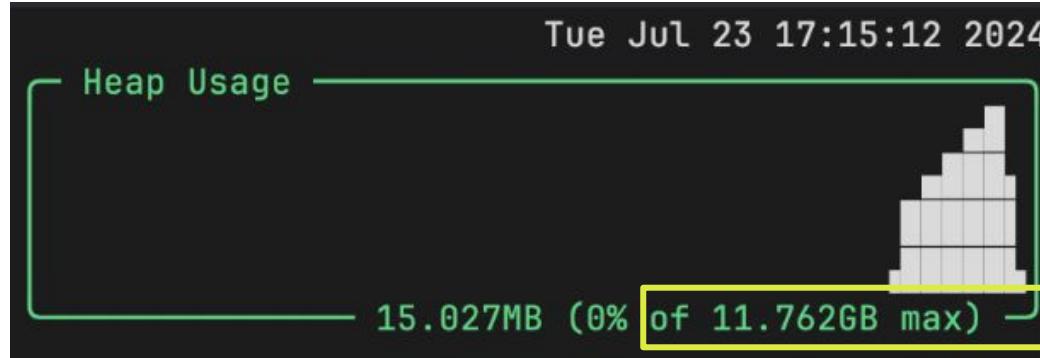


<https://github.com/jcrist/msgspec>

msgspec

```
Memray live tracking

PID: 79829      CMD: memray run --live py_3_11/json_feed.py
TID: *          All threads
Samples: 13     Duration: 12.6 seconds
Status: Remote has disconnected
```

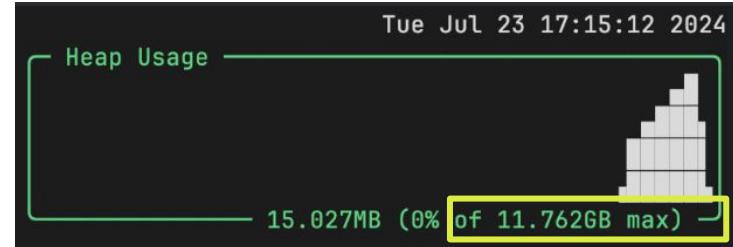


msgspec



```
Memray live tracking

PID: 79829      CMD: memray run --live py_3_11/json_feed.py
TID: *          All threads
Samples: 13     Duration: 12.6 seconds
Status: Remote has disconnected
```



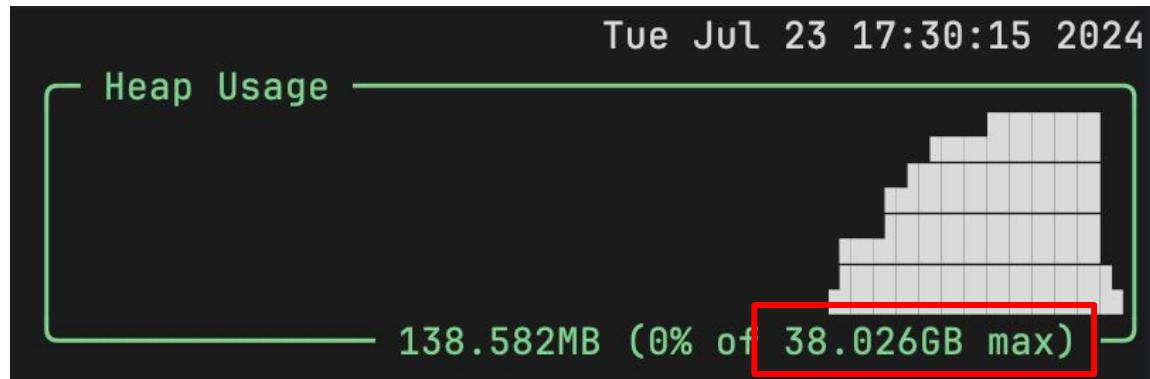
а ёщёёёёё ...

