# Advancing the global km-scale models underpinning the DestinE Digital Twins

Benoît Vannière

on behalf of colleagues developing the IFS at km-scale at ECMWF in collaboration with ECMWF Member States











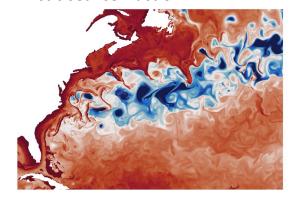
# **BUILDING ON PIONEERING GLOBAL KM-SCALE MODELLING**



10m wind gust in IFS-FESOM (atmosphere ~5km/ ocean ~5km)



Arctic sea ice fraction



Mixed-layer depth



Antarctic sea ice fraction











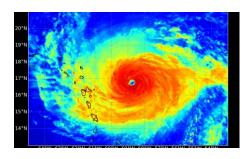


#### **GLOBAL KM-SCALE MODELLING EFFORTS AT ECMWF**



Short forecasts pioneering physics for global km-scale

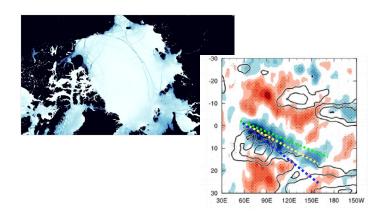
Multiple case studies up to IFS(2.8km/1.4km) + NEMO12(9km)





Multidecadal coupled simulations

*In 2024, 30 years of IFS* (4.4km) + *NEMO025* (25km) IFS(4.4km) + FESOM(5km)

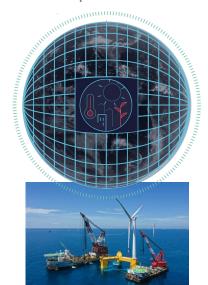


# **Destination Earth**

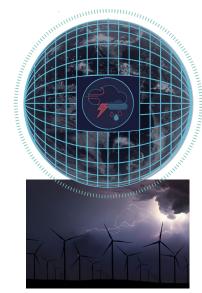


Pathway to operational use

Climate adaptation DT

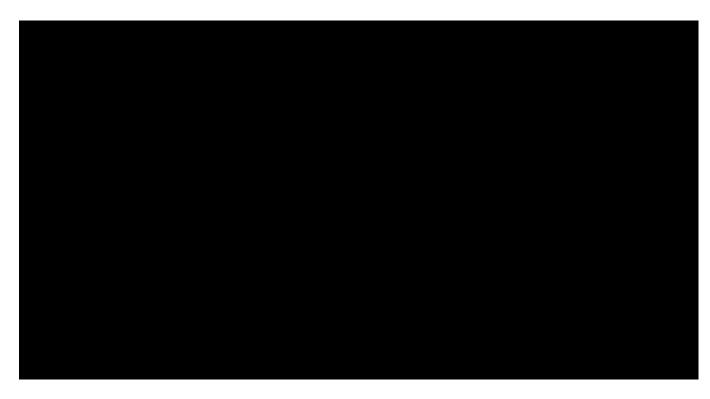


Weather-Induced Extremes DT





# KM-SCALE MADE POSSIBLE BY THE WORLD'S FASTEST SUPERCOMPUTERS













	SDPD	Computer	CPU nodes
IFS-FESOM 5km (Climate DT)	180	LUMI-C	201
IFS-NEMO 5km (Climate DT)	160	MareNostrum5	284
IFS-NEMO 5km (Extremes DT)	70	ECMWF Atos	128

Throughput allows for decade-long simulations and is fast enough for operational weather predictions



# **IMPROVEMENT DUE TO KM-SCALE**



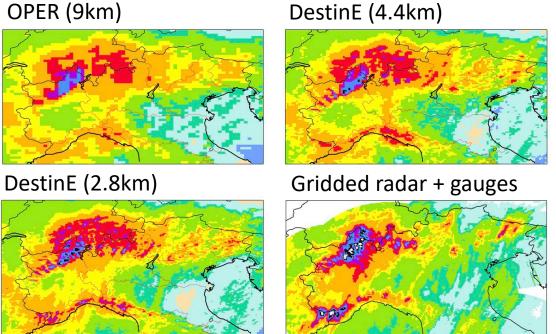






#### OROGRAPHIC PRECIPITATION AND NEAR-SURFACE FIELDS

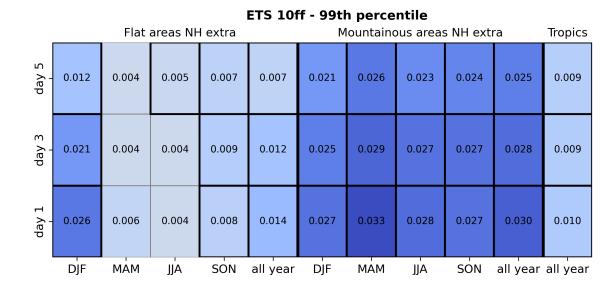
#### Storm Alex 24h TP, 2020-10-01 T+60h



