numba-mpi

Numba @njittable MPI wrappers tested on Linux macOS and Windows

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FOSDEM'23 HPC, Big Data, and Data Science Devroom @ ULB (Feb 5 2023)

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2: Max Planck Institute for Dynamics and Self-Organization, Göttingen, Germany

Python & HPC?

photo: Nature, doi:10.1038/d41586-019-03167-2

Perkel 2019 (Nature)
doi:10.1038/d41586-019-02310-3

"*In scripting languages such as Python,*
users type code into an interactive editor line by line"

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↑
papers promoting Julia, Rust, ...

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papers on Python packages

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- **Python lets you glue (and package) together these technologies**

JIT-compiled Python & NumPy API

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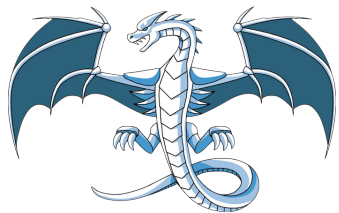
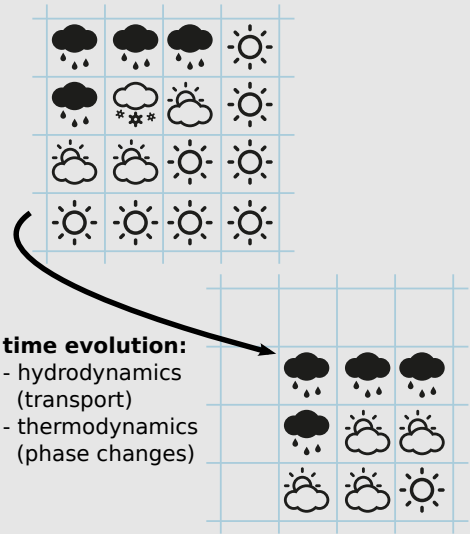


... at runtime using the industry-standard LLVM compiler library

NWP-related prototype problem



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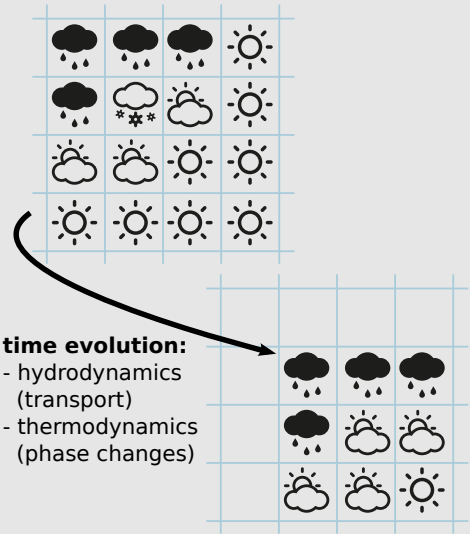
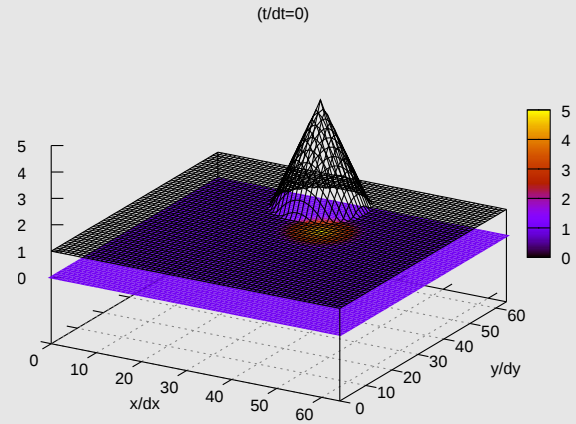


time evolution:
- hydrodynamics (transport)
- thermodynamics (phase changes)

numerical solution for transport-only PDE (2D)



