# Particle-based cloud microphysics: rationale, state of the art and challenges

### Sylwester Arabas

Jagiellonian University

#### Jagiellonian University, Kraków, Poland



- founded in 1364 (3 years older!)
- ca. 40 000 students, 7000 staff (4000 acad.), 16 faculties
- billateral agreement with U. Pécs signed in 2004

# rationale

#### rationale: aerosol-cloud interactions



"Cloud and ship. Ukraine, Crimea, Black sea, view from Ai-Petri mountain" (photo: Yevgen Timashov / National Geographic)













#### Lagrangian:

#### parcel model

→ moving-sectional/bin schemes (40-ties onwards: Howell, Mordy, ...)



#### Lagrangian:

parcel model

 $\rightsquigarrow$  moving-sectional/bin schemes (40-ties onwards: Howell, Mordy, ...)

LES + Lagrangian-in-space + coalescence

 $\rightarrow$  particle-based/super-droplet  $\mu$ -physics (00-ties onwards: Shima, ...)



#### Pioneering warm-rain aerosol-cloud-interaction models:

Andrejczuk et al. 2010		Lebo & Seinfeld 2011		Shima et al. 2009
condensation:	Lagrangian	condensation:	Eulerian	condensation: Lagrangian
collisions:	Eulerian	collisions:	Eulerian	collisions: Lagrangian

Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)





Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

carrier attributes:

Iocation



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

- Iocation
- wet radius



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

- Iocation
- wet radius
- dry radius



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

- Iocation
- wet radius
- dry radius
- multiplicity



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

- Iocation
- wet radius
- dry radius
- multiplicity
- ð. . .



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

carrier attributes:

- Iocation
- wet radius
- dry radius
- multiplicity
- ð. . . .

advantages over Eulerian approach: no "categorisation"



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

carrier attributes:

- Iocation
- wet radius
- dry radius
- multiplicity
- ð.,

advantages over Eulerian approach: no "categorisation"; adding attributes does not increase dimensionality



Domain randomly populated with " $\mu$ -physics information carriers" (super particles / super droplets)

carrier attributes:

- Iocation
- wet radius
- dry radius
- multiplicity
- λ.

advantages over Eulerian approach: no "categorisation"; adding attributes does not increase dimensionality (ice, chemistry, charge, isotopic composition, ...)

Eulerian / PDE	Lagrangian / ODE

Eulerian / PDE	Lagrangian / ODE
advection of heat	particle transport by the flow
advection of moisture	

Eulerian / PDE	Lagrangian / ODE	
advection of heat	particle transport by the flow	
advection of moisture	condensational growth	
	collisional growth	
	sedimentation	

Eulerian / PDE	Lagrangian / ODE
advection of heat	particle transport by the flow
advection of moisture	condensational growth
	collisional growth
	sedimentation
$\partial_t(\rho_d r) + \nabla \cdot (\vec{v}\rho_d r) = \rho_d \dot{r}$	$\dot{r} = \sum_{i=1}^{n} \sum_{j=1}^{n} \dots$
$\partial(a, 0) + \nabla(\vec{a}, a, 0) = \dot{a}$	particles $\in \Delta V$
$O_t(\rho_d \theta) + \nabla \cdot (\nabla \rho_d \theta) \equiv \rho_d \theta$	$\theta = \sum_{\text{particles} \in \Delta V}$

Eulerian / PDE	Lagrangian / ODE
advection of heat	particle transport by the flow
advection of moisture	condensational growth
	collisional growth
	sedimentation
$\partial_t(\rho_d r) + \nabla \cdot (\vec{v}\rho_d r) = \rho_d \dot{r}$ $\partial_t(\rho_d \theta) + \nabla \cdot (\vec{v}\rho_d \theta) = \rho_d \dot{\theta}$	$\dot{r} = \sum_{\substack{\text{particles} \in \Delta V \\ \dot{ heta} = \sum_{\substack{\text{particles} \in \Delta V \\ \text{particles} \in \Delta V}} \dots$
advection of trace gases	in-particle aqueous chemistry

Eulerian / PDE	Lagrangian / ODE
advection of heat	particle transport by the flow
advection of moisture	condensational growth
	collisional growth
	sedimentation
$\partial_t(\rho_d r) + \nabla \cdot (\vec{v}\rho_d r) = \rho_d \dot{r}$ $\partial_t(\rho_d \theta) + \nabla \cdot (\vec{v}\rho_d \theta) = \rho_d \dot{\theta}$	$\dot{r} = \sum_{\substack{\text{particles} \in \Delta V \\ \dot{ heta} = \sum_{\substack{\text{particles} \in \Delta V \\ \text{particles} \in \Delta V}} \dots$
advection of trace gases	in-particle aqueous chemistry
challenges:	

- scalability (cost vs. number of particles),
- super-particles "conservation" (coalescence!)