50.0

150.0

#### "Extremes score-card" (ref SYNOP)



$$ETS = rac{\mathrm{H} - \mathrm{C}}{\mathrm{H} + \mathrm{M} + \mathrm{F} - \mathrm{C}}$$

H: Hits

M: Misses

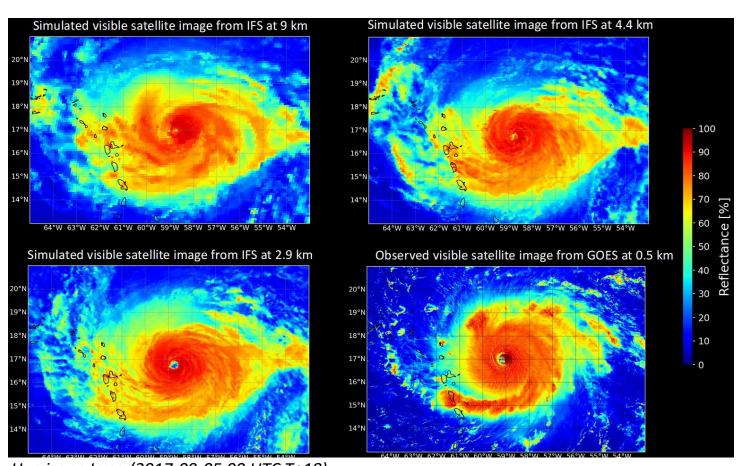
F: False alarms

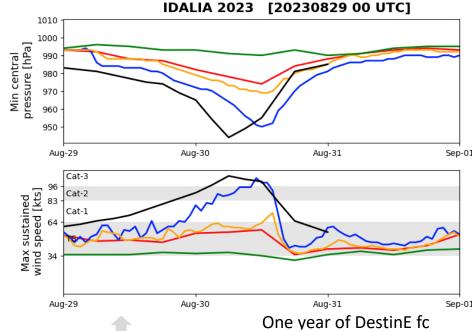
C: Correct negatives

Precipitation totals and surface wind are in better agreement with the observations. But poses verification challenges because of data quality/quantity and double penalty issue

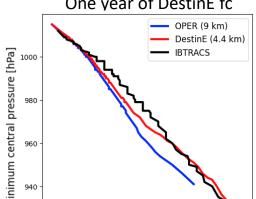


## **HOW DOES KM-SCALE IMPROVE TROPICAL CYCLONES?**









Maximum wind speed [kt]

Hurricane Irma (2017-09-05 00 UTC T+18)

... improved mesoscale features & intensity but lingering slow propagation bias



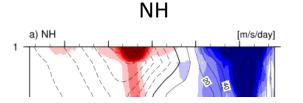


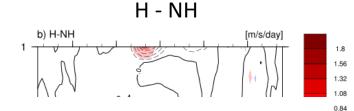
# WHERE HAVE WE MADE PROGRESS?



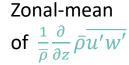


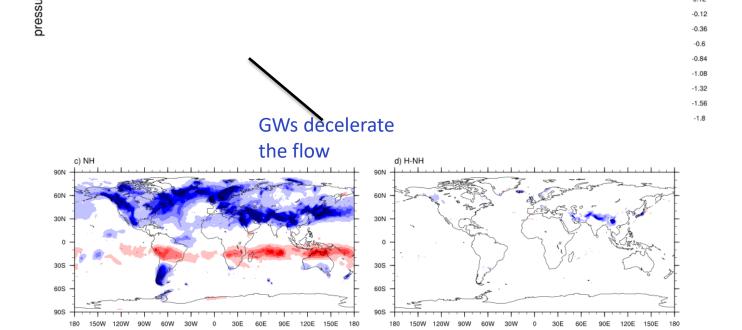
## IS THE HYDROSTATIC ASSUMPTION STILL VALID AT KM-SCALE?





2.8 km resolution simulations for end of January 2022 (winds over Himalayas ~50 m/s)





... mostly **YES**, difference between H and NH is limited to a few specific flow situations.

Fortunately, because NH is >2 times more expensive.