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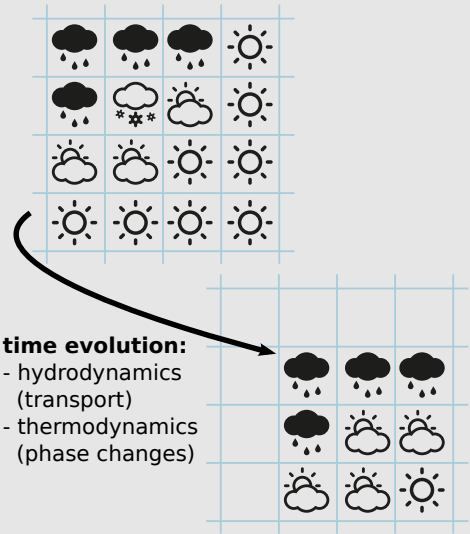

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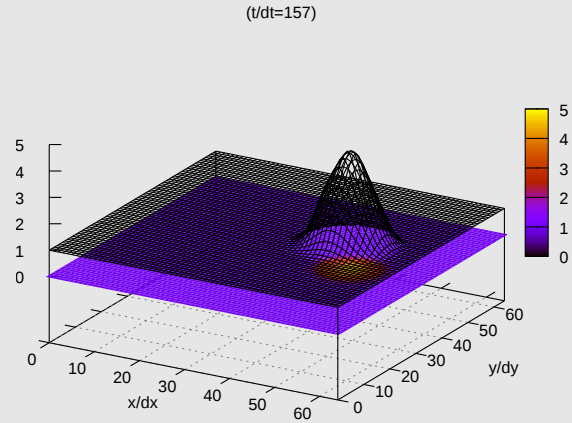

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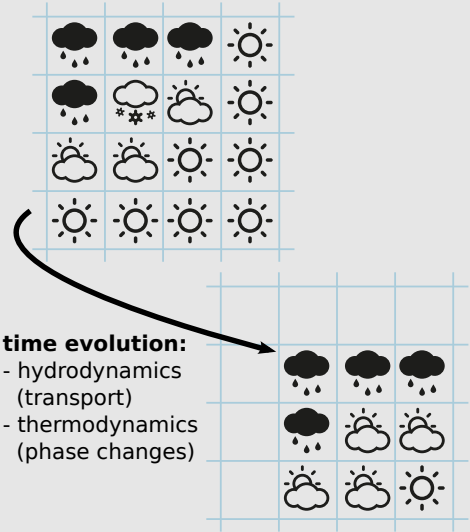

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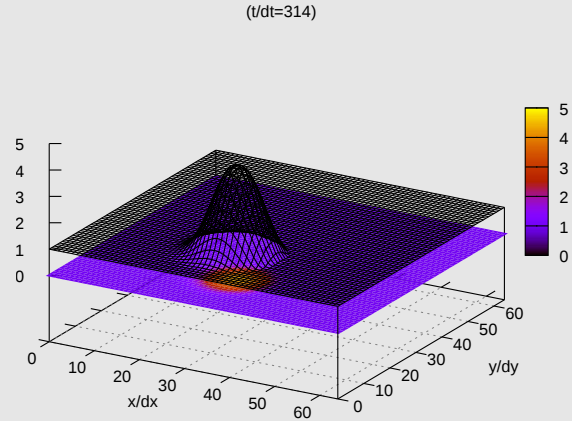

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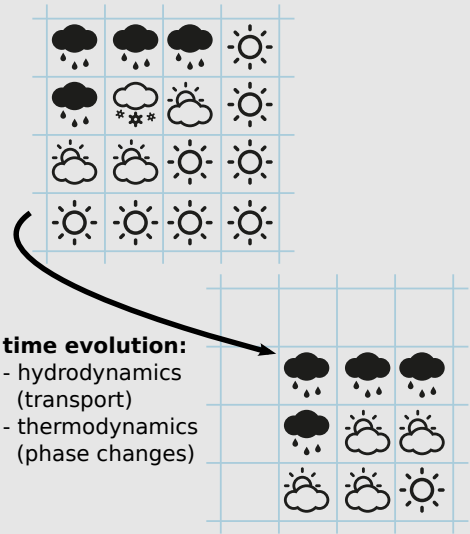