- polars
- pandas

угадайте насколько все плохо с pandas

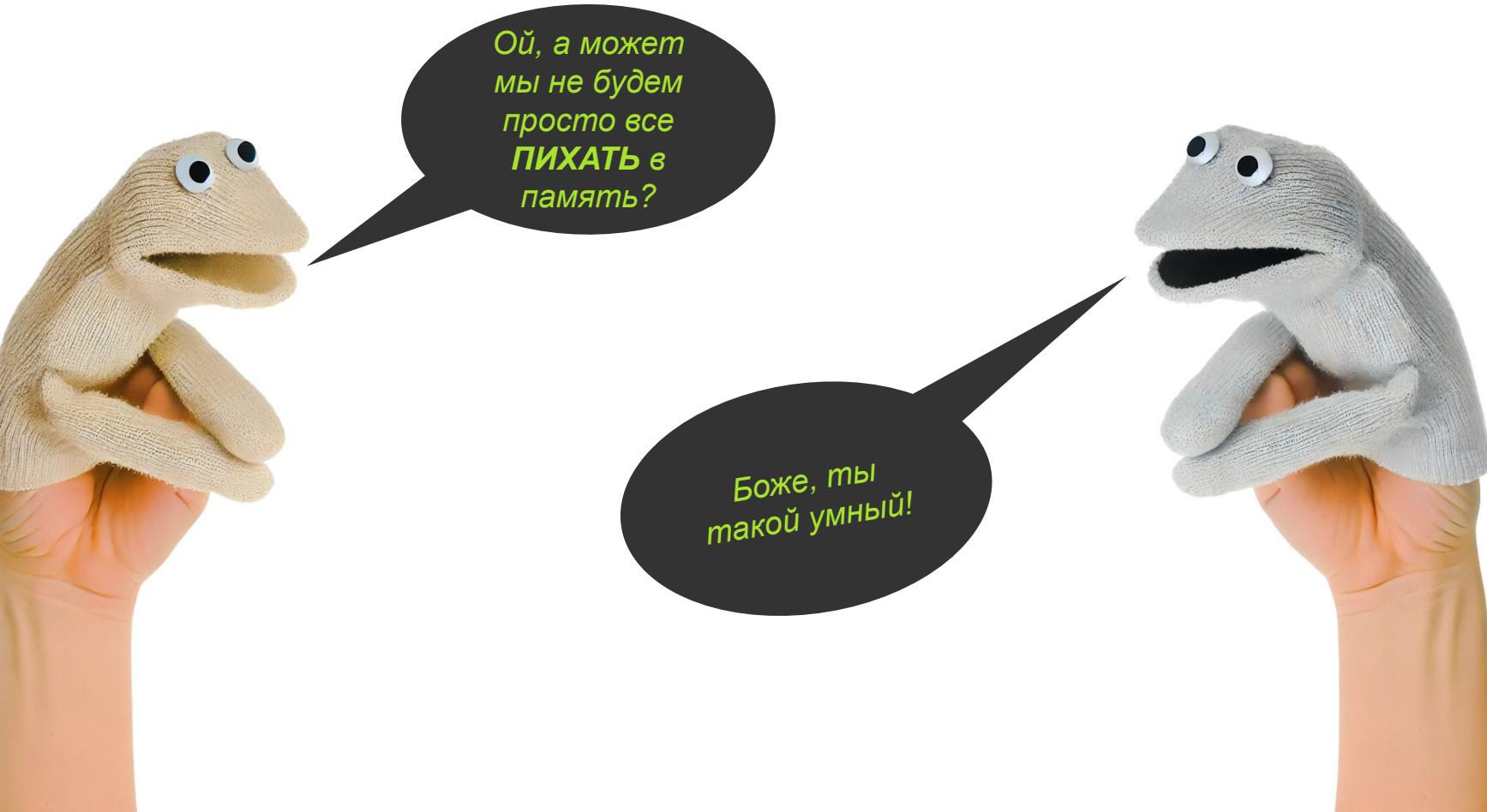


pandas



самая скучная часть





ijson

```
import ijson

def load_ijson():

    with open(full_feed, 'rb') as f:
        data = f.read()
        data_el = ijson.items(data, 'item')
        for num, item in enumerate(data_el):
            if num == 1000000:
                break
```

