

# Pyodide: scientific Python compiled in WebAssembly

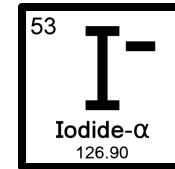
Roman Yurchak

*FOSDEM 2019*

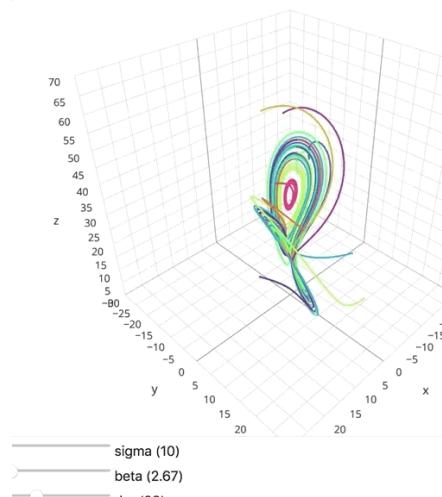
# Iodide

An interactive programming environment for scientists in the browser

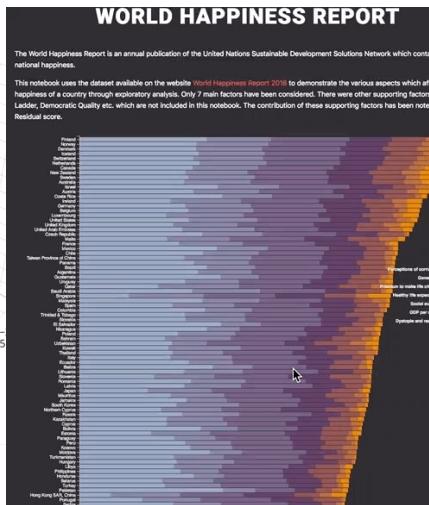
[iodide.io](https://iodide.io)



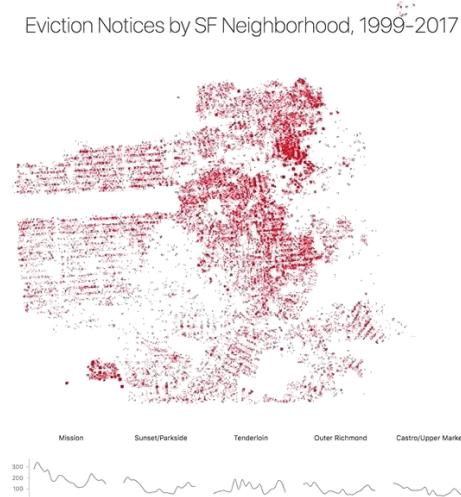
## Examples



Lorenz Attractor



World Happiness Report



Eviction Notices in SF

# Iodide overview

The screenshot shows the Iodide web interface. At the top, there's a header with the Iodide logo, a menu icon, navigation arrows, and links for "A Brief Tour through Pyodide", "LOG IN", and "REPORT". Below the header, a message says "You can modify and experiment with this notebook freely. To save to this server, you need to [login](#)".

The main area has three tabs: "Editor", "Report Preview", and "Report". The "Editor" tab is active, displaying the following code:

```
Editor
63
64 %% raw
65 Using Python from Javascript
66
67 So far so good, but wouldn't it be great to use Python from within Javascript as
well? When you load Pyodide, you'll get `pyodide` in the JS namespace, which
lets you import anything on the Py side.
68
69 %% py
70 # python
71 class Foo:
72     def __init__(self, val):
73         self.val = val
74 foo = Foo(42)
75 foo
76 %% js
77 // javascript
78 var foo = pyodide.pyimport("foo")
79 foo.val
80
81 %% raw
82 ## The Scientific libraries
83
84 The real power of Pyodide comes from its scientific computing libraries. So far
we've compiled numpy, pandas, matplotlib, parts of scipy, and networkx. At the
top of any py chunk, simply write something like `import numpy as np` and run
the chunk, and it'll begin the process of grabbing numpy.
```

The "Report Preview" tab shows a section titled "Pyodide" with a green logo. It contains the text: "Pyodide brings the Python runtime to the browser via WebAssembly, along with NumPy, Pandas, Matplotlib, parts of SciPy, and NetworkX." Below this, it says "press shift+enter to step through this notebook."

