

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

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





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

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

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Monte-Carlo aerosol dynamics simulation package





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open source, GPLv2





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- simulating air pollution evolution through particle coagulation, condensation, chemical reactions, ...
- object-oriented architecture, F90, extensive automated test suite
- usage poses challenges, e.g., to students intending to use it from Jupyter notebooks (dependencies, compilation, updates, automation usually through shell, multi-text-file i/o, output analysis requiring bringing in Fortran, ...)



Iower the entry threshold for installing and setting up of PartMC down to pip install PyPartMC, i.e., no manual dependency installation, no compilation, user doesn't even need to know FORTRAN is involved

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streamline the dissemination of paper-result reproducers (peer review)

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



pybind11



Python bindings of existing C++ code, its goals and syntax are similar to the excellent Boost Python library by David Abrahams: to minimize boilerplate code in traditional extension modules by inferring type information using compiletime introspection.

About

Seamless operability between C++11 and Python

pybind11.readthedocs.io/







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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"
end
```

d: aero_dist.dat file (for Fortran code)

mode name cooking mass frac cooking comp.dat diam type geometric mode type log normal num conc 3.2e9 # (#/m^3) geom mean diam 8.64e-9 # (m) log10 geom std dev 0.28

mode name diesel mass frac diesel comp.dat diam type geometric mode type log normal num conc 2.9e9 # (#/m^3) geom mean diam 5e-8 log10 geom std dev 0.24

e: cooking_comp.dat file (for Fortran code)

proportion oc

#

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,
    11
        "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)

import numpy as np

n part = 100

aero state.dist sample(aero dist)

```
import PyPartMC as ppmc
from PyPartMC import si
```

```
aero dist = ppmc.AeroDist(
    aero data,
   11
       "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.
   }],
```

aero state = ppmc.AeroState(aero data, n part, "nummass source")

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 = pyimport("PyPartMC")
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, le-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",
     "num conc" => 3200 / si.cm^3.
     "geom mean diam" => 8.64 * si.nm,
      "log10 geom atd dev" => .28.
    ١
    "diesel" => Dict(
     "mass frac" => (Dict("OC" => (.3,)), Dict("BC" => (.7,))),
     "diam type" => "geometric".
     "mode type" => "log normal".
      "num conc" => 2900 / si.cm^3.
     "geom mean diam" => 50 * si.nm,
      "log10 geom std dev" => .24.
))
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")

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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", py.dict(pyargs( ...
     "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(pyargs( ...
   "diesel", py.dict(pyargs( ...
     "mass frac", pv.tuple({ ...
       pv.dict(pvargs("OC", pv.tuple({.3}))), ...
       pv.dict(pvargs("BC", py.tuple({.7}))), ...
     }). ...
     "diam type". "geometric".
     "mode type", "log normal", ...
     "num conc", 2900 / si.cm^3....
     "geom mean diam", 50 * si.nm, ...
     )) ...
 )) ...
}));
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);
fprintf('%q # kq/m3\n', dot([masses{:}], [num concs{:}]))
```

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github.com/open-atmos/PyPartMC/actions/

o Summary Jobs ⊘ julia ⊘ python	Triggered via schedule 2 days ago (2) slayco & 6b59486 main Artifacts 1	Status Success	Total duration 12m 10s
fortran mallab assert	readme_listings.yml on: schedule		
் Usage த Workflow file	 julia python fortran matlab 	4m 27s 3m 44s 36s 4m 57s	🤕 🥝 assert
			(1) -+

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import PyPartMC as ppmc from PyPartMC import si
<pre>aero_data = ppmc.AeroData((# [density, ions in solution, molecular weight, kappa] ("0(": [1000 *: i, ka/si.m**3, 0, 10-3 * si.ka/si.mol, 0,001]).</pre>
{"BC": [1800 + si.kg/si.m +3, 0, 1e-3 + si.kg/si.mol, 0]},))







```
#include "pybind11/pybind11.h"
#include "nlohmann/json.hpp"
#include "pybind11_json/pybind11_json.hpp"
#include "aero data.hpp"
namespace py = pybind11;
PYBIND11 MODULE( PyPartMC, m) {
    py::class <
        AeroData.
        std::shared ptr<AeroData>
    >(m. "AeroData")
         .def(py::init<const nlohmann::json&>())
    [...]
    m.attr("__all__") = py::make_tuple(
         "AeroData".
         [...]
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```



#pragma once

#include "pmc_resource.hpp"
#include "gimmicks.hpp"

[...]

```
extern "C" void f_aero_data_ctor(void *ptr) noexcept;
extern "C" void f_aero_data_dtor(void *ptr) noexcept;
extern "C" void f_aero_data_from_json(const void *ptr) noexcept;
```

[...]