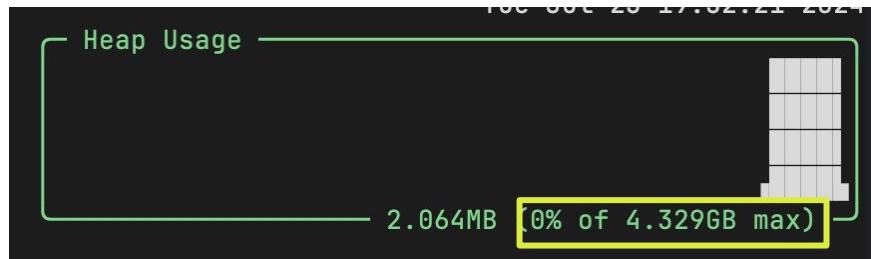
<https://github.com/ICRAR/ijson>

ijson

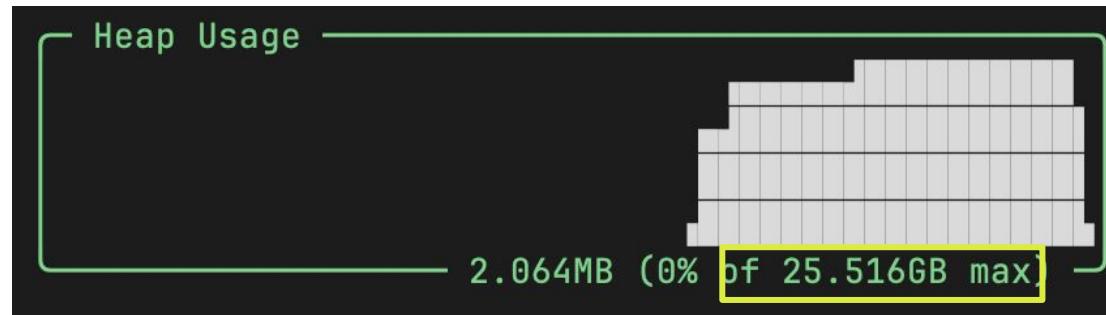
```
import ijson

def load_ijson():

    with open(full_feed, 'rb') as f:
        data = f.read()
        data_el = ijson.items(data, 'item')
        for num, item in enumerate(data_el):
            if num == 1000000:
                break
```



ijson + r = disaster



А что если не json

Если этой датой
управляете вы сами

Помним, что есть

- Parquet
- Avro
- Orc

и вообще BigData-мир ...

и можно фиды делать по датам,
не пихая все в один json ...

зафиксируем

msgspec - хорошо

C, Rust, etc ext -
байты, не
декодируйте

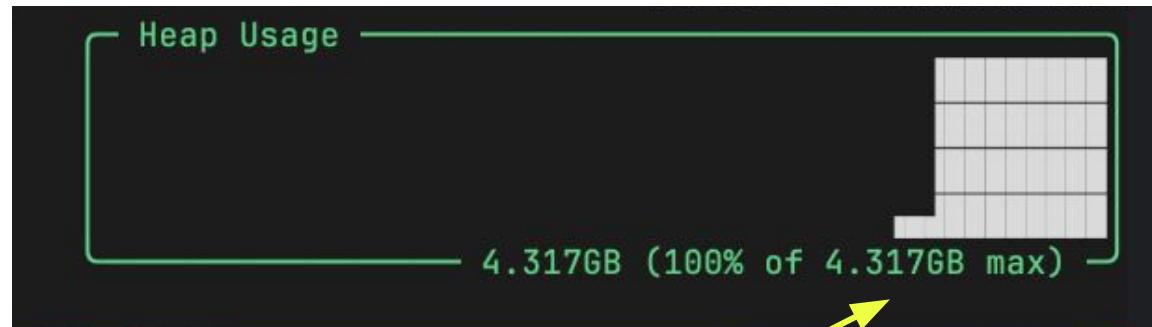
Помним про 'b'

Стриминг-чтение -
ответ

К реальному
кейсу!



1 день - процессинг



2 месяца



```
def load_vulnerabilities(self, url: str) -> None:
    self.logger.info('Load vulnerabilities')

    response = self.fetch(url=url, method='GET')
    zip_file = ZipFile(BytesIO(response.content))

    vulnerabilities = []
    vulnerable_packages = set()

    for file_ in zip_file.filelist:
        with zip_file.open(file_) as f:
            content = f.read()

            file_json = orjson.loads(content)

            for vulnerability in file_json:
                parsed = Parser(**vulnerability)

    vulnerabilities.append(tuple(parsed.model_dump().values()))
```

Тут же еще
сериализация
перед записью в
базу

буду я с этим что-то делать?