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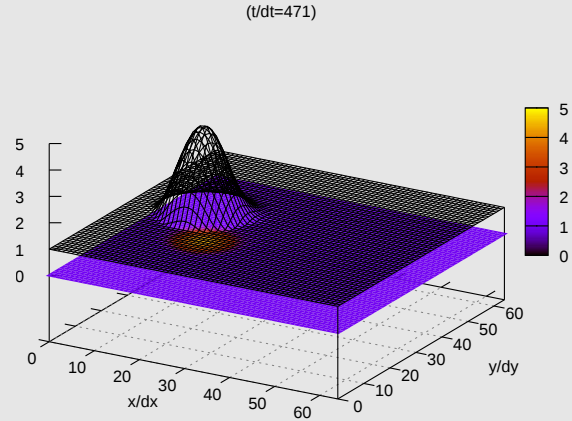

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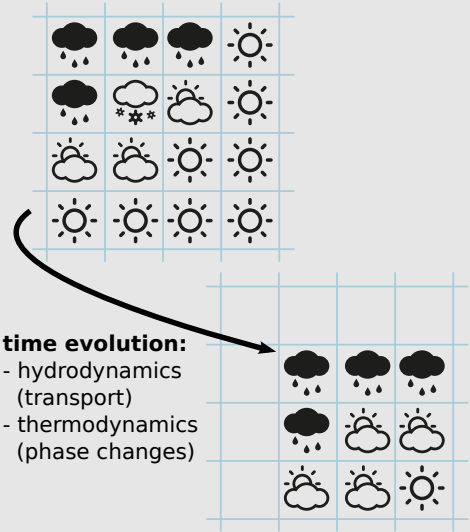

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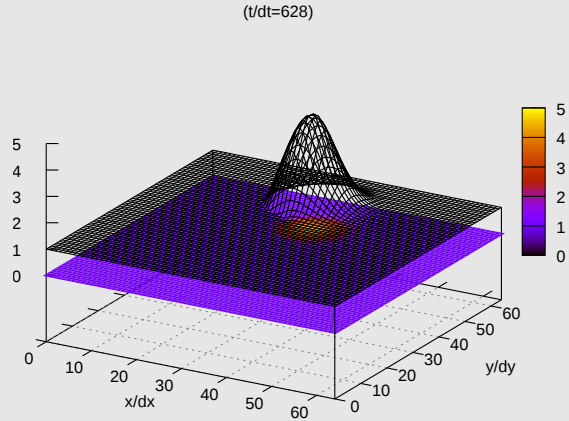
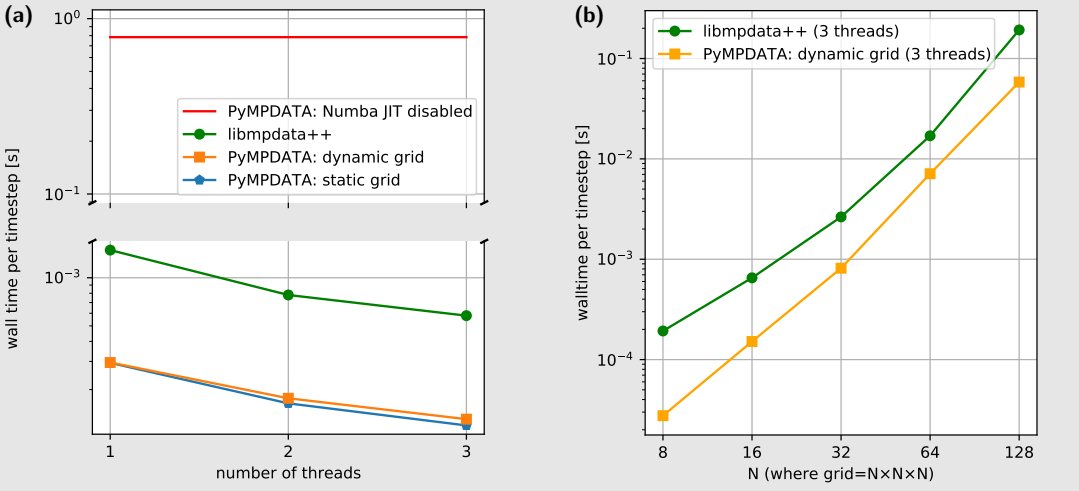


example performance comparison: Bartman et al. 2022 (JOSS) doi:10.21105/joss.03896



