

# Improving AROME NWP Polarimetric Radar Simulations: Selection of Optimal Microphysics and Enhancement of the Radar Forward Operator

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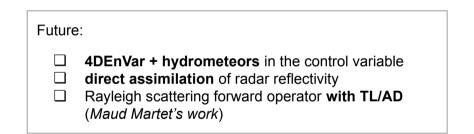




## **Motivation**

- Accurate initialization of NWP models via data assimilation → crucial for reliable forecasts.
- Radar observations = key contributors in km-scale NWP data assimilation systems
- AROME-France assimilation system:

# Current: 3DEnVar (Brousseau et al., 2025), preprint https://doi.org/10.5194/egusphere-2025-2642 reflectivity assimilated via Bayesian humidity retrievals (Caumont et al 2010, Wattrelot et al 2014)



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- Polarimetric radar observations:
  - Preliminary Zdr and Kdp data assimilation studies with AROME (*Augros et al., 2018, Thomas, et al. 2020*)
  - But: not yet operationally assimilated in AROME-France
  - Require more accurate simulation of polarimetric variables via:
    - reliable polarimetric radar forward operators (PRFO)
    - accurate microphysics scheme in the NWP model

## **Objectives**

#### 1. Evaluate polarimetric radar simulations using AROME:

- > with ICE3 (1-moment) & LIMA (2-partial moment) microphysics schemes
- > using existing polarimetric radar PRFO (Augros et al, 2016)
- focus on severe convective cases

#### 2. Implement & evaluate new options in:

- > the polarimetric radar forward operator
- > the microphysics schemes

### **Data overview**

#### Case selection

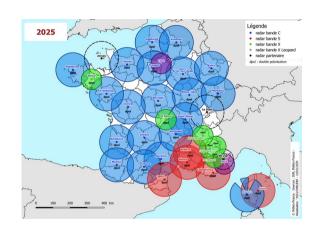
- 34 convective days in France (2022)
- selected for hail >= 2 cm occurrence via **ESWD** database (*Dotzek et al., 2009*)

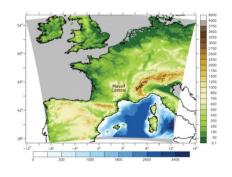
#### Radar observations (ARAMIS network – Météo-France)

- 33 Doppler dual-pol radars S, C, X => in this study: use of C and S bands only
- Variables used: ZH, ZDR, KDP
- Quality-processed from operationnal polarimetric processing chain (*Figueras et al.* 2012)
- Interpolated to 3D Cartesian grid (1 km horizontal, 0.5 km vertical) using Py-ART (Helmus and Collis, 2016)

#### 6 AROME-France NWP model

- 1.3 km resolution, 90 vertical levels, re-forecasts with 5-min outputs (Seity et al 2011, Brousseau et al 2016)
- Two microphysics schemes:
  - > ICE3 (*Pinty and Jabouille, 1998*): operational, **1-moment** for cloud droplets, rain, snow, graupel, ice crystals):
  - LIMA (Vié et al. 2016): research, partial 2-moment for cloud droplets, rain, ice crystals





### **Data overview**

- Radar forward operator: Augros et al. (2016), enhanced by Le Bastard (2019)
  - T-matrix scattering: hydrometeors as oblate spheroids (*Mishenko and Travis, 1994*)
  - Axis ratio:
    - o graupel, wet graupel following *Ryzhkov et al. (2011)*
    - o dry snow: D < 8mm: AR=1-0.025D, D >=8 mm: AR=0.75
    - ice : spheres
  - Oscillation: neglected
  - Particle Size Distributions and mass-diameter laws inherited from ICE3 or LIMA
  - Mixed phase model for wet graupel :
    - o graupel transferred to wet graupel category if coexists with rain
    - wet fraction Fw= Mr / (Mg + Mr)
  - Dielectric function:
    - Debye (rain)
    - Maxwell Garnett (combination of ice, air and water)



https://github.com/UMR-CNRM/operadar

ZH, ZDR and KDP after integration over PSD (ICE3, 1-moment), for  $T=0^{\circ}C$ 

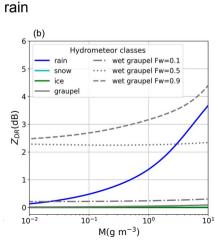
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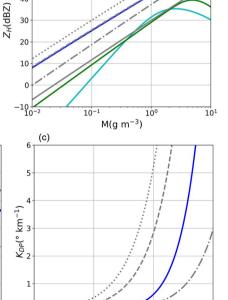
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10°