 $\bar{\rho}u'w'$ 

@90hPa

GWs carry westward momentum

GWs carry eastward momentum

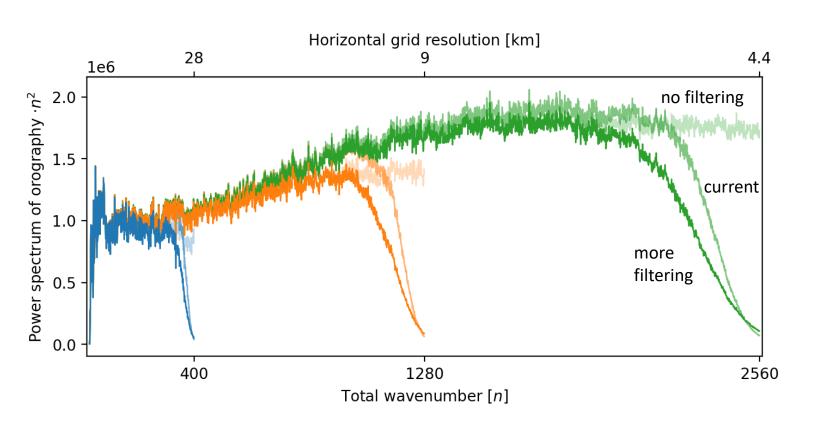
[mPa]





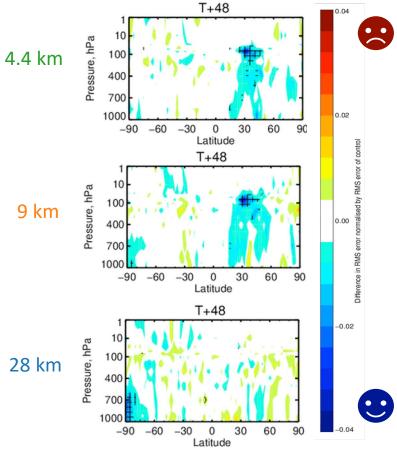


## **HOW TO TREAT OROGRAPHY?**



... careful balance between filtering small scales to improve accuracy, while preserving orographic detail

#### Change in RMSE of winds More filtering vs current

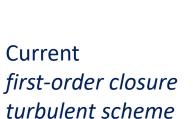


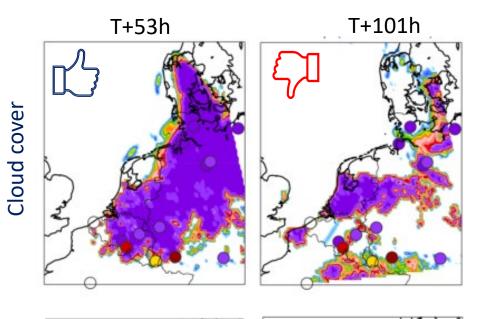




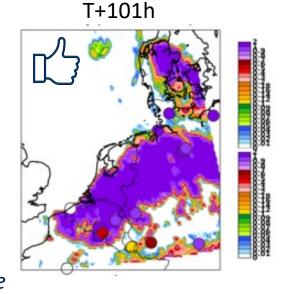
#### VT at 27/02/2021 05Z

#### PROGNOSTIC TKE TURBULENT SCHEME

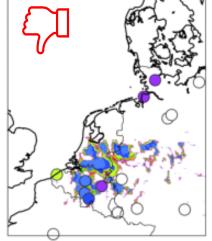


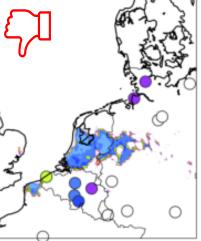


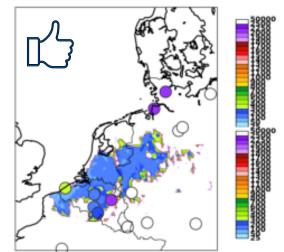
New prognostic TKE turbulent scheme











Ivan Bašták Ďurán



Current



# WHAT ARE THE CHALLENGES AHEAD?









#### **HIGH-RESOLUTION DATA ASSIMILATION**

#### FC 4km vs 9km (old)

	•	•	<del>,                                    </del>	V3 31	$O_{j}$ $III$	iu <i>j</i>
			n.hem	s.hem	tropics	europe
			rmsef/sdef	rmsef/sdef	rmsef/sdef	rmsef/sdef
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		250				
		500				
		850				
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			LUIV	WWI		