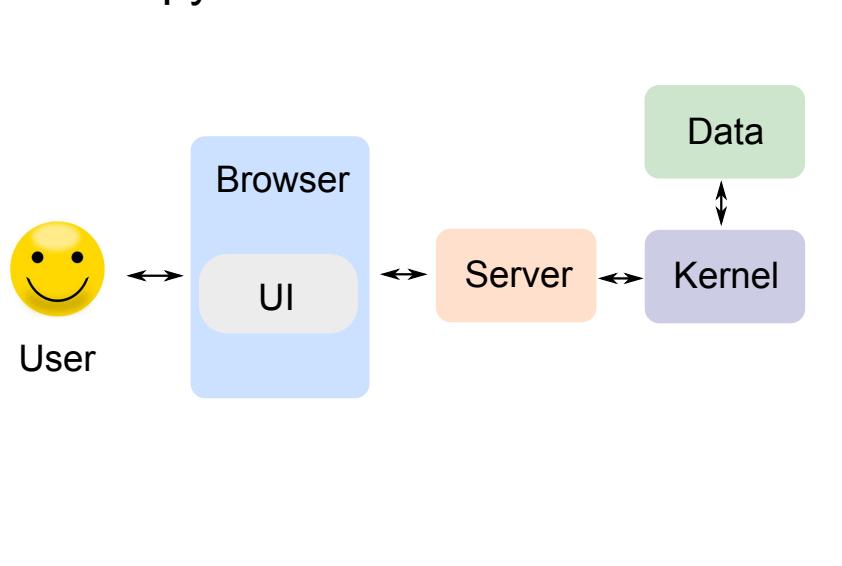
The "Report" tab shows a "Console" tab with the following history:

```
Console | Workspace | App Info
Loading Python language plugin
Python plugin ready
# python
import sys
sys.version
"3.7.0 (default, Jan 24 2019, 00:47:23) [Clang 6.0.1 ]"
import antigravity
undefined
Loading numpy
»
```

[iodide.io](https://iodide.io)

# Architecture

Jupyter-like model

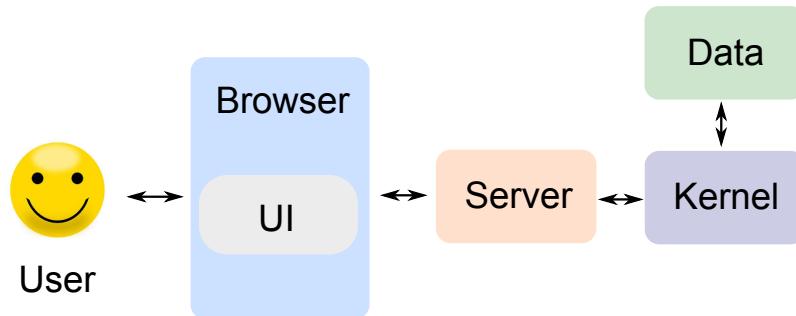


*Adapted from:*

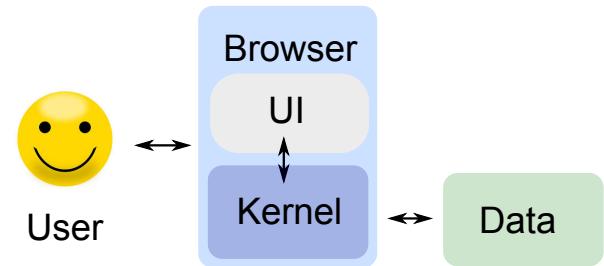
[jupyter.readthedocs.io/en/latest/architecture/how\\_jupyter\\_ipython\\_work.html#notebooks](https://jupyter.readthedocs.io/en/latest/architecture/how_jupyter_ipython_work.html#notebooks)

# Architecture

Jupyter-like model



Iodide



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[jupyter.readthedocs.io/en/latest/architecture/how\\_jupyter\\_ipython\\_work.html#notebooks](https://jupyter.readthedocs.io/en/latest/architecture/how_jupyter_ipython_work.html#notebooks)

# Sharing of notebooks

Jupyter like model

## **Local**

Install conda, Jupyter, then  
project-specific dependencies

## **Remote**

Deploy in a container (binder etc.)