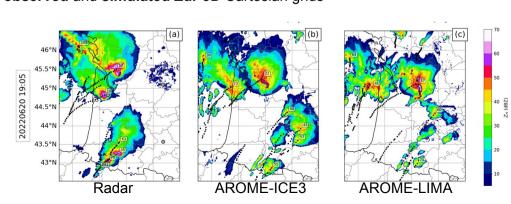
 $M(g m^{-3})$ 

10-2

## Methodology

- **Traditional evaluation**: quantitative precipitation forecast evaluation
- Object-oriented framework:
  - Storm cell detection & tracking: **tobac** Python package (*Sokolowsky et al., 2024*)
  - Cell cores analysed with max Zh = 40 dBZ
- ZDR column detection :
  - o adapted from Snyder et al (2015), Kuster et al (2019)
  - o Zdr threshold : 2dB, Zh threshold: 25 dBZ
  - o vertical continuity is imposed
  - o applied on **observed** and **simulated Zdr** 3D Cartesian grids

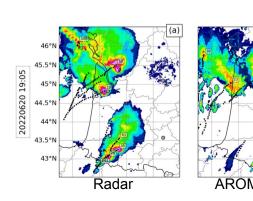
Example of max Zh maps with cell centroid tracks

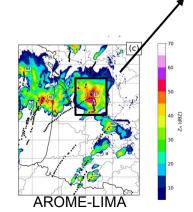


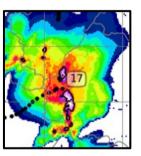
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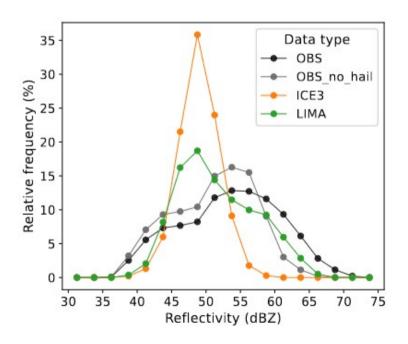






17 = cell identification black contours = Zdr columns

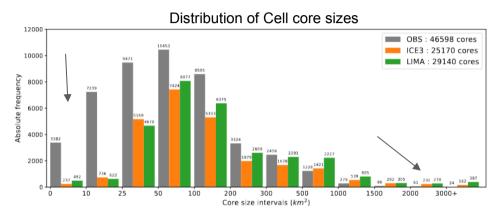
## **Convective Cell Intensity**



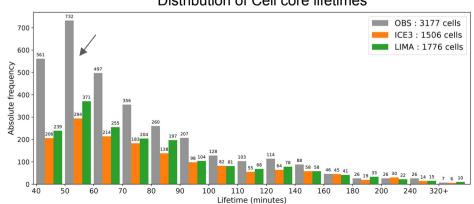
#### Max reflectivity per cell:

- **Observed** peak: ~55 dBZ
- ICE3 & LIMA peaks: ~48.5 dBZ
- LIMA better reproduces the largest reflectivities (>60 dBZ): comparable to largest observed reflectivity values with no radar detected hail
- improved performance in simulating intense cores with LIMA due to **2-moment rain (larger drops)**

## **Convective Cell Size and Duration**



#### Distribution of Cell core lifetimes



#### Number of cells cores (ZH ≥ 40 dBZ):

• Underestimated by both ICE3/LIMA

#### Cells' core sizes:

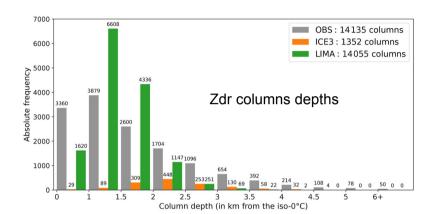
- Underestimation of small cells sizes (< 50 km²)
- Overestimation of very large cells sizes (> 1000 km²)

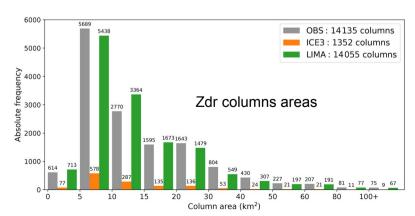
#### Cells' core lifetimes:

AROME with both schemes miss short-lived cells

Partly due to the larger explicit model resolution ( $\sim 9\Delta x$  = 11 km, Ricard et al. 2012) // 1 km for radar grid