#### FC 4km vs 9km (new)

Γ			n.hem	s.hem	tropics	europe
			rmsef/sdef	rmsef/sdef	rmsef/sdef	rmsef/sdef
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	msl					
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		700				
	10ff@sea					
	swh					
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	2t					
	vw	100				
		500				
		850				
	10ff					
	ŗ					
		700				
	2d					
	tcc					
	tp					
	swh					

#### AN+FC 4km vs 9km

			rmsef/sdef	rmsef/sdef	rmsef/sdef	rmsef/sdef
an	Z	100				
		250				
		500				
		850				
	msl					
	t	100				
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	tcc					
	tp					
	swh					

Setup of the high-resolution DestinE analyses:

- TCo2559 (4.4 km) **trajectory** using latest 49r1 DestinE forecast (new orog, time-step)
- Increased resolution of minimisation (TL319/TL399/TCo399/TCo511)
- Observation time-slots reduced from 1800s to 400s
- High-resolution geostationary satellite data (reduced thinning)



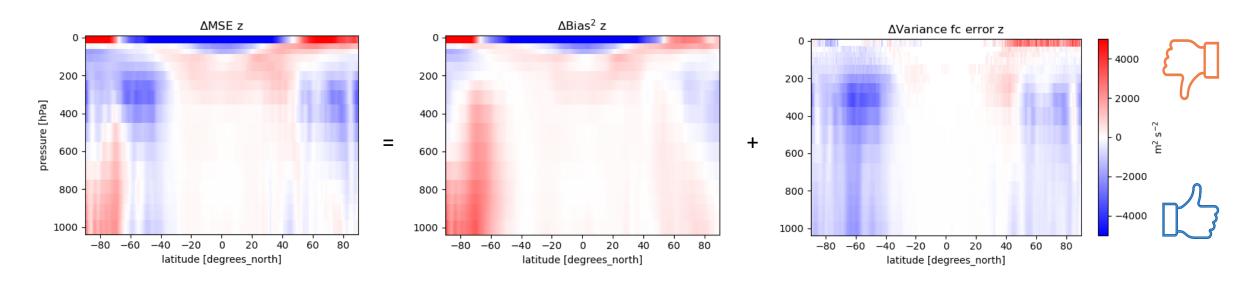


- Z. Zaplotnik, J. Schröttle,
- E. Orlandi and J. Bandeiras



#### DOES SIMULATING THE KM-SCALE HAVE AN UPSCALE EFFECT?

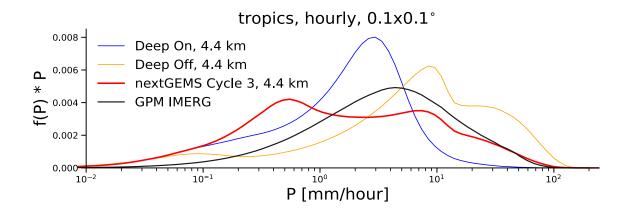
- One year of DestinE forecasts compared to OPER at T+72h (366 dates)
- $MSE = BIAS^2 + VFE$ , VFE = variance of forecast error informs on predictive skill



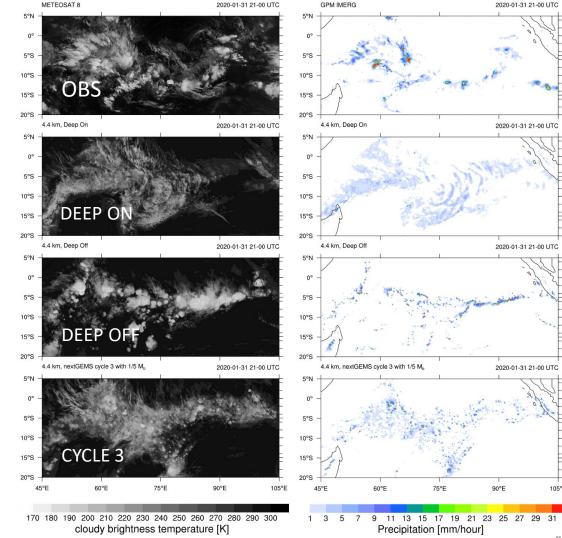
**YES**, first demonstration that simulating km-scale processes has a positive impact on the predictive skill in midlatitudes. However, it remains partly masked by bias.