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Iodide model

**Local**

Deploy to a static webserver  
Just open it in your browser

**Remote**

Share a single file containing  
data, report, code and  
dependencies Just open it in your  
browser

# Pyodide

Python scientific stack, compiled  
to WebAssembly

- created by Michael Droettboom
- language plugin for Iodide

C<sub>P</sub>ython interpreter

- numpy, pandas, matplotlib

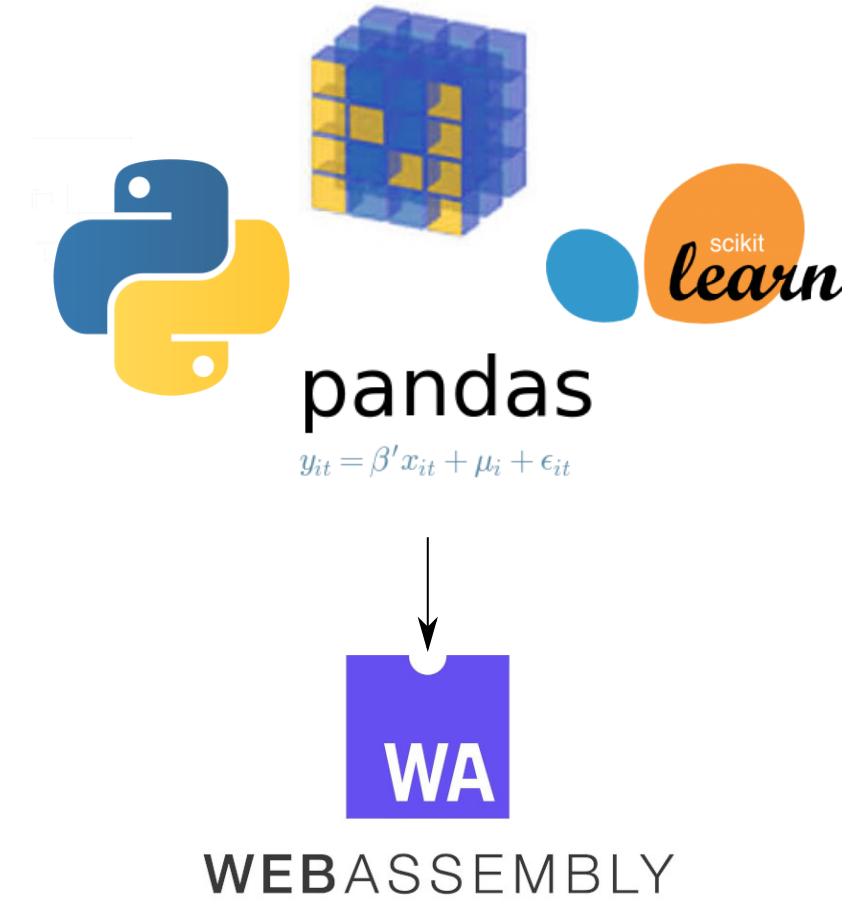
WebAssembly

- A fast way to run compiled code  
in the browser

Related projects

- PyPy.js, brython, RustPython

[github.com/iodide-project/pyodide](https://github.com/iodide-project/pyodide)