## Zdr columns: depth and area distributions





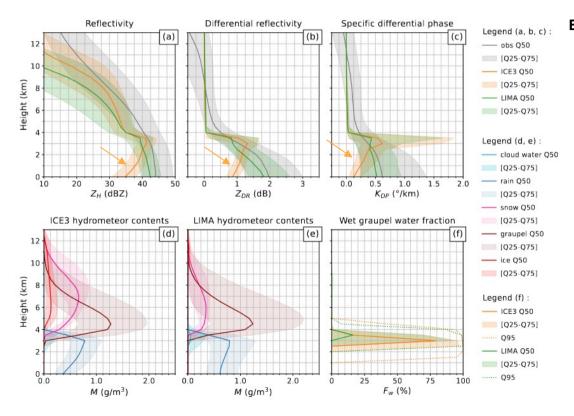
#### LIMA:

- remarkable similar number of simulated Zdr columns compared to observations
- miss the lowest depths (< 1 km) and areas (< 5 km<sup>2</sup>)
- not able to simulate the Zdr columns with depths above
   3.5 km

#### ICE3:

- strong underestimation of the number of Zdr columns
- but is able to simulate depths until 4.5 km
- less Zdr columns in ICE3, but slightly more intense (more rainwater available at negative temperatures within the columns leads to higher graupel wet fraction => higher Zdr)

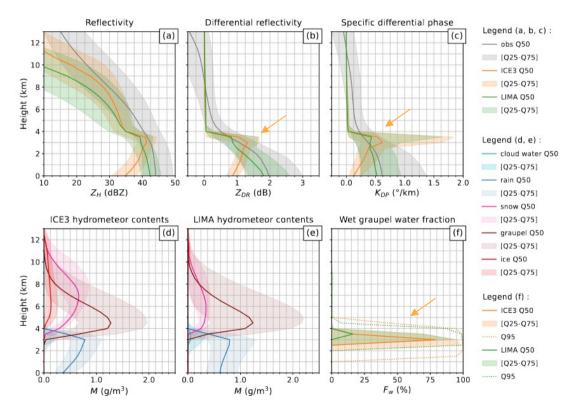
## Vertical Profiles (CFADs): ZH, ZDR, KDP



#### Below melting level (~0-3 km):

- ICE3 strongly underestimates ZDR & KDP (likely over-evaporation)
- LIMA matches observations much better (larger raindrops → better ZDR) thanks to prognostic raindrop concentration → more realistic DSD

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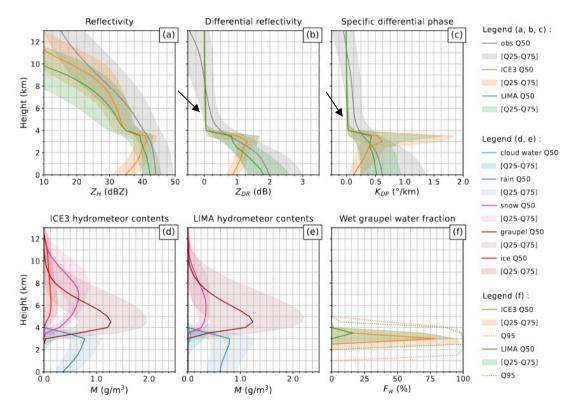
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#### Above melting layer:

- ZDR & KDP quickly drop to zero in both schemes
- Forward operator limitations ?

## **Conclusions & Outlook**

#### ▼ Comprehensive Model Evaluation

Evaluation conducted on convective cases using two microphysics schemes: ICE3 (one-moment) and LIMA (partially two-moment).

✓ AROME QPF Scores (not shown)

No significant difference observed between the two microphysics schemes.

#### LIMA Strengths

Better simulation of Zh, Zdr, and Kdp in convective rain Zdr columns occurrence, width, and lifetime.

#### **X** PRFO Limitations

ZDR and KDP values too weak above the melting layer.

#### David et al. (2025)

Research article | @①

Improved simulation of thunderstorm characteristics and polarimetric signatures with LIMA two-moment microphysics in AROME



Cloé David ☑, Clotilde Augros, Benoit Vié, François Bouttier, and Tony Le Bastard

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#### Ongoing Investigation

Sensitivity to axis ratio, oscillation, and mass-diameter relations.

#### At Météo-France

Ongoing evaluation of AROME-LIMA with different configurations over longer periods, incorporating all standard NWP scores and radar CFADs (collab. with Benoît Vié and Clément Strauss)

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