## CAN WE TURN OFF THE PARAMETERIZATION OF DEEP CONVECTION?



... NO, but a careful modification of the scheme is required which optimizes both NWP scores and physical realism





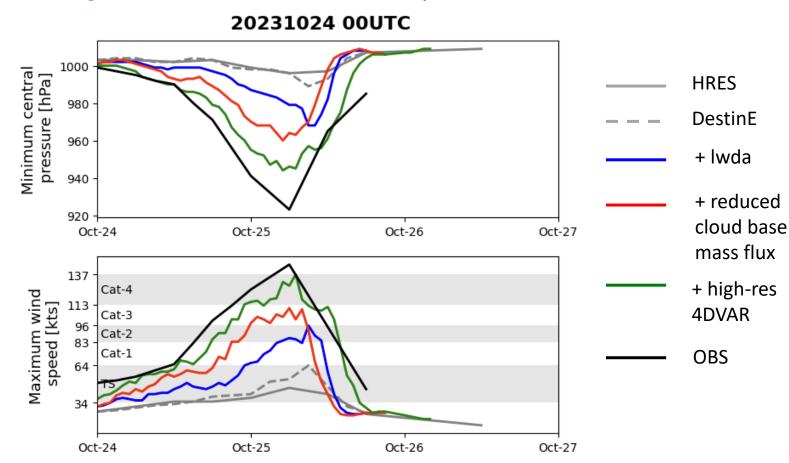






### **CASE OF TC OTIS**

Combining successively extra observations, reduced parameterized convection and higher resolution 4D-Var dramatically increases the forecast skill of Otis.





Model Forecast Intensity for Otis

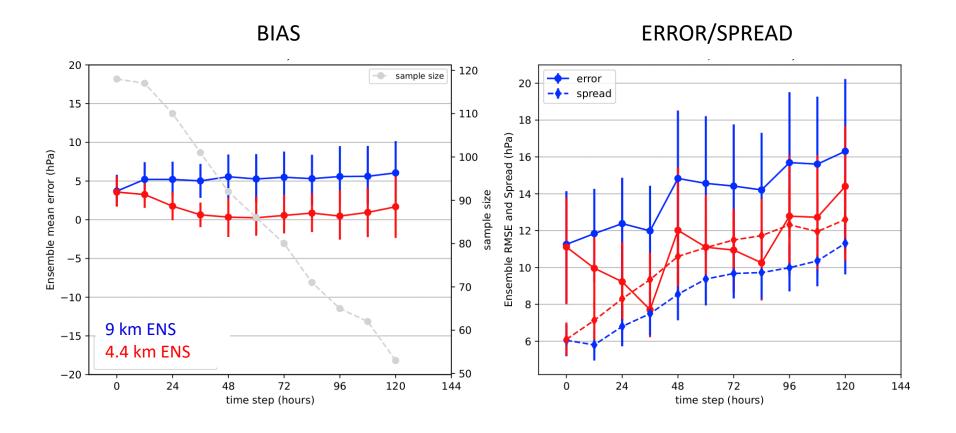
Ziga Zaplotnik, Michael Maier Gerber, Benoit Vanniere





# **QUANTIFYING UNCERTAINTY**

- ENS =10-member ensembles with SPP
- 30 initial dates
- Tropical cyclones minimum SLP

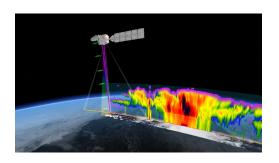






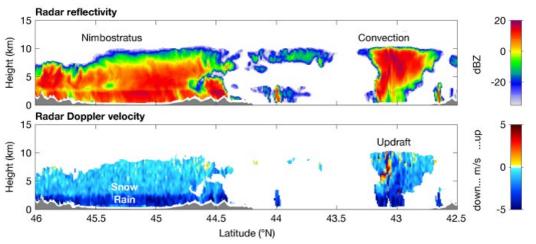
#### **NEW INSIGHTS FROM EARTHCARE WILL BENEFIT KM-SCALE**

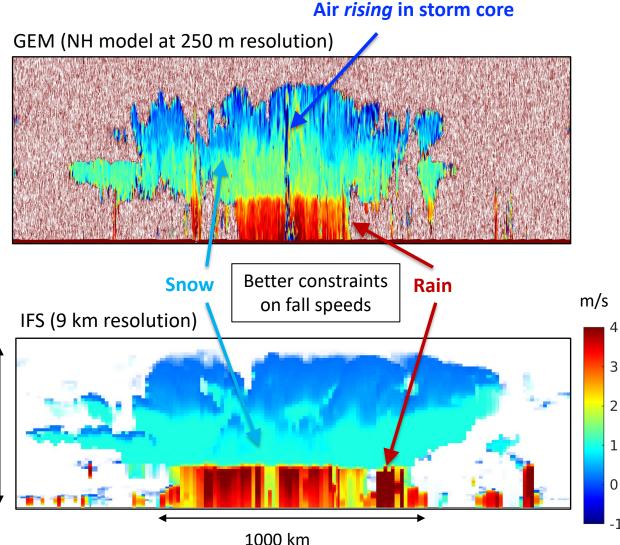
10 km



**New EarthCare** observations: Radar reflectivity and doppler velocity

- Radar doppler velocity measures rain and snow fall speed, aiding in drop size and rime fraction estimation
- Detailed insights on strength/width of convective updrafts