# Pyodide example

```
<html>
  <head><meta charset="utf-8"/></head>

  <body>
    <script src="http://static.r0h.eu:59171/pyodide.js">
    </script>

    <script>
      languagePluginLoader.then(() => {
        pyodide.loadPackage(['numpy']).then(() => {
          pyodide.runPython(`

            import numpy as np

            x = np.random.rand(100)
            y = x.sum()
          `);
        });

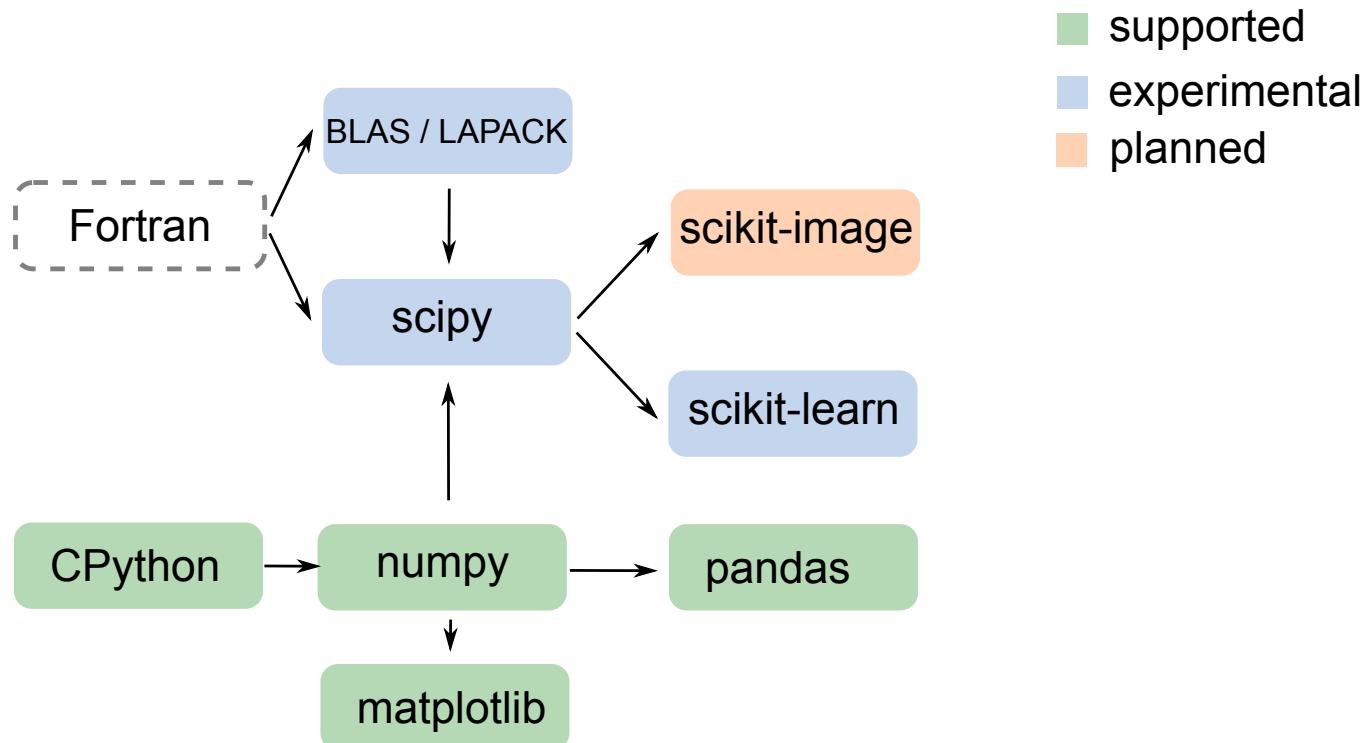
        var y = pyodide.pyimport('y');
        console.log(y);
      });
    </script>
  </body>
</html>
```