### example simulation (2D, prescribed flow)

Geosci. Model Dev., 8, 1677-1707, 2015 https://doi.org/10.5194/gmd-8-1677-2015 © Author(s) 2015. This work is distributed under the Creative Commons Attribution 3.0 License.



Model description paper | 09 Jun 2015

#### libcloudph++ 1.0: a single-moment bulk, double-moment bulk, and particle-based warm-rain microphysics library in C++

S. Arabas<sup>1</sup>, A. Jaruga<sup>1</sup>, H. Pawlowska<sup>1</sup>, and W. W. Grabowski<sup>2</sup> <sup>1</sup>Institute of Geophysics, Faculty of Physics, University of Warsaw, Warsaw, Poland <sup>2</sup>National Center for Atmospheric Research (NCAR).

Boulder, CO, USA

### example simulation (2D, prescribed flow)

Geosci. Model Dev., 8, 1677-1707, 2015 https://doi.org/10.5194/gmd-8-1677-2015 © Author(s) 2015. This work is distributed under the Creative Commons Attribution 3.0 License.



Model description paper | 09 Jun 2015

#### libcloudph++ 1.0: a single-moment bulk, double-moment bulk, and particle-based warm-rain microphysics library in C++

S. Arabas<sup>1</sup>, A. Jaruga<sup>1</sup>, H. Pawlowska<sup>1</sup>, and W. W. Grabowski<sup>2</sup>

<sup>1</sup>Institute of Geophysics, Faculty of Physics, University of Warsaw, Warsaw, Poland

<sup>2</sup>National Center for Atmospheric Research (NCAR),

Boulder, CO, USA



00

0.3

0.

00

°. °.







0.0 27 28 7

x [km]

0.01

























x [km]





0.0

8

00

o: o:

80 V

x [km]



x [km]

rain drop spec. conc. [mg<sup>-1</sup>]



Particle-based cloud microphysics: rationale, state of the art and challenges

3

0.

0.0







0.0 27 28 7

x [km]

00

0.01








x [km]



00

°. °.







0.0 27 28 7

x [km]



0.0







00

x [km]

2

00

6



0.

0.0







00

x [km]

2

00

0.01

6



0.3

0.

00

°. °.







0.0 27 28 7

x [km]

0.01











90

°.

0.

00

00 00







00 27 6

x [km]

0.1

0.01



0.

00

°. °.







00

x [km]

2

0.01

6



°.

0.

00

°. °.







0.0 27 28 7

x [km]

0.01



00

°. °.







0.0 27 28 7

x [km]



z [km] 0.9

90

°.

0.

00

°. °.







00

x [km]

2

0.1

0.01

6































































#### particle size spectra





INC/LCM from LANL/Leeds,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,
- UCLA-LES (http://github.com/uclales) from UCLA/MPI-M,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,
- UCLA-LES (http://github.com/uclales) from UCLA/MPI-M,
- Pencil-Code (http://pencil-code.nordita.org) from Nordita/UC,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,
- UCLA-LES (http://github.com/uclales) from UCLA/MPI-M,
- Pencil-Code (http://pencil-code.nordita.org) from Nordita/UC,
- SCALE (http://scale.aics.riken.jp/) from RIKEN,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,
- UCLA-LES (http://github.com/uclales) from UCLA/MPI-M,
- Pencil-Code (http://pencil-code.nordita.org) from Nordita/UC,
- SCALE (http://scale.aics.riken.jp/) from RIKEN,
- ICON/McSnow (http://gitlab.com/sbrdar/mcsnow) from DWD,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,
- UCLA-LES (http://github.com/uclales) from UCLA/MPI-M,
- Pencil-Code (http://pencil-code.nordita.org) from Nordita/UC,
- SCALE (http://scale.aics.riken.jp/) from RIKEN,
- ICON/McSnow (http://gitlab.com/sbrdar/mcsnow) from DWD,
- ASAM (http://asam.tropos.de/) from TROPOS,

