# On applications of MPDATA in cloud microphysics and finance 

Sylwester Arabas<br>Jagiellonian University

## uj.edu.pl

## Jagiellonian University, Kraków, Poland



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.. founded in 1364, among 20 world oldest (in cont. operation)

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: host to Smoluchowski Institute of Physics
:- 1917 Smoluchowski elected as Rector (professor since 1913)

## Maurycy Pius Rudzki (1862-1916)

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From Wikipedia, the free encyclopedia
Maurycy Pius Rudzki (b. 1862, d. 1916) was the first person to call himself a professor of geophysics. He held the Chair of Geophysics at the Jagiellonian University in Krakow, and established the Institute of Geophysics there in 1895. His research specialty was elastic anisotropy, as applied to wave propagation in the earth, and he established many of the fundamental results in that arena. ${ }^{[1]}$

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Maurycy Pius Rudzki

"Principles of Meteorology" book (1917)

DR M. P. RUDZKI
PROPESOR UNIWERSYTETU JAOLELLONSYIEOO, DYREKTOR OBSERWATOKYUM ASTRONOMICZNEOO W KRAKOWIE.

## ZASADY <br> METEOROLOGII

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$66 \sim_{\text {Pr }}$ (T)    bחnivio miayazo

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## plan of the talk

- MPDATA (Smolarkiewicz '83 ... Smolarkiewicz et al. 20XX)
- MPDATA goes open source: (Arabas et al. '14, Jaruga et al. '15)
- MPDATA meets Black-Scholes (Arabas \& Farhat, 2019)
- MPDATA \& diffusional growth (with Olesik \& Unterstraßer, WIP)


## MPDATA

a.k.a. the Smolarkiewicz method

MPDATA in a nutshell (Smolarkiewicz 1983 MWR . . . )
transport PDE: $\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)=0$

## MPDATA in a nutshell (Smolarkiewicz 1983 MWR . . . )

$$
\begin{aligned}
& \text { transport PDE: } \frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)=0 \\
& \psi_{i}^{n+1}=\psi_{i}^{n}-\left[F\left(\psi_{i}^{n}, \psi_{i+1}^{n}, \mathcal{C}_{i+1 / 2}\right)-F\left(\psi_{i-1}^{n}, \psi_{i}^{n}, \mathcal{C}_{i-1 / 2}\right)\right] \\
& F\left(\psi_{L}, \psi_{R}, \mathcal{C}\right)=\max (\mathcal{C}, 0) \cdot \psi_{L}+\min (\mathcal{C}, 0) \cdot \psi_{R} \quad \text { upvind } \\
& \mathcal{C}=v \Delta t / \Delta x
\end{aligned}
$$

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\end{aligned}
$$

modified eq.: $\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)+\underbrace{K \frac{\partial^{2} \psi}{\partial x^{2}}}_{\text {numerical diffusion }}+\ldots=0$ MEA

$$
\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)+\frac{\partial}{\partial x} \underbrace{\left[\left(-\frac{K}{\psi} \frac{\partial \psi}{\partial x}\right) \psi\right]}_{\text {antidiffusive flux }}=0
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modified eq

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MPDATA: reverse numerical diffusion by integrating the antidiffusive flux using upwind (in a corrective iteration)

$$
\mathcal{C}_{i+1 / 2}^{\prime}=\left(\left|\mathcal{C}_{i+1 / 2}\right|-\mathcal{C}_{i+1 / 2}^{2}\right) A_{i+1 / 2}
$$

$$
A_{i+1 / 2}=\frac{\psi_{i+1}-\psi_{i}}{\psi_{i+1}+\psi_{i}}
$$

## MPDATA: key features (review: e.g. Smolarkiewicz 2006)

Multidimensional Positive Definite Advection Transport Algorithm

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\# High-Order Accurate:
up to 3rd-order in time and space (dep. on options \& flow)
. Monotonic:
with Flux-Corrected Transport option

## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell $\mathrm{t} / \mathrm{dt}=0$

mpdata<3>t/dt=0


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

mpdata<3> t/dt=6


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell $\mathrm{t} / \mathrm{dt}=0$