# Supported packages

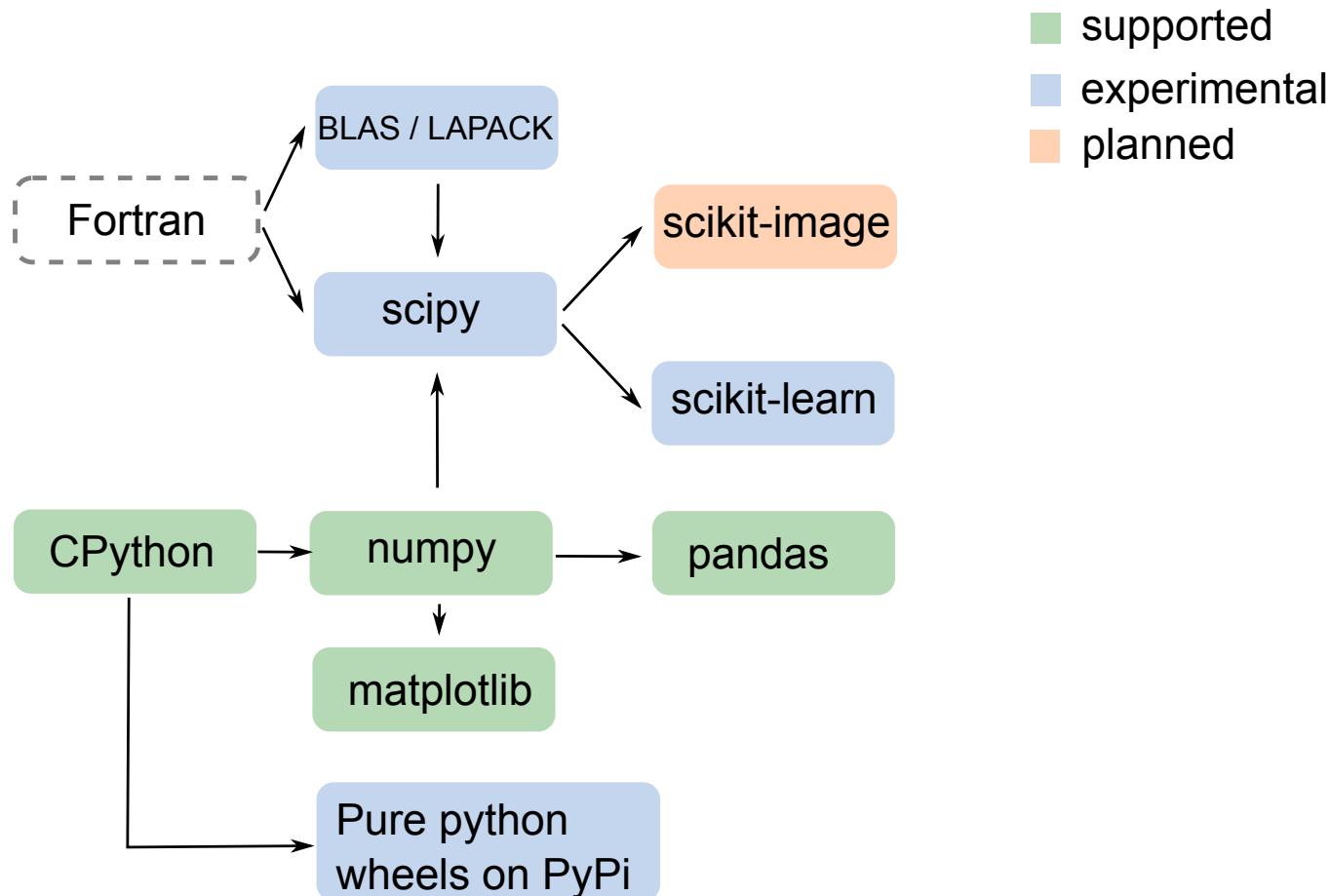
- supported