NO

Оставим эту
историю для
другого доклада -
скоро обед

если серьезно

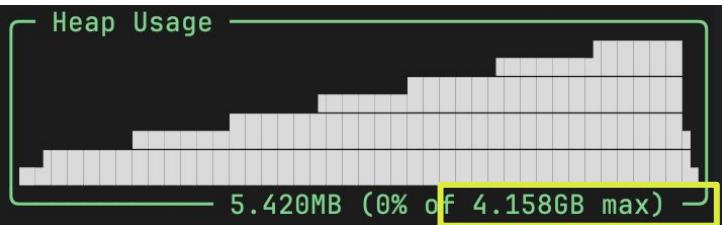
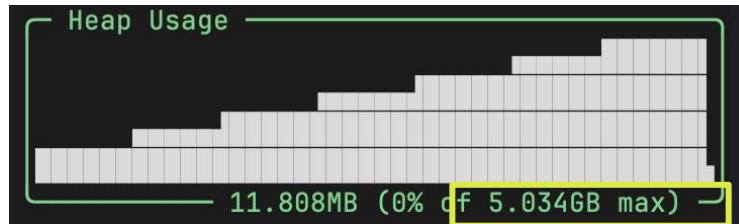
```
class Model(BaseModel):

    id: str
    severity: str
    description: None | str = None
    affected_packages: None | list[dict] = None
    modified_at: None | datetime = None
    created_date: None | date = None
```

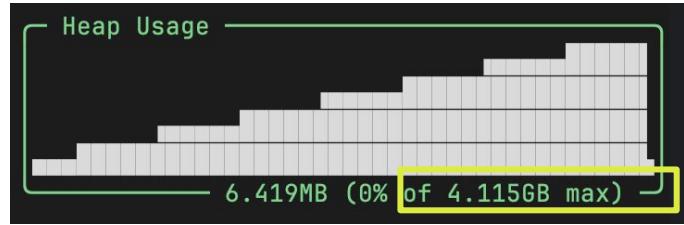
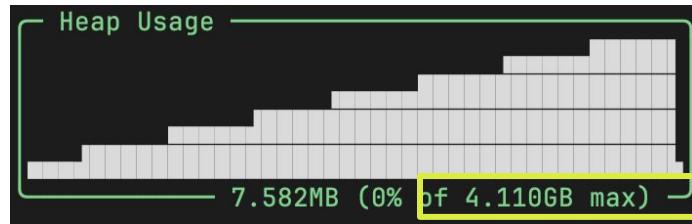
```
def generate_set_of_models():
    models = []
    for i in range(1_000_000):
        models.append(Model(**generate_data_element()))
    return models
```

pydantic

msgspec



pure class

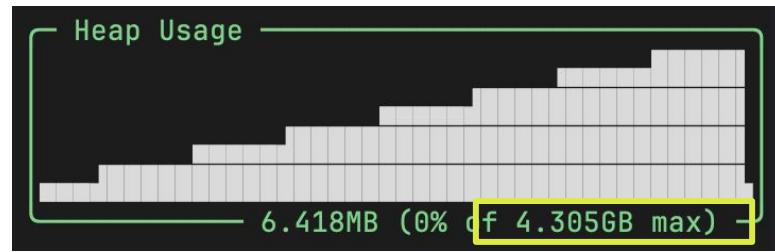


pure class + __slots__

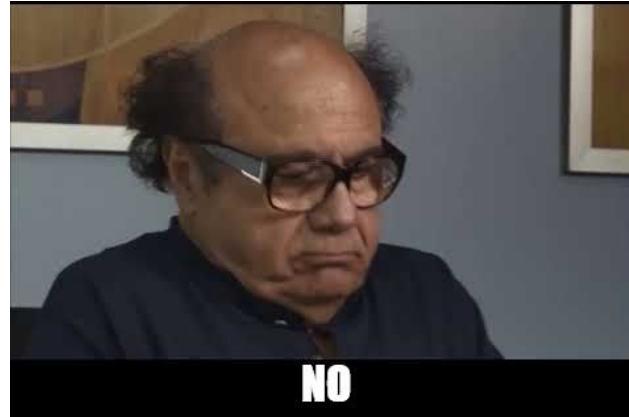
без моделей

```
def generate_set_of_data():
    data = []
    for i in range(1_000_000):

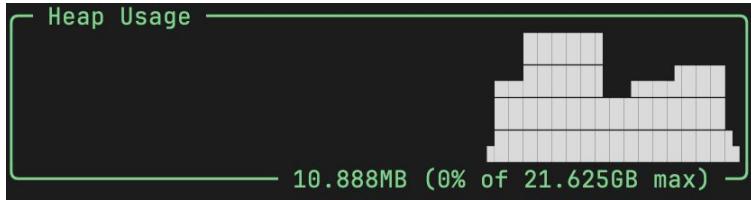
        data.append(generate_data_element())
    return data
```