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

mpdata<3> $\mathrm{t} / \mathrm{dt}=12$


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata<3>t/dt=0

mpdata<3>t/dt=18


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata<3>t/dt=0

mpdata<3> $\mathrm{t} / \mathrm{dt}=24$


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

mpdata<3> t/dt=30


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata<3>t/dt=0

mpdata<3>t/dt=36


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

mpdata $<3>\mathrm{t} / \mathrm{dt}=42$


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

mpdata<3>t/dt=48


## 2D example (Arabas et al. 2014, Sci. Prog.)

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$


donorcell $\mathrm{t} / \mathrm{dt}=0$
donorcell $\mathrm{t} / \mathrm{dt}=54$



## 2D example (Arabas et al. 2014, Sci. Prog.)

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

donorcell $\mathrm{t} / \mathrm{dt}=0$
donorcell $\mathrm{t} / \mathrm{dt}=60$

mpdata<3> $\mathrm{t} / \mathrm{dt}=60$


## 2D example (Arabas et al. 2014, Sci. Prog.)

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

donorcell $\mathrm{t} / \mathrm{dt}=0$
donorcell $\mathrm{t} / \mathrm{dt}=66$

mpdata<3> $\mathrm{t} / \mathrm{dt}=66$


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata<3>t/dt=0

mpdata $<3>\mathrm{t} / \mathrm{dt}=72$


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata<3>t/dt=0

mpdata<3> $\mathrm{t} / \mathrm{dt}=78$


## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata $<3>\mathrm{t} / \mathrm{dt}=0$

mpdata<3> $\mathrm{t} / \mathrm{dt}=84$


## 2D example (Arabas et al. 2014, Sci. Prog.)

mpdata<3>t/dt=0


donorcell t/dt=0
donorcell t/dt=90



## 2D example (Arabas et al. 2014, Sci. Prog.)

donorcell t/dt=0

mpdata<3>t/dt=0

mpdata<3>t/dt=96


## libmpdata++

## libmpdata $++:$ new open-source implementation in $\mathrm{C}++$

## Jaruga et al. 2015

Geosci. Model Dev., 8, 1005-1032, 2015
www.geosci-model-dev.net/8/1005/2015/

## Geoscientific Model Development

# libmpdata++ 1.0: a library of parallel MPDATA solvers for systems of generalised transport equations 

A. Jaruga ${ }^{1}$, S. Arabas ${ }^{1}$, D. Jarecka ${ }^{1,2}$, H. Pawlowska ${ }^{1}$, P. K. Smolarkiewicz ${ }^{3}$, and M. Waruszewski ${ }^{1}$<br>${ }^{1}$ Institute of Geophysics, Faculty of Physics, University of Warsaw, Warsaw, Poland<br>${ }^{2}$ National Center for Atmospheric Research, Boulder, CO, USA<br>${ }^{3}$ European Centre for Medium-Range Weather Forecasts, Reading, UK

## libmpdata ++ : rotating cone test

$$
(t / d t=0)
$$



## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=157$ )


## libmpdata ++ : rotating cone test

( $/ \mathrm{dt}=314$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=471$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=628$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=628$ )


64 LOC using libmpdata++

```
    1 #include <libmpdata++/solvers/mpdata.hpp>
    #include <libmpdata++/concurr/serial.hpp>
    #include <libmpdata++/output/gnuplot.hpp>
    4
    s int main()
    { {
        namespace lmpdt = libmpdataxx;
        const int nx=64, ny=64, nt = 628;
        // compile-time parameters
        struct ct_params_t : lmpdt::ct_params_default_t
        {
            using real t = double;
            enum { n_dims = 2 };
            enum { n_eqns = 1 };
        };
        // solver choice
        using run_t = lmpdt::output::gnuplot< lmpdt::solvers::mpdata< ct_params_t >>;
        // runtime parameters
        typename run_t::rt_params_t p;
        p.grid_size = {nx+1, ny+1};
        p.outfreq = nt/4;
        p.gnuplot_output = "out_%S_%d.svg";
        p.gnuplot_with = "lines";
        p.gnuplot_cbrange = p.gnuplot_zrange = "[0:5]";
        // sharedmem concurency and boundary condition choice
        lmpdt::concurr::serial<
            run_t,
            lmpdt::bcond::open, lmpdt::bcond::open, // x-left, x-right
            lmpdt::bcond::open, lmpdt::bcond::open // y-left, y-right
        > run(p);
```