- experimental
- planned



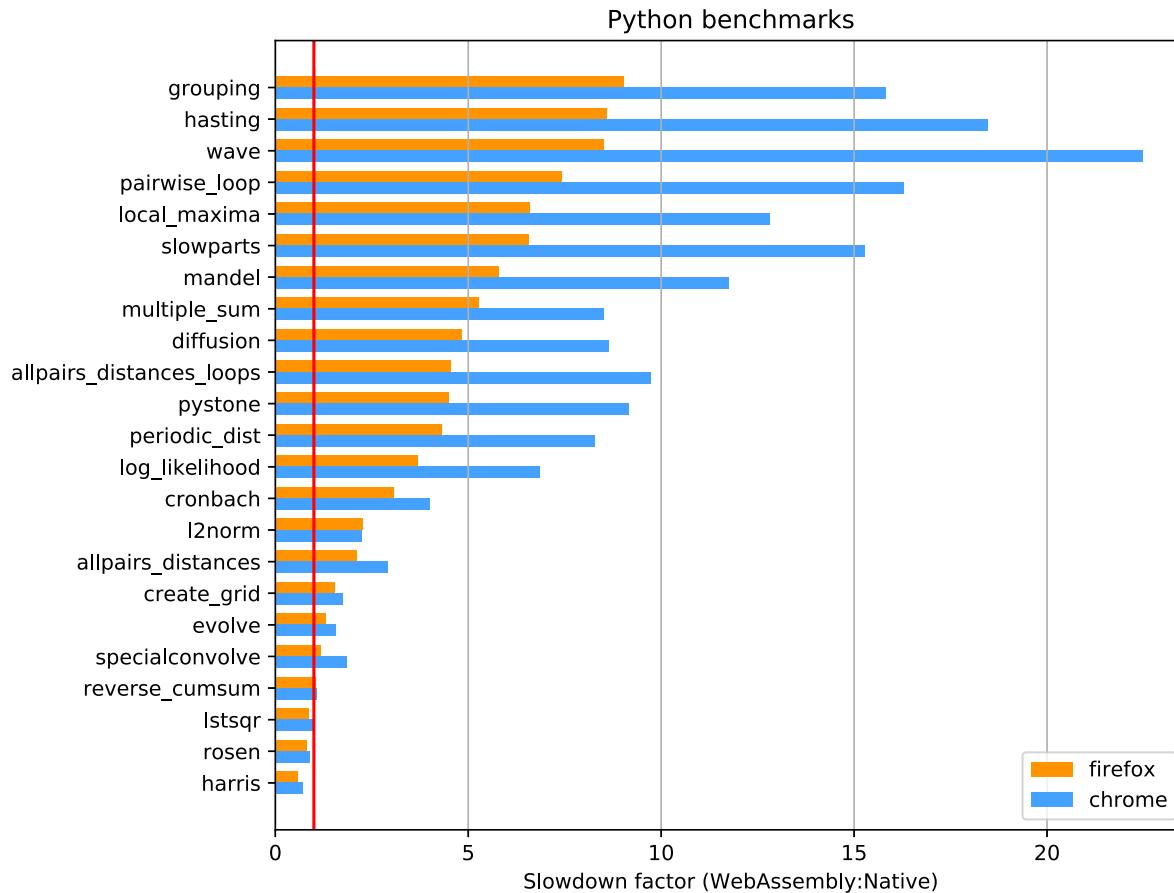
