

Sylwester Arabas¹, Zach D'Aquino², Jeff Curtis², Nicole Riemer², Matt West³ & [Py]PartMC contributors

Jan 26th 2024 Columbia University, New York

¹Physics & Applied CS, AGH University of Krakow, Poland (agh.edu.pl)

²Atmospheric Sciences, University of Illinois at Urbana-Champaign (atmos.illinois.edu)

³Mechanical Science & Engineering, University of Illinois at Urbana-Champaign (mechse.illinois.edu)

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 - \rightsquigarrow isotopic composition of water in particle-based $\mu\text{-physics}$

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 - \rightsquigarrow isotopic composition of water in particle-based μ -physics
- maintainer & developer:
 - ▶ github.com/numba-mpi
 - github.com/open-atmos/{PySDM,PyMPDATA,PyPartMC}



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aerosol dynamics package:

engineering Python-to-Fortran bindings in C++, for use in Julia and Matlab

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plan of the talk

PyPartMC: context / statement of need

PyPartMC: goals and status

PyPartMC: design & implementation outline

PyPartMC: demo

PyPartMC: summary





► Monte-Carlo aerosol dynamics simulation package



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- box-model framework with a coupler to, e.g., WRF



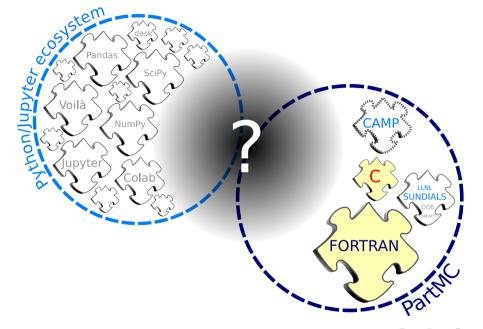
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- highlight: aerosol mixing state evolution
- object-oriented architecture, F90, extensive automated test suite



plan of the talk

PyPartMC: goals and status

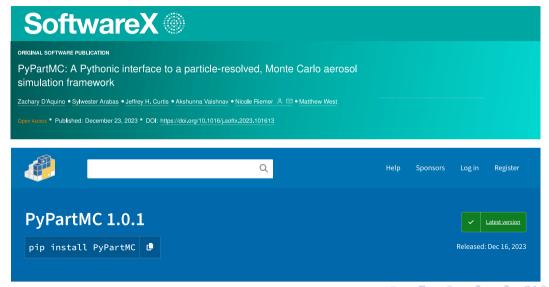
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- ensure the same experience on Linux, macOS & Windows
- ▶ lower the entry threshold for usage with Jupyter-based example notebooks
- streamline the dissemination of paper-result reproducers (peer review)

status of the project: v1.0 in Dec 2023 (started 2021)



plan of the talk

PyPartMC: context / statement of need

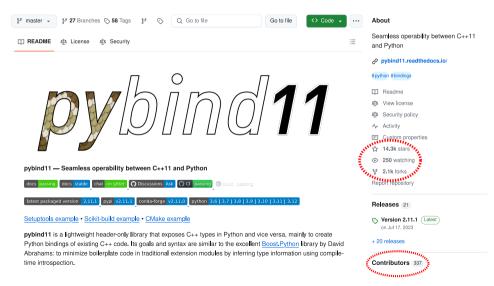
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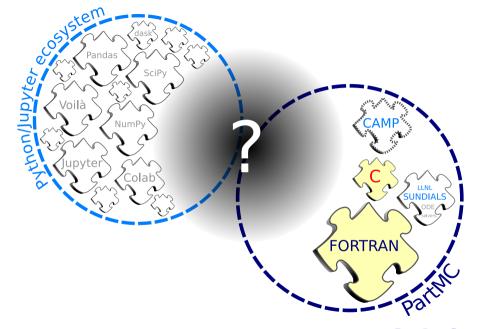
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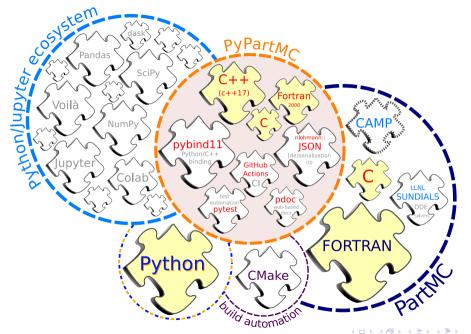
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pybind11







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- dependency version pinning with git submodules: PartMC (F), CAMP (C/F), json (C++), pybind11 (C++), json-fortran (F), netCDF (C/F), SUNDIALS (F/C), SuiteSparse (C), ... & backports of C++20 features to C++17 (multilinux!): span, string_view, optional