35

```
// initial condition
{
    using namespace blitz::tensor;
    auto psi = run.advectee();
    const double
        dt = .1, dx = 1, dy = 1, omega = .1,
        h = 4., h0 = 1, r = .15 * nx * dx,
        x0 =.5 * nx * dx, y0 = .75 * ny * dy,
        xc =.5 * nx * dx, yc = .50 * ny * dy;
    // cone shape cut at h0
    psi = blitz::pow(i * dx - x0, 2) +
                blitz::pow(j * dy - y0, 2);
    psi = h0 + where(
        psi - pow(r, 2) <= 0, // if
        h - blitz::sqrt(psi / pow(r/h,2)), // then
        0. // else
    );
    // constant-angular-velocity rotational field
    run.advector(0) = omega * (j * dy - yc) * dt/dx;
    run.advector(1) = -omega * (i * dx - xc) * dt/dy;
}
    // time stepping
    run.advance(nt);
```

35

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    run.advector(1) = -omega * (i * dx - xc) * dt/dy;
```

\}
// time stepping
run.advance(nt);
1 cmake_minimum_required(VERSION 3.0)
2 project (hello_world CXX)
3 find_package(libmpdata++)
4 set(CMAKE_CXX_FLAGS \$\{libmpdataxx_CXX_FLAGS_RELEASE\})
5 add_executable(hello_world hello_world.cpp)
6 target_link_libraries (hello_world $\$\{$ libmpdataxx_LIBRARIES $\})$

## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=0$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=157$ )


## libmpdata ++ : rotating cone test

( $/ \mathrm{dt}=314$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=471$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=628$ )


## libmpdata ++ : rotating cone test

( $\mathrm{t} / \mathrm{dt}=628$ )


64 LOC using libmpdata++

## with multi-threading $\rightsquigarrow$ also 64 LOC!

```
2c2
< #include <libmpdata++/concurr/serial.hpp>
---
> #include <libmpdata++/concurr/threads.hpp>
30c30
< lmpdt::concurr::serial<
---
> lmpdt::concurr::threads<
```