PyMPDATA ⇝ Numba (loop-based code, tricky for NumPy/CPython)

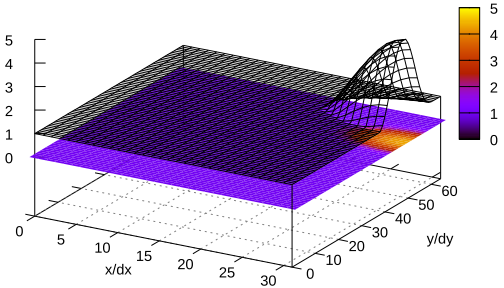
libmpdata++ ⇝ Blitz++ (OOP code; 5×slower than F77 for small domains, on par for larger ones)

what if we need MPI?

https://en.m.wikipedia.org/wiki/Message_Passing_Interface

Message Passing Interface

Message Passing Interface (**MPI**) is a standardized and portable message-passing standard designed to function on parallel computing architectures.[1] The MPI standard defines the syntax and semantics of library routines that are useful to a wide range of users writing portable message-passing programs in C, C++, and Fortran. There are several open-source MPI implementations, which fostered the development of a parallel software industry, and encouraged development of portable and scalable large-scale parallel applications.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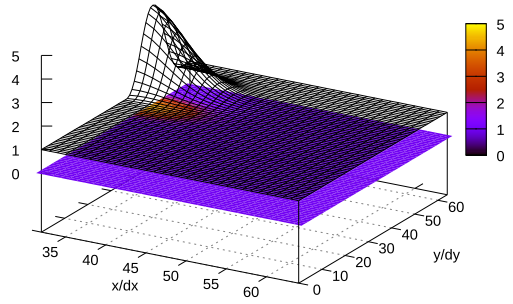
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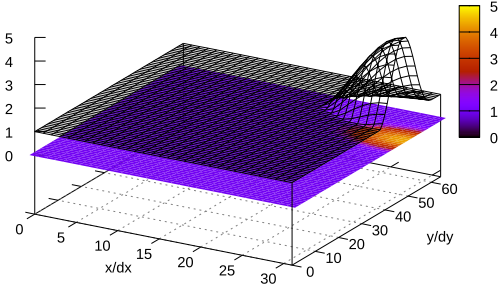

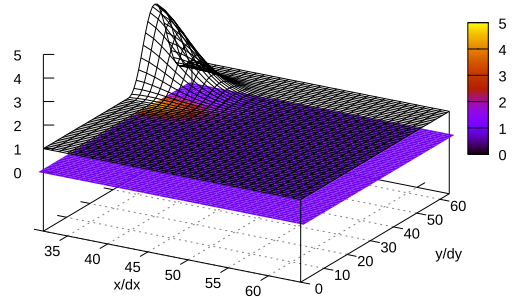

Bangerth & Heister 2013 (Comput. Sci. Discov.) doi:10.1088/1749-4699/6/1/015010

„despite the immense expansion of parallel computation both in the number of machines available as well as in the number of cores per parallel machine since then,

no other parallel programming paradigm has replaced MPI –

even though it is universally acknowledged that MPI is a rather crude way of programming these machines and that MPI might not be successful for machines much larger than the ones available today"

```
1 import numba
2 from mpi4py.MPI import COMM_WORLD
3
4 def number_crunching():
5     rank = COMM_WORLD.Get_rank()
6
7 numba.njit(number_crunching)()
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```
Traceback (most recent call last):
  File ".../numba_plus_mpi4py.py", line 7, in <module>
    numba.njit(number_crunching)()
  File ".../numba/core/dispatcher.py", line 468, in _compile_for_args
    error_rewrite(e, 'typing')
  File ".../numba/core/dispatcher.py", line 409, in error_rewrite
    raise e.with_traceback(None)
numba.core.errors.TypingError: Failed in nopython mode pipeline (step: nopython frontend)

Untyped global name 'COMM_WORLD': Cannot determine Numba type of <class 'mpi4py.MPI.Intracomm'>


File "numba_plus_mpi4py.py", line 5:
def number_crunching():
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    ^
```

- `Numba` is the way to make Python code HPC ready
- `MPI` is the way to do distributed-memory parallelism for HPC

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  $\rightsquigarrow$ *"You will not be able to use `mpi4py`'s `Cython` code, it was not designed for such low-level usage..."*

[1] `https://github.com/numba/numba/issues/4115#issuecomment-642474009`
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- 30 months, 120 commits and 50 PRs from 5 contributors later... (unplanned side project!)