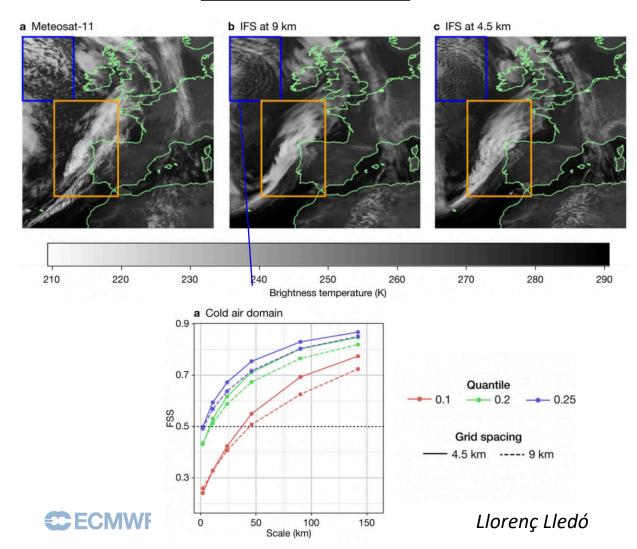


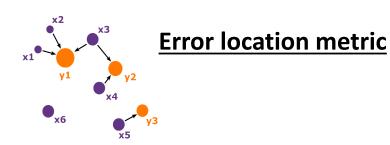


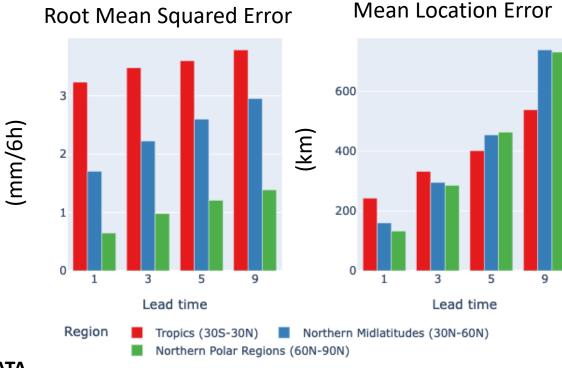


#### USING SPATIAL VERIFICATION METRICS FOR KM-SCALE PROCESSES

#### **Fraction skill score**







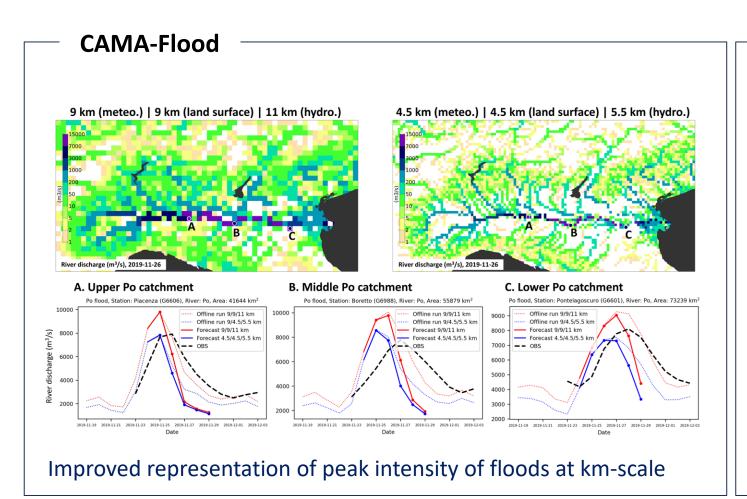
#### **DATA**

7 years of 9km operational forecasts, verified with analysis-proxy



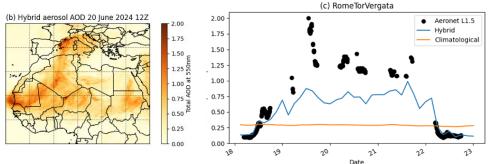


#### INTEGRATION OF IMPACT SECTOR MODELS IN THE KM-SCALE MODEL



#### Flexible prognostic aerosols scheme

Prognostic dust aerosols, CAMS climatology otherwise, 2024 June 10 12Z



New feature to include custom combination of prognostic and climatological aerosols species in the radiation scheme