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- ▶ all dependencies (incl. Fortran and C++ runtimes) statically linked (single-file install)

user perspective: Fortran (PartMC)

```
c: Fortran code
program main
  use pmc spec file
  use pmc aero data
  use pmc aero mode
  use pmc aero dist
  use pmc aero state
  implicit none
  type(spec file t) :: f aero data, f aero dist
  type(aero data t) :: aero data
  type(aero dist t) :: aero dist
  type(aero state t) :: aero state
  integer, parameter :: n part = 100
  integer :: n part add
  real(kind=dp), dimension(n part) :: num concs, masses
  call spec file open("aero data.dat", f aero data)
  call spec file read aero data(f aero data, aero data)
  call spec file close(f aero data)
  call spec file open("aero dist.dat", f aero dist)
  call spec file read aero dist(f aero dist, aero data, aero dist)
  call spec file close(f aero dist)
  call aero state zero(aero state)
  call fractal set spherical(aero data%fractal)
  call aero state set weight(aero state, aero data, &
    AERO STATE WEIGHT NUMMASS SOURCE)
  call aero state set n part ideal(aero state, dble(n part))
  call aero state add aero dist sample(aero state, aero data, &
    aero dist, 1d0, 0d0, .true., .true., n part add)
  num concs = aero state num concs(aero state, aero data)
  masses = aero state masses(aero state, aero data)
  print *, dot product(num concs, masses), "# kg/m3"
```

d: aero_dist.dat file (for Fortran code)

```
mode_name cooking_comp.dat
diam_type_geometric
mode_type_log_normal
num_conc 3.2e9 # (#/m"3)
geom_mean_diam 8.6ee-9 # (m)
log10_geom_std_dev 0.28

mode_name diese1
mass_frac diese1_comp.dat
dlam_type_geometric
mode_type log_normal
num_conc 2.9e9 # (#/m"3)
geom_mean_diam_5e-8
log10_geom_atd_dev 0.24
```

e: cooking_comp.dat file (for Fortran code)

```
# proportion
OC 1
```

f: diesel_comp.dat file (for Fortran code)

```
# proportion
OC 0.3
BC 0.7
```

user perspective: Python (PyPartMC)

a: Python code (with embedded data)

```
import numpy as np
import PyPartMC as ppmc
from PyPartMC import si
aero data = ppmc.AeroData((
          [density, ions in solution, molecular weight, kappa]
    {"OC": [1000 *si,kg/si,m**3, 0, 1e-3 *si,kg/si,mol, 0,0011},
    {"BC": [1800 *si.kg/si.m**3, 0, 1e-3 *si.kg/si.mol, 0]},
aero dist = ppmc.AeroDist(
    aero data,
        "cooking": {
           "mass frac": [{"OC": [1]}],
            "diam type": "geometric".
           "mode type": "log normal",
            "num conc": 3200 / si.cm**3.
            "geom mean diam": 8.64 * si.nm.
            "log10 geom std dev": 0.28.
        "diesel": (
            "mass frac": [{"OC": [0.3]}, {"BC": [0.7]}],
            "diam type": "geometric".
            "mode type": "log normal".
            "num conc": 2900 / si.cm**3,
            "geom_mean_diam": 50 * si.nm,
            "log10 geom std dev": 0.24.
    }],
n part = 100
aero state = ppmc.AeroState(aero data, n part, "nummass source")
aero state.dist sample(aero dist)
print(np.dot(aero state.masses, aero state.num concs), "# kg/m3")
```

user perspective: Python (PyPartMC) & Julia (via PyCall.jl)

a: Python code (with embedded data)