```
$ top
```

-••
PID USER PR NI S \%CPU \%MEM nTH TIME+ COMMAND
21031 slayoo $20 \quad 0 \quad R \quad 73.7$ 0.1 4 0:01.68 hello_worl 90\%

## MPI + threads $\rightsquigarrow$ also 64 LOC!!! (recompilation only)

\$ cmake . -DCMAKE_CXX_COMPILER=mpic++
\$ make
\$ OMP_NUM_THREADS=2 mpirun -np 2 ./hello_world

## \$ top

| PID USER | PR | NI | S | \%CPU | \%MEM | nTH | TIME+ | COMmAND |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 19640 slayoo | 20 | 0 | R | 65.5 | 0.3 | 2 | 0:00.92 | hello_worl | 98\% |
| 19641 slayoo | 20 | 0 | R | 64.0 | 0.3 | 2 | 0:00.91 | hello_worl | 99\% |



libmpdata ++ : generalised transport equation

$$
\partial_{t}(G \psi)+\nabla \cdot(G \vec{u} \psi)=G R
$$

libmpdata ++ : generalised transport equation

## $\partial_{t}(G \psi)+\nabla \cdot(G \vec{\psi} \psi)=G R$


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libmpdata++: immersed b.m. (Maciej Waruszewski)

Velocity magnitude [m/s]

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## libmpdata++: 3D (I)LES (Dziekan et al. 2019)

| Article | Assets |
| :--- | :--- |

University of Warsaw Lagrangian Cloud Model (UWLCM) 1.0: a modern large-eddy simulation tool for warm cloud modeling with Lagrangian microphysics

Piotr Dziekan, Maciej Waruszewski, and Hanna Pawlowska
Institute of Geophysics, Faculty of Physics, University of Warsaw, Warsaw, Poland
Correspondence: Piotr Dziekan (pdziekan@fuw.edu.p)

Received: 07 Nov 2018 - Discussion started: 04 Feb 2019 - Revised: 03 Jun 2019 - Accepted: 07 Jun 2019 - Published: 01 Jul 2019

https://www. youtube.com/watch?v=BEidkhpw-MA
libmpdata++: summary \& some technicalities
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automated testsuite, continuous integration (Travis) reusable - API documented in the paper; out-of-tree setups comprehensive set of MPDATA opts (incl. FCT, infinite-gauge, . . )
1D, 2D \& 3D integration; optional coordinate transformation four types of solvers:
implemented using Blitz++ (no loops, expression templates)
built-in HDF5/XDMF output
parallelisation: threads + MPI
separation of concerns (numerics / boundary cond. / io / concurrency) compact $\mathrm{C}++11$ code $(\mathrm{O}(10) \mathrm{kLOC})$

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> (homogeneous advection)
> :" adv+rhs ( + right-hand-side terms)
> \% adv+rhs+vip (+ prognosed velocity)
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libmpdata ++ : documented applications


## libmpdata++: documented applications

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* Arabas \& Farhat 2019:

Derivative pricing as a transport problem

## MPDATA meets Black-Scholes

with Ahmad Farhat (HSBC)

## Black-Scholes equation and pricing formulæ

## Black-Scholes equation and pricing formulæ

- asset price SDE:
$d S=S(\mu d t+\sigma d w)$


## Black-Scholes equation and pricing formulæ

- asset price SDE:
" derivative price:
$d S=S(\mu d t+\sigma d w)$
$f(S, t)$


## Black-Scholes equation and pricing formulæ

- asset price SDE:
" derivative price:
" riskless portfolio (asset + option):
$d S=S(\mu d t+\sigma d w)$
$f(S, t)$
$\Pi=-f+\Delta_{t} S$


## Black-Scholes equation and pricing formulæ

- asset price SDE:
" derivative price:
" riskless portfolio (asset + option):
"- no arbitrage (riskless interest rate):
$d S=S(\mu d t+\sigma d w)$
$f(S, t)$

$$
\begin{array}{r}
\Pi=-f+\Delta_{t} S \\
d \Pi=\Pi r d t
\end{array}
$$

## Black-Scholes equation and pricing formulæ

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$$
\begin{array}{r}
\Pi=-f+\Delta_{t} S \\
d \Pi=\Pi r d t \\
\mathrm{SDE} \rightsquigarrow \mathrm{PDE}
\end{array}
$$

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$$

$$
\frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0
$$

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$\Pi=-f+\Delta_{t} S$
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SDE $\rightsquigarrow \mathrm{PDE}$

$$
\frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0
$$

". terminal value prob., analytic solutions for vanilla options

## Black-Scholes equation and pricing formulæ

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d \Pi=\Pi r d t \\