- INC/LCM from LANL/Leeds,
- EULAG-LCM (http://www.mmm.ucar.edu/eulag/) from NCAR/DLR,
- PALM-LES (http://palm.muk.uni-hannover.de/) from Univ. Hannover,
- CReSS (http://www.rain.hyarc.nagoya-u.ac.jp/) from Univ. Nagoya,
- UCLA-LES (http://github.com/uclales) from UCLA/MPI-M,
- Pencil-Code (http://pencil-code.nordita.org) from Nordita/UC,
- SCALE (http://scale.aics.riken.jp/) from RIKEN,
- ICON/McSnow (http://gitlab.com/sbrdar/mcsnow) from DWD,
- ASAM (http://asam.tropos.de/) from TROPOS,
- UWLCM (http://github.com/igfuw/UWLCM) from Univ. Warsaw.

### CReSS

#### highlights

- particle-based microphysics vs. praticle-based measurements
- new particle formation studies

#### highlights

- particle-based microphysics vs. praticle-based measurements
- new particle formation studies

#### references

- Arabas & Shima 2013 (JAS): "Large Eddy Simulations of Trade-Wind Cumuli using Particle-Based Microphysics with Monte-Carlo Coalescence"
- Shima, Hasegawa & Kusano 2015 (EGU Vienna): "Preliminary numerical study on the cumulus-stratus transition induced by the increase of formation rate of aerosols"

### CReSS - RICO 24h LES of cumulus cloud field



### UWLCM

#### highlights

- Hoppel-gap resolving aqueous chemistry
- GPU-resident microphysics in C++

### UWLCM

#### highlights

- Hoppel-gap resolving aqueous chemistry
- GPU-resident microphysics in C++

#### references

- Arabas, Jaruga, Pawlowska & Grabowski 2015 (GMD): "libcloudph++ 1.0: single-moment bulk, double-moment bulk, and particle-based warm-rain microphysics..."
- Jaruga & Pawlowska 2018 (GMD): "libcloudph++ 1.1: aqueous phase chemistry extension of the Lagrangian cloud microphysics scheme"
- Dziekan & Pawlowska 2017 (ACP): "Stochastic coalescence in Lagrangian cloud microphysics"
- Grabowski & Abade 2017 (JAS): "Broadening of cloud droplet spectra through eddy hopping: Turbulent adiabatic parcel simulations"
- Grabowski, Dziekan & Pawlowska 2018 (GMD): "Lagrangian condensation microphysics with Twomey CCN activation"
- Dziekan, Waruszewski & Pawlowska 2019 (GMD): "University of Warsaw Lagrangian Cloud Model (UWLCM)..."

### UWLCM - DYCOMS example



https://www.youtube.com/watch?v=BEidkhpw-MA

### UWLCM: Hoppel-gap resolving particle-based $\mu$ -physics

#### Jaruga and Pawlowska 2018 (doi: 10.5194/gmd-11-3623-2018)



Figure 6. The size distributions of dry radii for the base case (a) and case3 (b). The initial dry radius size distribution is marked in black, the final dry radius size distribution from grid cells with  $r_c > 0.01 \text{ g kg}^{-1}$  in green, and from grid cells with  $r_r > 0.01 \text{ g kg}^{-1}$  in red. See Tables 2 and 3 for a definition of simulation set-ups.
# challenges (~~ opportunities)

Particle-based cloud microphysics: rationale, state of the art and challenges

**no numerical diffusion** in radius space (also for coalesc. if Monte-Carlo)

- **no numerical diffusion** in radius space (also for coalesc. if Monte-Carlo)
- **by-design non-negativity** of the derived density/concentration fields

- **no numerical diffusion** in radius space (also for coalesc. if Monte-Carlo)
- **by-design non-negativity** of the derived density/concentration fields
- **ab-initio** (washout+autoconversion+accretion+riming+... as one process)

- **no numerical diffusion** in radius space (also for coalesc. if Monte-Carlo)
- **by-design non-negativity** of the derived density/concentration fields
- **ab-initio** (washout+autoconversion+accretion+riming+... as one process)
- **favourable scaling** (particle attributes vs. Eulerian *curse of dimensionality*)

- **no numerical diffusion** in radius space (also for coalesc. if Monte-Carlo)
- **by-design non-negativity** of the derived density/concentration fields
- **ab-initio** (washout+autoconversion+accretion+riming+... as one process)
- **favourable scaling** (particle attributes vs. Eulerian *curse of dimensionality*)
- lifetime tracing of aerosol particles (coalescence: props:yes; identity:no)