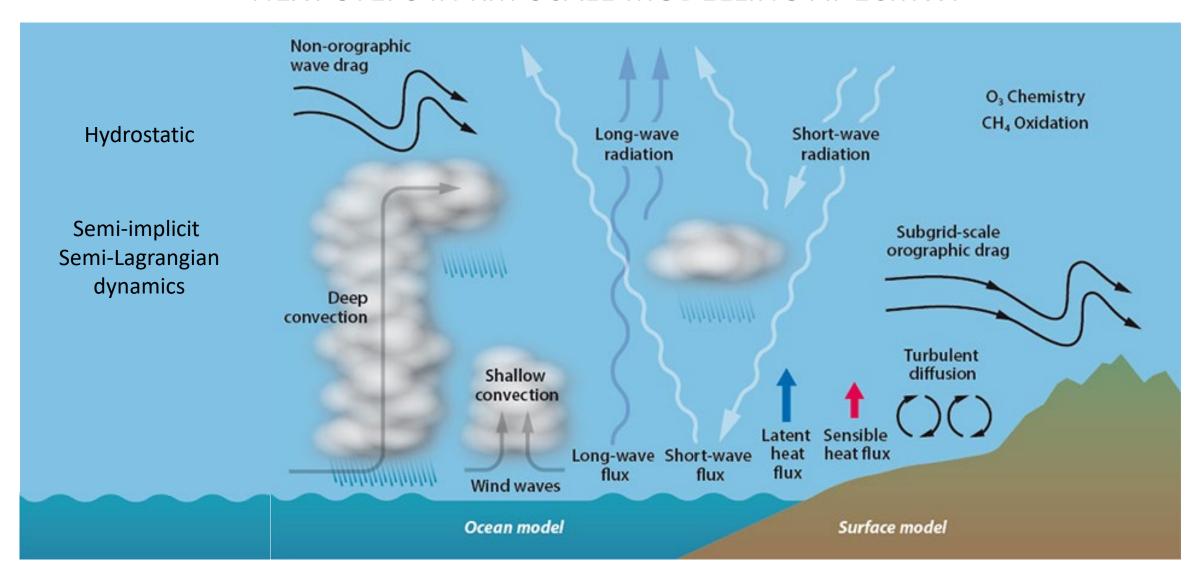


#### **KM-SCALE MODELLING AT ECMWF**

- Clear improvement of the km-scale to simulate several types of extreme weather
- DestinE operationalizes km-scale IFS simulations for weather prediction and climate projections by leveraging **EuroHPC** supercomputers
- Delivers better information to application sectors and improves boundary conditions for ACCORD models
- Adapting moist physics for km-scale remains challenging but developments to the representation of convection, turbulence and microphysics, and new observations of cloud and precipitation from EarthCARE provides a good way forward
- Km-scale models present a major opportunity for training AI-based NWP, and improve their representation of mesoscale and extreme weather prediction