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$$

$$
\frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0
$$

". terminal value prob., analytic solutions for vanilla options


$?$

Black-Scholes $\rightsquigarrow$ ("advection-only") transport problem

$$
\frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0
$$

Black-Scholes $\rightsquigarrow$ ("advection-only") transport problem

$$
\begin{aligned}
& \frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0 \\
& \stackrel{ \pm=\ln S}{\frac{\partial f}{\partial t}+\underbrace{\left(r-\sigma^{2} / 2\right)}_{u} \frac{\partial f}{\partial x}+\underbrace{\sigma^{2} / 2}_{-\nu} \frac{\partial^{2} f}{\partial x^{2}}-r f=0}
\end{aligned}
$$

Black-Scholes $\rightsquigarrow$ ("advection-only") transport problem

$$
\begin{aligned}
& \frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0 \\
& \stackrel{t=\ln S}{\frac{\partial f}{\partial t}}+\underbrace{\left(r-\sigma^{2} / 2\right)}_{u} \frac{\partial f}{\partial x}+\underbrace{\sigma^{2} / 2}_{-\nu} \frac{\partial^{2} f}{\partial x^{2}}-r f=0 \\
& \underbrace{\psi=e r t f} \frac{\partial \psi}{\partial t}+u \frac{\partial \psi}{\partial x}-\nu \frac{\partial^{2} \psi}{\partial x^{2}}=0
\end{aligned}
$$

Black-Scholes $\rightsquigarrow$ ("advection-only") transport problem

$$
\begin{aligned}
& \frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0 \\
& \xrightarrow{x=\ln s} \frac{\partial f}{\partial t}+\underbrace{\left(r-\sigma^{2} / 2\right)}_{u} \frac{\partial f}{\partial x}+\underbrace{\sigma^{2} / 2}_{-\nu} \frac{\partial^{2} f}{\partial x^{2}}-r f=0 \\
& \xrightarrow{\psi=e^{-\pi_{f}}} \frac{\partial \psi}{\partial t}+u \frac{\partial \psi}{\partial x}-\nu \frac{\partial^{2} \psi}{\partial x^{2}}=0 \\
& \longrightarrow \frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}\left[\left(u-\frac{\nu}{\psi} \frac{\partial \psi}{\partial x}\right) \psi\right]=0
\end{aligned}
$$

$\frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0$

$$
\xrightarrow{x=\ln s} \frac{\partial f}{\partial t}+\underbrace{\left(r-\sigma^{2} / 2\right)}_{u} \frac{\partial f}{\partial x}+\underbrace{\sigma^{2} / 2}_{-\nu} \frac{\partial^{2} f}{\partial x^{2}}-r f=0
$$

$$
\xrightarrow{\psi=e^{-r_{f}}} \frac{\partial \psi}{\partial t}+u \frac{\partial \psi}{\partial x}-\nu \frac{\partial^{2} \psi}{\partial x^{2}}=0
$$


re last step: Smolarkiewicz and Clark (1986, JCP), Sousa (2009, IJNMF), Smolarkiewicz and Szmelter (2005, JCP), Cristiani (2015, JCSMD)

## same trick!

## MPDATA in a nutshell (Smolarkiewicz 1983, 1984, ...)

Black-Scholes $\rightsquigarrow$ ("advection-only") transport problem
transport PDE: $\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)=0 \quad \frac{\partial f}{\partial t}+r S \frac{\partial f}{\partial S}+\frac{\sigma^{2}}{2} S^{2} \frac{\partial^{2} f}{\partial S^{2}}-r f=0$

$$
\begin{gathered}
\psi_{i}^{n+1}=\psi_{i}^{n}-\left[F\left(\psi_{i}^{n}, \psi_{i+1}^{n}, \mathcal{C}_{i+1 / 2}\right)-F\left(\psi_{i-1}^{n}, \psi_{i}^{n}, \mathcal{C}_{i-1 / 2}\right)\right] \\
F\left(\psi_{L}, \psi_{R} \mathcal{C}\right)=\underset{\operatorname{Cox}(\mathcal{C}, 0) \cdot \psi_{L}+\min (\mathcal{C}, 0) \cdot \psi_{R}}{\mathcal{C}=v \Delta t / \Delta x} \quad \stackrel{\text { upwind }}{ } \quad \stackrel{x}{ } \quad \stackrel{\ln s}{ } \frac{\partial f}{\partial t}+\underbrace{\left(r-\sigma^{2} / 2\right)}_{u} \frac{\partial f}{\partial x}+\underbrace{\sigma^{2} / 2}_{-\nu} \frac{\partial^{2} f}{\partial x^{2}}-r f=0
\end{gathered}
$$

modified eq.: $\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)+\underbrace{K \frac{\partial^{2} \psi}{\partial x^{2}}}+\ldots=0$ MEA $\quad \underbrace{\psi=e^{r r}} \frac{\partial \psi}{\partial t}+u \frac{\partial \psi}{\partial x}-\nu \frac{\partial^{2} \psi}{\partial x^{2}}=0$
numerical diffusion
$\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}(v \psi)+\frac{\partial}{\partial x} \underbrace{\left[\left(-\frac{K \partial \psi}{\psi \partial x}\right) \psi\right]}_{\text {antidiffusive flux }}=0$

$$
>\frac{\partial \psi}{\partial t}+\frac{\partial}{\partial x}\left[\left(u-\frac{\nu}{\psi} \frac{\partial \psi}{\partial x}\right) \psi\right]=0