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introducing: numba-mpi

https://github.com/numba-mpi/numba-mpi

numba-mpi

Python 3 | LLVM Numba | Linux ✓ | macOS ✓ | Windows ✓ | tests passing
Pylint passing | Maintained? yes | License GPL v3 | pypi package 0.26 | Anaconda.org 0.26
DOI 10.5281/zenodo.7385622

Numba @njittable MPI wrappers

- covering: `size` / `rank` , `send` / `recv` , `allreduce` , `bcast` , `barrier`
- API based on NumPy and supporting numeric and character datatypes
- auto-generated docstring-based API docs on the web: https://numba-mpi.github.io/numba-mpi
- pure-Python implementation with packages available on PyPI and Conda Forge
- CI-tested on: Linux (MPICH, OpenMPI & Intel MPI), macOS (MPICH & OpenMPI) and Windows (MS MPI)

Hello world example:

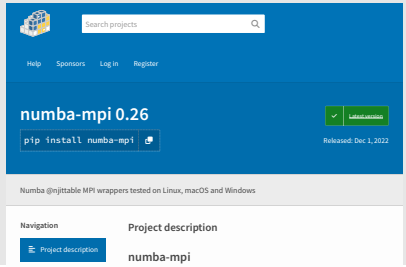
```
import numba, numba_mpi, numpy

@numba.njit()
def hello():
  print(numba_mpi.rank())
  print(numba_mpi.size())

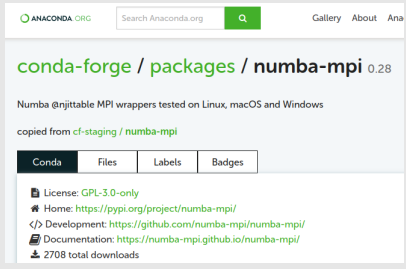
  src = numpy.array([1., 2., 3., 4., 5.])
  dst_tst = numpy.empty_like(src)

  if numba_mpi.rank() == 0:
    numba_mpi.send(src, dest=1, tag=11)
```

https://pypi.org/project/numba-mpi



https://anaconda.org/conda-forge/numba-mpi



numba-mpi: implementation

```
"""MPI_Send() implementation"""
import ctypes

import numba
import numpy as np