ПОЭТОМУ



про профайлеры



resource.getusage()

```
resource.getusage(resource.RUSAGE_SELF)
ru_maxrss: 16809 mb
```

memory_profiler

Line #	Mem usage	Increment	Occurrences	Line Contents
12	34.3 MiB	34.3 MiB	1	@profile
13				def load_python_pure_json():
14	34.3 MiB	0.0 MiB	1	import json
15	8120.0 MiB	0.1 MiB	2	with open(full_feed, 'r') as f:
16	8119.9 MiB	8085.6 MiB	1	json_loaded = json.load(f)

Pympler

types	# objects	total size
str	71103985	6.16 GB
list	1504420	667.57 MB
dict	1255696	229.19 MB
float	67350	1.54 MB
int	436	11.92 KB
_io.BufferedReader	1	4.16 KB
_io.TextIOWrapper	1	208 B

memory_profiler

```
def read_only_file():
    with open(full_feed, 'r') as f:
        data = f.read()
```

```
os.path.getsize(full_feed): 4427 mb
sys.getsizeof(data): 8707 mb
pympler (asizeof): 8707 mb
```

memory_profiler

```
def read_only_file():
    with open(full_feed, 'r') as f:
        data = f.read()
```

```
os.path.getsize(full_feed): 4427 mb
sys.getsizeof(data): 8707 mb
pympler (asizeof): 8707 mb
```

Line #	Mem usage	Increment	Occurrences	Line Contents
=====				
13	24.1 MiB	24.1 MiB	1	@profile
14				def read_only_file():
15	595.2 MiB	0.3 MiB	2	with open(full_feed, 'r') as f:
16	594.8 MiB	570.8 MiB	1	data = f.read()

memory_profiler

```
Line #    Mem usage    Increment  Occurrences   Line Contents
=====
13      23.4 MiB      23.4 MiB          1   @profile
14                      def read_only_file():
15      399.6 MiB      0.5 MiB          2       with open(full_feed, 'r') as f:
16      399.1 MiB      375.7 MiB         1           data = f.read()
```

```
Line #    Mem usage    Increment  Occurrences   Line Contents
=====
13      23.5 MiB      23.5 MiB          1   @profile
14                      def read_only_file():
15      498.7 MiB      0.4 MiB          2       with open(full_feed, 'r') as f:
16      498.3 MiB      474.8 MiB         1           data = f.read()
```

А что там с
изменениями в
Python?

рубрика “золотые цитаты”

Will CPython 3.11 use more memory?

Maybe not; we don't expect memory use **to exceed 20%** higher than 3.10.

This is offset by memory optimizations for frame objects and object dictionaries as mentioned above.

b GB

	3.8	3.11	3.12
read	4.438	4.438	4.437
json	20.818	20.668	20.405
orjson	20.617	20.499	18.922
msgspec	12.022	11.9	11.469
ijson	4.326	4.328	4.328

Python 3.8

- Removed one `Py_ssize_t` member from `PyGC_Head`. All GC tracked objects (e.g. tuple, list, dict) size is reduced 4 or 8 bytes. (Contributed by Inada Naoki in [bpo-33597](#).)

Python 3.11

Lazily create dictionaries for plain Python objects. Objects now require less memory due to lazily created object namespaces. Their namespace dictionaries now also share keys more freely. (Contributed Mark Shannon in bpo-45340 and bpo-40116.)

с Python 3.9 по Python 3.12

PEP 623: Remove wstr from Unicode objects in Python's C API, reducing the size of every str object by at least 8 bytes. - очень долгий путь для дропа легаси-юникод объектов <https://peps.python.org/pep-0623/>

Оно же:

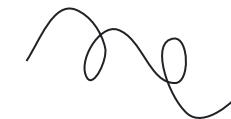
Remove `wstr` and `wstr_length` members from Unicode objects. It reduces object size by 8 or 16 bytes on 64bit platform. ([PEP 623](#)) (Contributed by Inada Naoki in [gh-92536](#).)

ВЫВОДЫ капитана

- Память не в приоритете - кому оно надо!
- помним про байт-представление
- стримим на диск
- профайлеры - хорошо, но надо понимать что это за цифры
- если можно не грузить все в память - не грузим
- DS-библиотеки - хорошо, но только если нет больших объемов и если важна функциональность
- И тд, и тп



СПАСИБО, У
МЕНЯ ВСЁ



Сюда можно
накидать
отзывов