- **no numerical diffusion** in radius space (also for coalesc. if Monte-Carlo)
- **by-design non-negativity** of the derived density/concentration fields
- **ab-initio** (washout+autoconversion+accretion+riming+... as one process)
- **favourable scaling** (particle attributes vs. Eulerian *curse of dimensionality*)
- lifetime tracing of aerosol particles (coalescence: props:yes; identity:no)
- **hybrid supercomputing** adaptable (GPU-resident particles)

aerosol budget (precipication/scavenging sinks vs. long-term LES)

- aerosol budget (precipication/scavenging sinks vs. long-term LES)
- ensemble analysis (multiple realisations, probabilistic "thinking")

- aerosol budget (precipication/scavenging sinks vs. long-term LES)
- ensemble analysis (multiple realisations, probabilistic "thinking")
- **(de)activation nonlinearities**  $\rightsquigarrow$  numerical/resolution challenges

- aerosol budget (precipication/scavenging sinks vs. long-term LES)
- ensemble analysis (multiple realisations, probabilistic "thinking")
- **(de)activation nonlinearities**  $\rightsquigarrow$  numerical/resolution challenges
- Eulerian/Lagrangian dynamics consistency (resolved and subgrid)

- aerosol budget (precipication/scavenging sinks vs. long-term LES)
- ensemble analysis (multiple realisations, probabilistic "thinking")
- **(de)activation nonlinearities**  $\rightsquigarrow$  numerical/resolution challenges
- Eulerian/Lagrangian dynamics consistency (resolved and subgrid)
- **radiative transfer** ~> visualisations & radiative cooling

- aerosol budget (precipication/scavenging sinks vs. long-term LES)
- ensemble analysis (multiple realisations, probabilistic "thinking")
- **(de)activation nonlinearities**  $\rightsquigarrow$  numerical/resolution challenges
- Eulerian/Lagrangian dynamics consistency (resolved and subgrid)
- **radiative transfer**  $\rightsquigarrow$  visualisations & radiative cooling
- commensurable comparisons wrt bin/bulk: "aerosol water", cannot "switch off" aerosol processing, ripening, etc (ab-initio)

- aerosol budget (precipication/scavenging sinks vs. long-term LES)
- ensemble analysis (multiple realisations, probabilistic "thinking")
- **(de)activation nonlinearities**  $\rightsquigarrow$  numerical/resolution challenges
- Eulerian/Lagrangian dynamics consistency (resolved and subgrid)
- **radiative transfer**  $\rightsquigarrow$  visualisations & radiative cooling
- commensurable comparisons wrt bin/bulk: "aerosol water", cannot "switch off" aerosol processing, ripening, etc (ab-initio)
- harge, isotopic ratio, ...

news: BAMS super-droplet review (Grabowski et al. '19)

## MODELING OF CLOUD MICROPHYSICS Can We Do Better?

Wojciech W. Grabowski, Hugh Morrison, Shin-Ichiro Shima, Gustavo C. Abade, Piotr Dziekan, and Hanna Pawlowska

The Lagrangian particle-based approach is an emerging technique to model cloud microphysics and its coupling with dynamics, offering significant advantages over Eulerian approaches typically used in cloud models.

#### doi: 10.1175/BAMS-D-18-0005.1

Particle-based cloud microphysics: rationale, state of the art and challenges

#### news: postdoc offer @ University of Warsaw (UWLCM)



Dear colleagues,

The cloud-modeling group at the Institute of Geophysics, Faculty of Physics, University of Warsaw, invites applications for a full-time postdoctoral position. The post holder is expected to join our team for 24 months. The successful candidate will work on the project entitled "Turbulent dynamics and microphysics in a Stochastic Lagrangian Cloud Model" funded by the Polish National Science Centre. The project investigates by numerical simulations the role of turbulence in the microphysical processes that shape the droplet spectrum in convective clouds. The candidate should be ready to start not later than January 2020.

Applications are due on 30 September 2019.

For further details visit:

https://www.igf.fuw.edu.pl/en/articles/oferty-pracy-i-stypendia-f/oferta-pracy-post-doc-w-insty-q2019-08-06/

#### Köszönöm!

#### Thank you for your attention!

### funding acknowledgement: Foundation for Polish Science / European Union

Particle-based cloud microphysics: rationale, state of the art and challenges