```

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 1 """MPI_Send() implementation"""
 2 import ctypes
 3
 4 import numba
 5 import numpy as np
 6
 7 from numba_mpi.common import _MPI_Comm_World_ptr, libmpi, send_recv_args
 8 from numba_mpi.utils import _mpi_addr, _mpi_dtype
 9
10 _MPI_Send = libmpi.MPI_Send
11 _MPI_Send.restype = ctypes.c_int
12 _MPI_Send.argtypes = send_recv_args
13
14
```

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@numba.njit
def send(data, dest, tag):
    """wrapper for MPI_Send, Returns integer status code (0 == MPI_SUCCESS)"""
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    data = np.ascontiguousarray(data)
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    data = np.ascontiguousarray(data)
    status = _MPI_Send(
        data.ctypes.data,
        data.size,
        _mpi_dtype(data),
        dest,
        tag,
        _mpi_addr(_MPI_Comm_World_ptr),
    )

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    )

    # The following no-op prevents numba from too aggressive optimizations
    # This looks like a bug in numba (tested for version 0.55)
    data[0]  # pylint: disable=pointless-statement

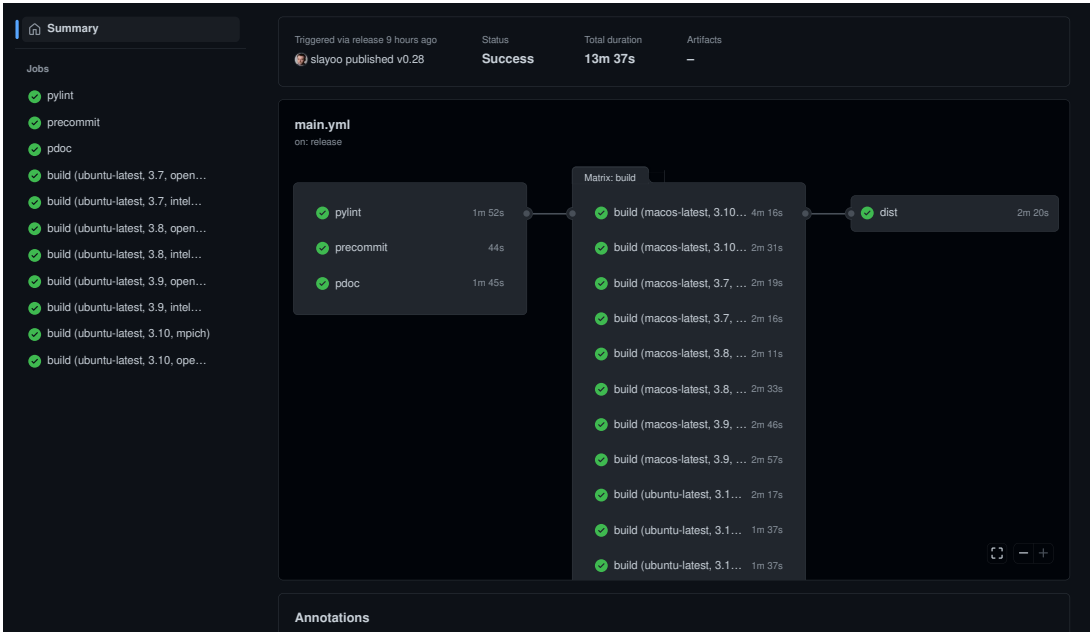
    return status
```

numba-mpi: hacks :(

... but there is also the `utils.py` ...

```python
@numba.extending.overload(_mpi_addr)
def _mpi_addr_njit(ptr):
    def impl(ptr):
        return numba.carray(
            # pylint: disable-next=no-value-for-parameter
            _address_as_void_pointer(ptr),
            shape=(1,),
            dtype=np.intp,
        )[0]

    return impl


# https://stackoverflow.com/questions/61509903/how-to-pass-array-pointer-to-numba-function
@numba.extending.intrinsic
def _address_as_void_pointer(_, src):
    """returns a void pointer from a given memory address"""
    sig = types.voidptr(src)

    def codegen(__, builder, ___, args):
        return builder.inttoptr(args[0], cgutils.voidptr_t)

    return sig, codegen
```