$$

## MPDATA meets Black-Scholes: test case

" terminal value problem
= payoff function: corridor
truncation error est. ( $\psi_{a}$ : B-S formula):
$E=\sqrt{\sum_{i=1}^{n_{x}}\left[\psi_{n}\left(x_{i}\right)-\psi_{a}\left(x_{i}\right)\right]^{2} /\left.\left(n_{x} \cdot n_{t}\right)\right|_{t=0}}$


## MPDATA meets Black-Scholes: convergence analysis




MPDATA variant: 2 iterations

+ infinite gauge + FCT + divergent flow + third-order terms


## MPDATA meets Black-Scholes: convergence analysis




MPDATA variant: 2 iterations

## doi:10.1016/j.cam.2019.05.023

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Journal of Computational and Applied Mathematics Available online 20 June 2019, 112275

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In Press, Corrected Proof??
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Derivative pricing as a transport problem: MPDATA solutions to Black-Scholes-type equations $\ddagger$

Sylwester Arabas ${ }^{\text {a }} \stackrel{\circ}{ }$, Ahmad Farhat ${ }^{\text {b }}$
a Jagiellonian University, Kraków, Poland
b HSBC Service Delivery (Polska) Sp. z o.o., Kraków, Poland

## MPDATA \& diffusional growth

 with Michael Olesik (Jagiellonian) and Simon Unterstraßer (DLR)
## what triggered the study

## Morrison et al. 2018 (JAS)



FiG. 7. Dropsize distributions at various heightsz from the Lagrangina microphysical benchmart (black) and the bin model simulations (colored lines) for the parcel test with a bulk drop number mixing ratio of $50 \mathrm{mg}^{-1}$. Different colored lines illustrate results using different bin mass grid configurations and growth methods, as listed in Table 1 .
"... MPDG growth produces significant numerical diffusion and DSD broadening relative to the Lagrangian benchmark and all of the TH-MOM configurations"

## more on MPDATA for condensational growth

## Smolarkiewicz 1984 (sec. 5.1 "Divergent Flow Field")

"On the other hand when the velocity is strongly convergent, application of Eq. (38) to the problem of the evolution of the droplet size distribution due to the evaporation-condensation process improves the results (William Hall, personal communication)"

## Tsang \& Korgaonkar 1987

"novel numerical scheme is devised for the solution of evaporation of aerosol clouds. This scheme combines the salient features of the Galerkin Finite Element Method and the positive definite method of Smolarkiewicz"

## more on MPDATA for condensational growth

## Tsang and Rao 1988

"Smolarkiewicz method provides a much narrower size distribution than upwind differencing and the sectional method, its prediction of mass concentration is worse than upwind differencing and the sectional method"

## Williams \& Loyalka 1991

"Smolarkiewicz studied the problem of advection in fluid flows but his method applies directly to the problem of aerosol growth"

Kostoglou and Karabelas 1995
"A finite difference type of technique proposed by Smolarkiewicz (1983) for fluid flows is not compared with other methods here, even though it appears to reduce errors in size computations"
T. W. R. EAST


Figure 3. Modification of water-content distribution by condensation. The distribution at $M=1$ is assumed to be the same as in fair-weather cloud : the other curves show the distribution after water is condensed on to it rapidly. All are normalised to have equal area : the peak water content $w(r)_{\text {max }}$ actually increased 26 times from $M=1$ to $10 \mathrm{~g} / \mathrm{kg}$.

## test case: setup \& analytic solution

initial spectrum (East \& Marshall 1954)
$n_{0}(r)=$ lognormal $(r) / r$

## test case: setup \& analytic solution

## initial spectrum (East \& Marshall 1954)

$$
n_{0}(r)=\text { lognormal }(r) / r
$$

drop growth (i.e., velocity field)

$$
d r / d t=\xi(S-1) / r \quad \rightsquigarrow \text { divergent }
$$

## test case: setup \& analytic solution

## initial spectrum (East \& Marshall 1954)

$n_{0}(r)=$ lognormal $(r) / r$
drop growth (i.e., velocity field)
$d r / d t=\xi(S-1) / r \quad \rightsquigarrow$ divergent
analytic solution (Rogers \& Yau)

$$
\begin{aligned}
& r^{\prime}(r, t)=\sqrt{r^{2}-2 \xi(S-1) t} \\