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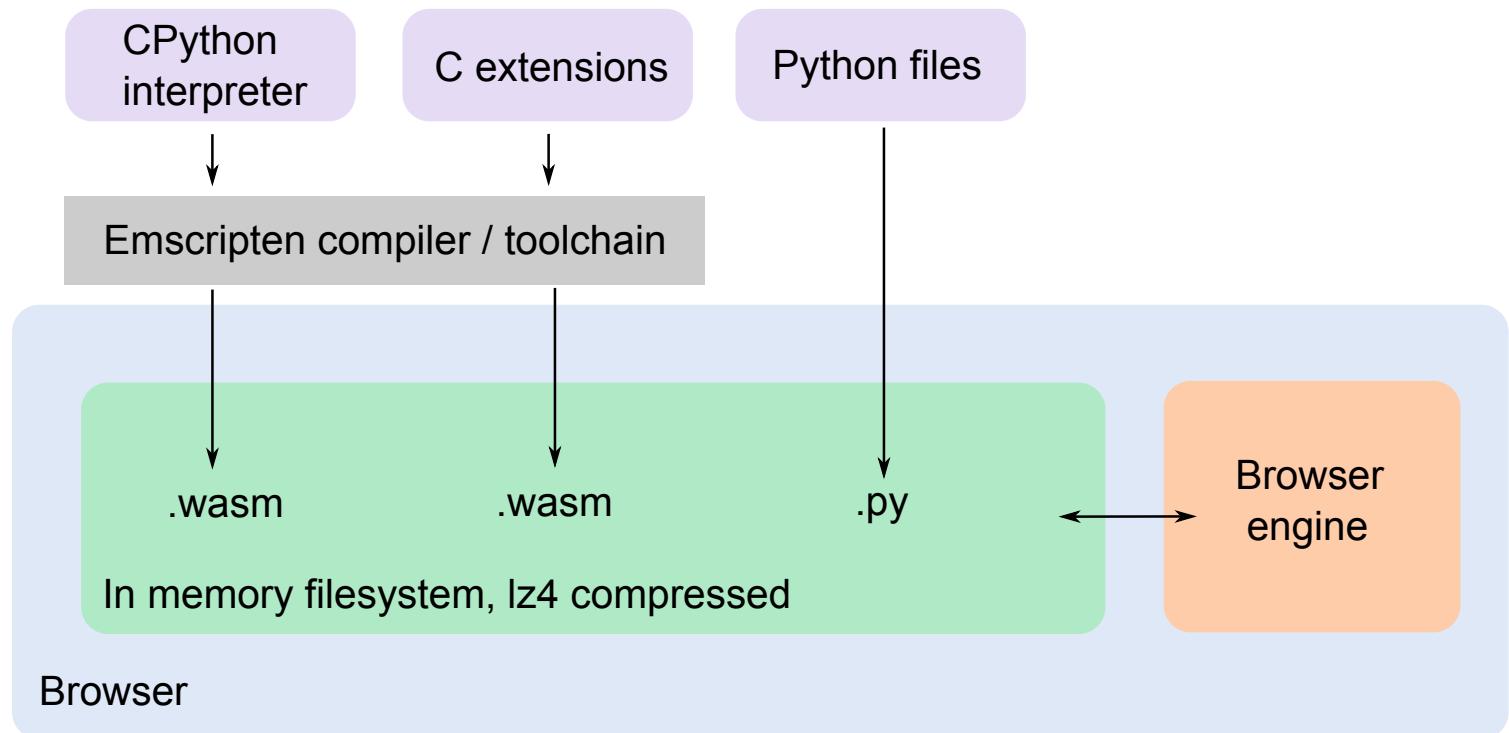