numba-mpi: CI, OSes, MPI impls


Summary
Jobs
pylint
precommit
pdoc
build (ubuntu-latest, 3.7, open…
build (ubuntu-latest, 3.7, intel…
build (ubuntu-latest, 3.8, open…
build (ubuntu-latest, 3.8, intel…
build (ubuntu-latest, 3.9, open…
build (ubuntu-latest, 3.9, intel…
build (ubuntu-latest, 3.10, mpich)
build (ubuntu-latest, 3.10, ope…
Triggered via release 9 hours ago
slayoo published v0.28
Status
Success
Total duration
13m 37s
Artifacts
–
main.yml
on: release
pylint 1m 52s
precommit 44s
pdoc 1m 45s
Matrix: build
build (macos-latest, 3.10… 4m 16s
build (macos-latest, 3.10… 2m 31s
build (macos-latest, 3.7, … 2m 19s
build (macos-latest, 3.7, … 2m 16s
build (macos-latest, 3.8, … 2m 11s
build (macos-latest, 3.8, … 2m 33s
build (macos-latest, 3.9, … 2m 46s
build (macos-latest, 3.9, … 2m 57s
build (ubuntu-latest, 3.1… 2m 17s
build (ubuntu-latest, 3.1… 1m 37s
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dist 2m 20s
Annotations

```yaml
build:
  needs: [pylint, precommit, pdoc]
  strategy:
    matrix:
      platform: [ubuntu-latest, macos-latest, windows-latest]
      python-version: ["3.7", "3.8", "3.9", "3.10"]
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      exclude:
      - platform: macos-latest
        mpi: msmpi
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      # https://github.com/numba-mpi/numba-mpi/issues/69
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      # could result in memory corruption or other system errors.)
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  runs-on: ${{ matrix.platform }}
  steps:
    - uses: actions/checkout@v2
    - uses: actions/setup-python@v1
      with:
        python-version: ${{ matrix.python-version }}
    - uses: mpi4py/setup-mpi@v1
      with:
        mpi: ${{ matrix.mpi }}
    - run: pip install -e .
    - run: pip install pytest
    - run: python -We -c "import mpi4py"
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kudos to `mpi4py` team

for providing `setup-mpi` GitHub Action
this has saved us a lot of time!

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OSes and MPI implementations tested

	Linux	macOS	Windows
OpenMPI	+	+	
MPICH	+	+	
IntelMPI	+		
MSMPI			+

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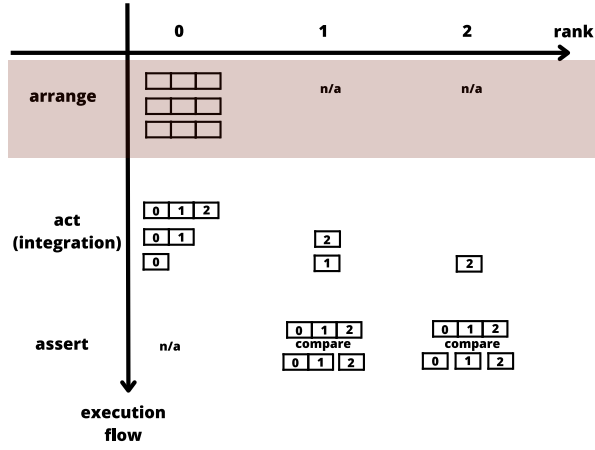
caveat

MPICH v4 fails on Ubuntu for Python <3.10
"*libfabric EFA provider is operating in a condition that could result in memory corruption*" $\rightsquigarrow$ SIGABRT

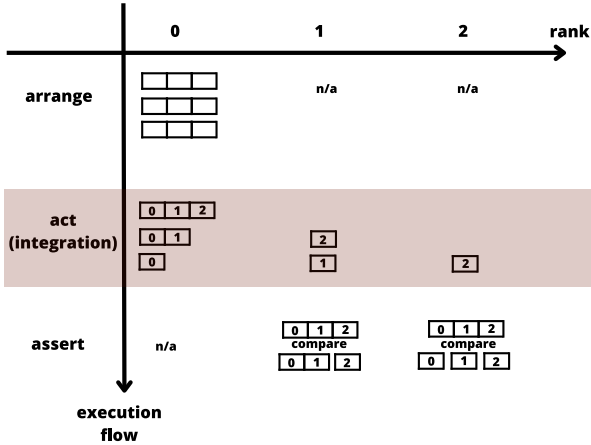
numba-mpi: sample unit test

```python
import numba
import numpy as np
import pytest

import numba_mpi as mpi
from tests.common import MPI_SUCCESS, data_types
from tests.utils import get_random_array


@numba.njit()
def jit_bcast(data, root):
    return mpi.bcast(data, root)