```
struct AeroData {
PMCResource ptr;
```

if (!InputGimmick::unique_keys(json))
 throw std::runtime_error("Species names must be unique");

```
GimmickGuard<InputGimmick> guard(json);
f_aero_data_from_json(this->ptr.f_arg());
```

[...]

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module PyPartMC_aero_data
 use iso_c_binding
 use pmc_aero_data
 implicit none

contains

subroutine f_aero_data_ctor(ptr_c) bind(C)
type(aero_data_t), pointer :: ptr_f => null()
type(c_ptr), intent(out) :: ptr_c

allocate(ptr_f)
call fractal_set_spherical(ptr_f%fractal)
ptr_c = c_loc(ptr_f)
end subroutine

subroutine f_aero_data_dtor(ptr_c) bind(C)
type(aero_data_t), pointer :: ptr_f => null()
type(c_ptr), intent(in) :: ptr_c

call c_f_pointer(ptr_c, ptr_f)
 deallocate(ptr_f)
end subroutine

subroutine f_aero_data_from_json(ptr_c) bind(C)
type(aero_data_t), pointer :: ptr_f => null()
type(c_ptr), intent(in) :: ptr_c
type(spec_file_t) :: file
call c_f_pointer(ptr_c, ptr_f)
call spec_file_read_aero_data(file, ptr_f)
end subroutine

[...]

end module



unmodified PartMC code (git submodule)

! Copyright (C) 2005-2012, 2016, 2021 Nicole Riemer and Matthew West ! Licensed under the GNU General Public License version 2 or (at your ! option) any later version. See the file COPYING for details.

[...]

module pmc_aero_data
 use pmc_spec_file

[...]

contains

[...]

subroutine spec_file_read_aero_data(file, aero_data)

[...]

type(spec_file_t), intent(inout) :: file
type(aero_data_t), intent(inout) :: aero_data
real(kind=dp), allocatable :: species_data(:,:)

[...]

call spec_file_read_real_named_array(file, 0, species_name, species_data)

[...]

end subroutine spec_file_read_aero_data

[...]

end module pmc_aero_data

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module pmc_spec_file [...] [...] subroutine c spec file read real named array data(& row, & names_data, names_size, & vals_data, vals_size &) bind(C) character, intent(in) :: names_data real(c_double), intent(out) :: vals_data integer, intent(in) :: row, vals_size, names_size end subroutine end interface [...] subroutine spec file read real named array(file, max lines, names, vals) do row = 1, n_rows call c spec file read real named array data(& row. & names(row), name_size, & vals_row(1), size(vals, 2) & i....1 end do [....] end subroutine [...] end module

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#include "gimmicks.hpp" void spec file read real named array data(const unsigned int row, char *name data. int *name size. const tcb::span<double> &vals) neexcept (auto i = 0u, n numeric array entries = gimmick ptr()->n numeric array entries(); for (auto it = gimmick ptr()->begin(); i < n numeric array entries;</pre> ++i. ++it assert(it->is object()); if (i == row-1) { assert(it->size() == 1): for (auto &entry : it->items()) { for (auto c=0u; c < entry.key().size(); ++c)</pre> name data[c] = entry.key()[c]; *name size = entry.kev().size(): [...] extern "C" void c spec file read real named array data(const int *row. char *name data. int *name size. double *vals data, const int *vals size) neexcept name_data, name_size, tcb::span<double>(vals data, *vals size) [....]





#include "gimmicks.hpp" void spec_file_read_real_named_array_data(const unsigned int row, char *name data. int *name size. const tcb::span<double> &vals) neexcept (auto i = 0u, n numeric array entries = gimmick ptr()->n numeric array entries(); for (auto it = gimmick ptr()->begin(); i < n numeric array entries;</pre> ++i, ++it assert(it->is object()); if (i == row-1) { assert(it->size() == 1): for (auto &entry : it->items()) { for (auto c=0u; c < entry.key().size(); ++c)</pre> name data[c] = entry.key()[c]; *name size = entry.kev().size(): [...] extern "C" void c spec file read real named array data(const int *row. char *name data. int *name size. double *vals data, const int *vals size) neexcept name_data, name_size, tcb::span<double>(vals data, *vals size)

[....]



json.nlohmann.me

JSON for Modern C++

JSON for Modern C++

What if JSON was part of modern C++?



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



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single-command (pip) install on Windows, Linux & macOS (source-only for ARM)



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- ► offering users (students) a single-language familiar environment (Colab, ARM JupyterHub)





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- SoftwareX review: actually also concerned code/installation

acknowledgements







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Thank you for your attention!

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