& n(r, t)=n_{0}\left(r^{\prime}\right) \cdot r / r^{\prime}
\end{aligned}
$$

## test case: setup \& analytic solution

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$n_{0}(r)=$ lognormal $(r) / r$
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## analytic solution (Rogers \& Yau)

$r^{\prime}(r, t)=\sqrt{r^{2}-2 \xi(S-1) t}$
$n(r, t)=n_{0}\left(r^{\prime}\right) \cdot r / r^{\prime}$

## integration parameters

$\Delta t=0.5 s$
$r \in(1 . .25) \mu m$
$n x=64$ (linear, log-linear or $r^{2}$-linear)
$n t$ : two-, four- \& tenfold increase in water content
test case: results with linear grid
x_id


test case: results with log-linear grid
$x$ _In



## test case: results with $r^{2}$-linear grid <br> x_p2



". basic (+iterations): Smolarkiewicz 1983
". basic (+iterations): Smolarkiewicz 1983
" coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
"- basic (+iterations): Smolarkiewicz 1983
\#- coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
." divergent flow corrections: Smolarkiewicz 1984
:- basic (+iterations): Smolarkiewicz 1983
." coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
." divergent flow corrections: Smolarkiewicz 1984
" infinite-gauge variant: Smolarkiewicz 2006
:- basic (+iterations): Smolarkiewicz 1983
\% coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
.". divergent flow corrections: Smolarkiewicz 1984
" infinite-gauge variant: Smolarkiewicz 2006
:" flux-corrected transport: Smolarkiewicz and Grabowski 1990
:- basic (+iterations): Smolarkiewicz 1983
\%/ coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
." divergent flow corrections: Smolarkiewicz 1984
" infinite-gauge variant: Smolarkiewicz 2006
". flux-corrected transport: Smolarkiewicz and Grabowski 1990
. third-order terms: Smolarkiewicz and Margolin 1998
:- basic (+iterations): Smolarkiewicz 1983
". coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
." divergent flow corrections: Smolarkiewicz 1984
" infinite-gauge variant: Smolarkiewicz 2006
:" flux-corrected transport: Smolarkiewicz and Grabowski 1990
: third-order terms: Smolarkiewicz and Margolin 1998

- $\quad$...
"- basic (+iterations): Smolarkiewicz 1983
." coordinate transformation: Smolarkiewicz and Clark 1986, Smolarkiewicz and Margolin 1993
." divergent flow corrections: Smolarkiewicz 1984
" infinite-gauge variant: Smolarkiewicz 2006
:- flux-corrected transport: Smolarkiewicz and Grabowski 1990
. $=$ third-order terms: Smolarkiewicz and Margolin 1998
:" fully third-order variant: Waruszewski et al. 2018


## demo

## detour: new 2019 GMD journal policy

doi:10.5194/gmd-12-2215-2019

## detour: new 2019 GMD journal policy

## doi:10.5194/gmd-12-2215-2019

,,everything required to run the experiment must be provided, apart from the model itself"

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,,everything required to run the experiment must be provided, apart from the model itself"
,,ensure that there is no manual processing of the data: models are run by a script, and all pre- and post-processing is scripted"

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„All figures and tables must be scientifically reproducible from the scripts"
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„All figures and tables must be scientifically reproducible from the scripts"
„It is the opinion of the GMD editors that if the code is not ready, then neither is the manuscript"
„During the review process, the ease of model download, compilation, and running of test cases may be assessed"

## github.com/atmos-cloud-sim-uj



## Atmospheric Cloud Simulation Group @ Jagiellonian University



## github.com/atmos-cloud-sim-uj/MPyDATA

## MPyDATA

code quality B build passing coverage $19 \%$

Examples:

- Smolarkiewicz 2006 Figs $3,4,10,11,12$ :
- East 1957 Fig 3: 8 launch binder render nbviewer


## 8 binder



Starting repository: atmos-cloud-sim-uj/MPyDATA.git/master You can learn more about building your own Binder repositories in the Binder community documentation.

## mybinder.org/...

こ. Jupyter East_1957_Fig3 (autosaved)


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" Foundation for Polish Science (fnp.org.pl)


## Thank you for your attention!