@pytest.mark.parametrize("bcast", (jit_bcast.py_func, jit_bcast))
@pytest.mark.parametrize("data_type", data_types)
def test_bcast_np_array(data_type, bcast):
    root = 0
    data = np.empty(5, data_type).astype(dtype=data_type)
    datatobcast = get_random_array(5, data_type).astype(dtype=data_type)

    if mpi.rank() == root:
        data = datatobcast

    status = bcast(data, root)

    assert status == MPI_SUCCESS

    np.testing.assert_equal(data, datatobcast)
```

sample integration test scheme



(https://github.com/atmos-cloud-sim-uj/PySuperDropletLES/blob/main/tests/test_2d.py)



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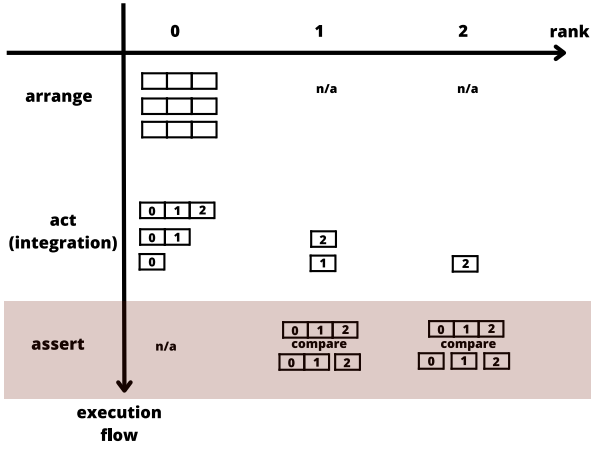

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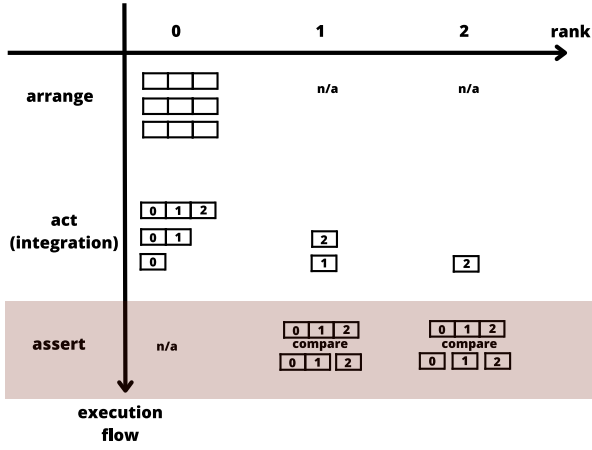

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caveat

using HDF5/MPI-IO (h5py) for concurrent file access from different MPI ranks

... implies insurmountable trouble setting up CI test env on Windows (help welcome!)

`py-pde`: independent use case

`py-pde` is a Python package for solving partial differential equations (PDEs).

https://py-pde.readthedocs.io

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Focus:

- Finite differencing and simple grids
- PDEs defined by mathematical expressions (supplied as strings)

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Focus:

- Finite differencing and simple grids
- PDEs defined by mathematical expressions (supplied as strings)

https://py-pde.readthedocs.io

Solution strategy:

- Partition the grid onto different nodes using `numba-mpi`
- On each node, parse expressions using `sympy` and compile the result using `numba`
- Iterate the PDE, exchanging boundary information between nodes using `numba-mpi`

take-home messages

Python:

- common mismatch: **language vs. ecosystem** (e.g., arrays, number-crunching)
- has a range of **gluable HPC solutions** (JIT, GPU, multi-threading, MPI, ...)

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numba-mpi:

- enables one to **glue** `MPI` **with** `LLVM` **JIT-compiled Python** code
- **CI-tested** on Linux, macOS, Windows; `MPICH`, `OpenMPI`, `Intel MPI`, & `MS MPI`
- developed aiming for **100% unit test coverage** (of the wrapping logic)
- already a dependency of two PDE-solver projects: `py-pde` & `PySuperDropletLES`

numba-mpi sites:

- github.com/numba-mpi (contributors: slayoo, xann16, david-zwicker, Delcior, abulenok)
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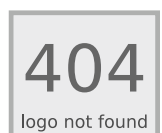
contributions welcome:

- packaging `h5py` **for Windows** (`HDF5`) with support for `MPI-IO`
- `MPICH` $\geqslant$ 4.0 with Python $<$ 3.10 on Linux (`libfabric` **EFA provider issue**)
- numba-mpi contribs:
  - **logo**
  - adding support for other functions from the MPI API
  - **droping dependency on mpi4py**
  - benchmarking performance



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funding:

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