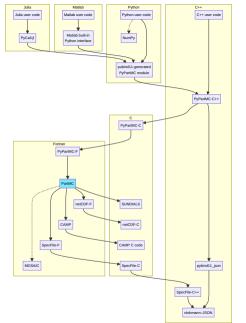
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import numpy as np
import PyPartMC as ppmc
from PyPartMC import si
aero data = ppmc.AeroData((
          [density, ions in solution, molecular weight, kappa]
    {"OC": [1000 *si,kg/si,m**3, 0, 1e-3 *si,kg/si,mol, 0,0011},
    {"BC": [1800 *si.kg/si.m**3, 0, 1e-3 *si.kg/si.mol, 0]},
aero dist = ppmc.AeroDist(
    aero data,
        "cooking": {
            "mass frac": [{"OC": [1]}],
            "diam type": "geometric",
            "mode type": "log normal",
            "num conc": 3200 / si.cm**3.
            "geom mean diam": 8.64 * si.nm.
            "log10 geom std dev": 0.28.
        "diesel": (
            "mass frac": [{"OC": [0.31], {"BC": [0.71]].
            "diam type": "geometric".
            "mode type": "log normal".
            "num conc": 2900 / si.cm**3,
            "geom mean diam": 50 * si.nm.
            "log10 geom std dev": 0.24.
    }],
n part = 100
aero state = ppmc.AeroState(aero data, n part, "nummass source")
aero state.dist sample(aero dist)
print(np.dot(aero state.masses, aero state.num concs), "# kg/m3")
```

b: Julia code (with embedded data)

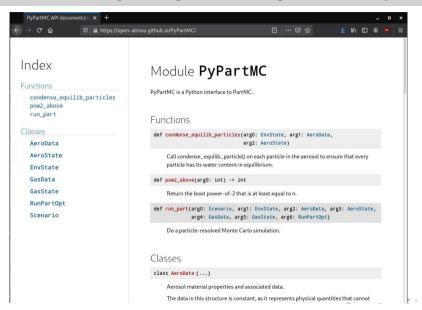
```
using Pkg
Pkg.add("PyCall")
using PyCall
ppmc = pvimport("PvPartMC")
si = ppmc["si"]
aero data = ppmc.AeroData((
         (density, ions in solution, molecular weight, kappa)
 Dict("OC"=>(1000 * si.kg/si.m^3, 0, 1e-3 * si.kg/si.mol, 0.001)),
 Dict("BC"=>(1800 * si.kg/si.m^3, 0, 1e-3 * si.kg/si.mol, 0))
1)
aero dist = ppmc.AeroDist(aero data, (
 Dict(
    "cooking" => Dict(
     "mass frac" => (Dict("OC" => (1,)),),
     "diam type" => "geometric".
     "mode type" => "log normal".
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     "geom mean diam" => 8.64 * si.nm,
      "log10 geom std dev" => .28.
    "diesel" => Dict(
     "mass frac" => (Dict("OC" => (.3,)), Dict("BC" => (.7,))),
     "diam type" => "geometric".
     "mode type" => "log normal".
      "num conc" => 2900 / si.cm^3.
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n part = 100
aero state = ppmc.AeroState(aero data, n part, "nummass source")
aero state.dist sample(aero dist)
print(aero state.masses'aero state.num concs, "# kg/m3")
```

user perspective: Matlab (built-in Python bridge)

```
ppmc = py.importlib.import module('PyPartMC');
si = pv.importlib.import module('PvPartMC').si:
aero data = ppmc.AeroData(py.tuple({ ...
  pv.dict(pvargs("OC", pv.tuple({1000 * si.kg/si.m^3, 0, 1e-3 * si.kg/si.mol, 0,001}))), ...
 py.dict(pyargs("BC", py.tuple({1800 * si.kg/si.m^3, 0, 1e-3 * si.kg/si.mol, 0}))) ...
aero dist = ppmc.AeroDist(aero data, py.tuple({ ...
  pv.dict(pvargs( ...
    "cooking", pv.dict(pvargs( ...
      "mass frac", py.tuple({py.dict(pyargs("OC", py.tuple({1})))}), ...
     "diam type", "geometric", ...
     "mode type", "log normal", ...
     "num conc", 3200 / si.cm^3, ...
     "geom mean diam", 8.64 * si.nm, ...
     "log10 geom std dev". .28 ...
    )) ...
  )), ...
  pv.dict(pvargs( ...
    "diesel", py.dict(pyargs( ...
     "mass frac", pv.tuple({ ...
       pv.dict(pvargs("OC", pv.tuple({.3}))), ...
       pv.dict(pvargs("BC", pv.tuple({.7}))). ...
      "diam type", "geometric", ...
     "mode type", "log normal", ...
     "num conc", 2900 / si.cm^3, ...
      "geom mean diam", 50 * si.nm, ...
      "log10 geom std dev" ...
    )) ...
 )) ...
}));
n part = 100:
aero state = ppmc.AeroState(aero data, n part, "nummass source"):
aero state.dist sample(aero dist):
masses = cell(aero state.masses()):
num concs = cell(aero state.num concs);
forintf('%q \# kq/m3\n', dot([masses{:}], [num concs{:}]))
```



PyPartMC API docs: https://open-atmos.github.io/PyPartMC/



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using PartMC on Windows



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- ▶ using pybind11 for Fortran



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- using pybind11-generated packages from within Matlab



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PyPartMC [fun] facts:

architecture entirely contingent on PartMC's modular/OOP design (and tests!)



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- ▶ 500+ lines of CMake code (compilation, static linkage of dependencies)



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- ▶ exception propagation from C++ through Fortran to C++ compiler dependent







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- encapsulating simulation setup/input within one single-language file (e.g., for paper review)
- extending PartMC simulation/diagnostics logic with Python code (optics with PyMieScatt)
- streamlined workflows for generating simulation ensembles (no need for input text files!)



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- ▶ leveraging Python binary dissemination system for PartMC and dependencies (static linkage)
- encapsulating simulation setup/input within one single-language file (e.g., for paper review)
- extending PartMC simulation/diagnostics logic with Python code (optics with PyMieScatt)
- streamlined workflows for generating simulation ensembles (no need for input text files!)
- offering users (students) a single-language familiar quick-start environment

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Thank you for your attention!

pypi.org/p/PyPartMC github.com/open-atmos/PyPartMC doi:10.1016/j.softx.2023.101613