# Performance



Firefox: 4-8 slower for pure Python, 1-2 times slower for C-ext. Ideal scaling with the number of users.

# Build process



# System calls

For example,

- ↓ `os.open` in Python
- ↓ CPython: call `os_open_impl` C function

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Emscripten / WebAssembly

- ↓ Emscripten
- ↓ system call to `musl libc`
- ↓ WebAssembly engine

# System calls (sometimes)

For example,

- ↓ `os.statvfs` in Python (disk space usage)
- ↓ CPython: call `os_statvfs_impl` C function

Linux

Emscripten / WebAssembly

- |   |  |
|---|--|
| <ul style="list-style-type: none"><li>• ↓ <code>statvfs</code> system call to <code>glibc</code></li><li>• ↓ Linux kernel</li></ul> | <ul style="list-style-type: none"><li>• ↓ Emscripten : not implemented; return "safe and sane values"</li><li>• ✗ system call to <code>musl</code> libc</li><li>• ✗ WebAssembly engine</li></ul> |
|---|--|

Most system calls work, but there are some edge cases.

# What doesn't work

## Difficult

- network sockets
- multiprocessing
- host filesystem access

## Should work someday

- threads
- async

# Testing

Pytest is supported: test collection and execution in the browser



# Testing

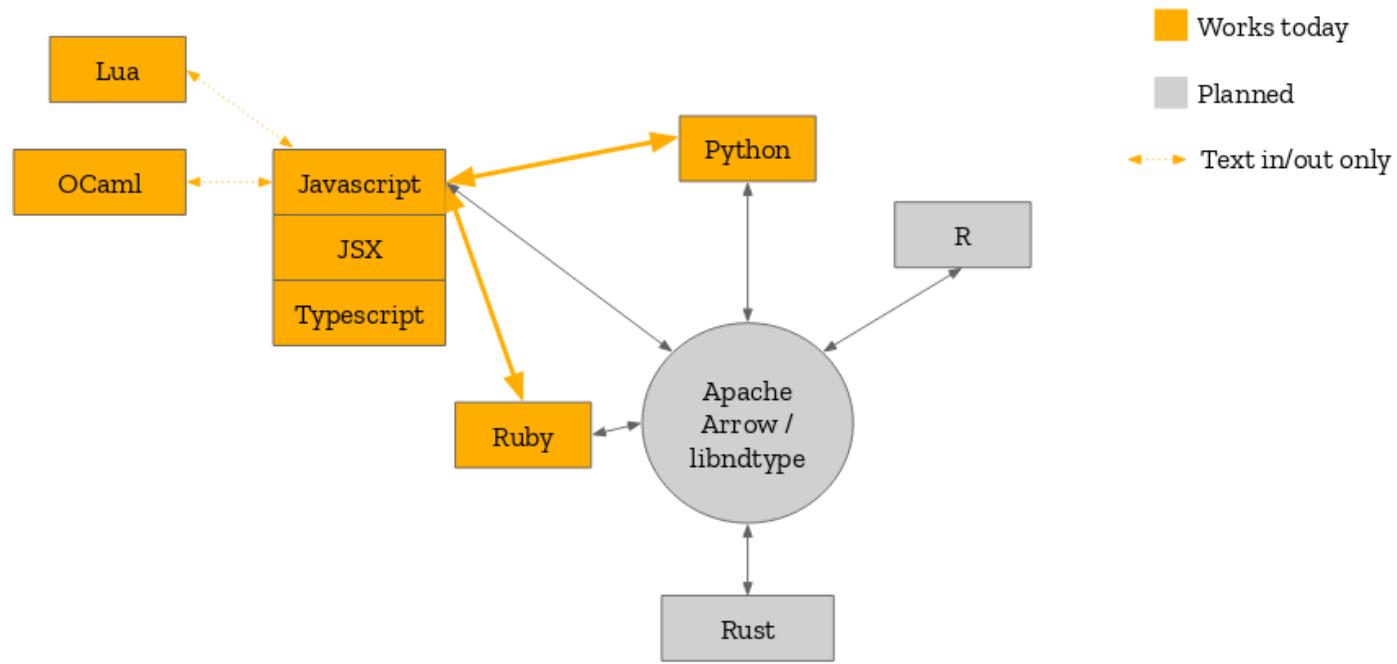
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## Test suites

- CPython: 380 test files / 497 pass (increasing, but some will never pass due to WebAssembly environment)
- numpy: 3145 passed, 42 failed (+ some collection failures), 47 skipped
- scikit-learn: WIP, looks promising. Some remaining issues with Fortran / LAPACK calls in scipy.

# Planned language interoperability



# Future work

- increase the percentage of passing tests
- dynamic linking of BLAS/LAPACK in scipy
  - possible in Emscripten 1.38.22 thanks to Kirill Smelkov
- optimize download sizes
- threading and async support
- more packages

Contributors welcome!

# Application: in-browser data analytics

- challenges of multi-user notebooks deployment
- running notebooks on the edge with uncertain/limited connectivity
- Iodide and Pyodide integrated into the OfficeJS apps store
  - online / offline usage, synchronization in Dropbox etc



# Development team



Brendan Colloran  
Hamilton Ulmer  
William Lachance  
Michael Droettboom  
Teon Brooks  
...

Thank you!

Questions?

[github.com/iodide-project/pyodide](https://github.com/iodide-project/pyodide)

@RomanYurchak