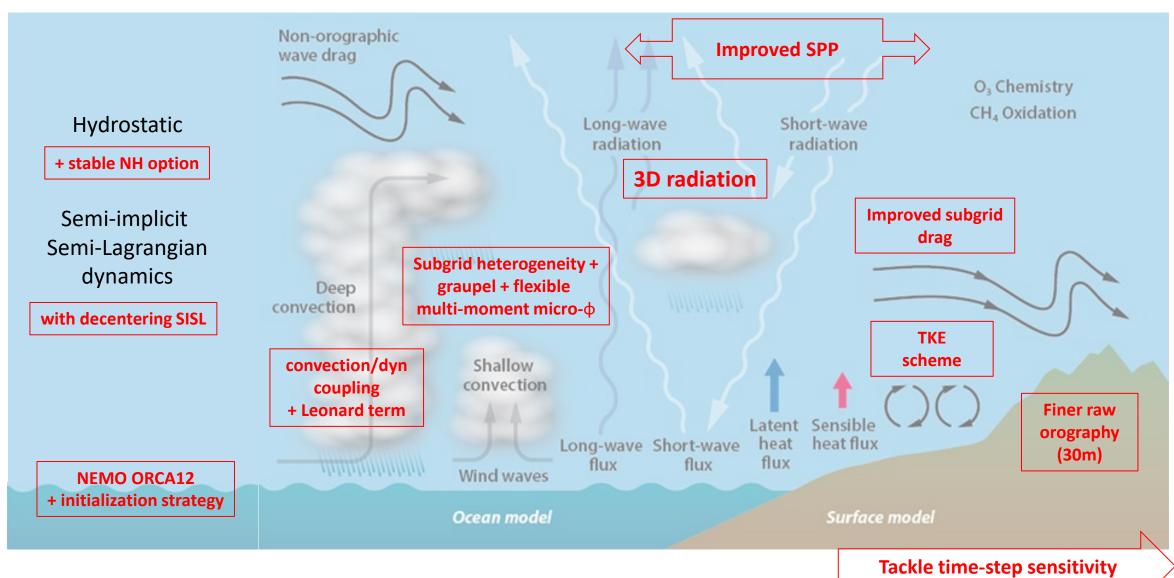


## NEXT STEPS IN KM-SCALE MODELLING AT ECMWF





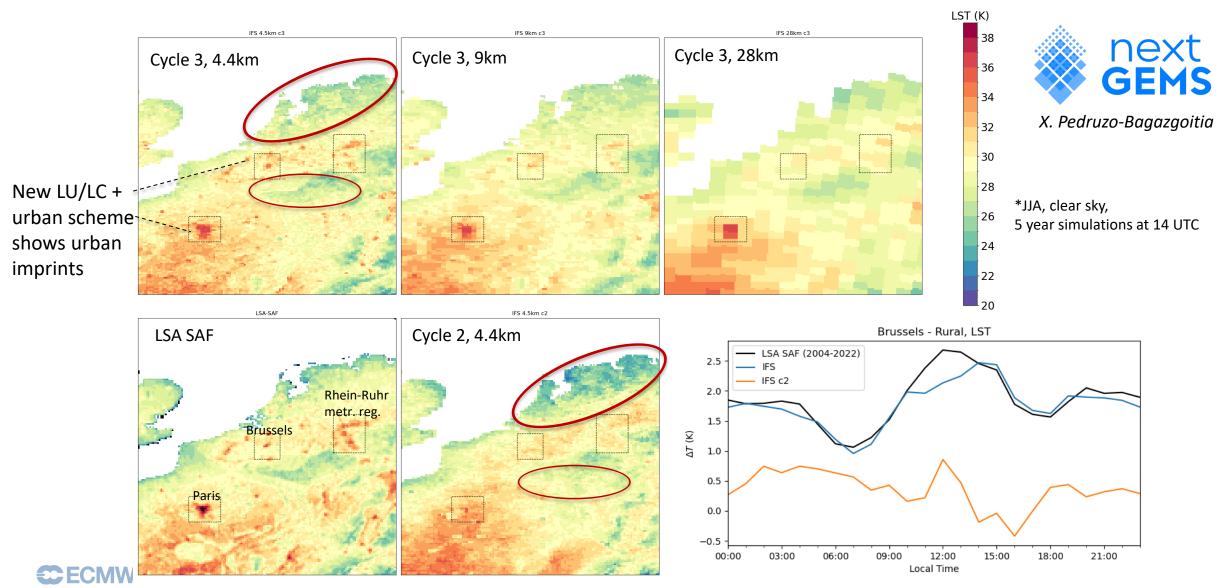
#### NEXT STEPS IN KM-SCALE MODELLING AT ECMWF







#### IMPACT OF CITIES AT THE LOCAL SCALE





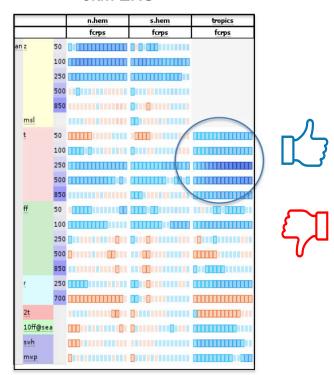


#### **TUNING A GLOBAL KM-SCALE CLIMATE MODEL**

Biases identified during nextGEMS Hackathon in climate simulations...

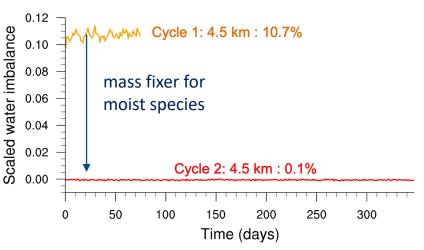
... improve scores of ENS forecasts and extreme DTs

#### 9km ENS

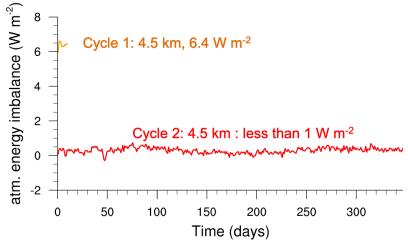


#### 8-member d(fCRPS)

#### Water budget



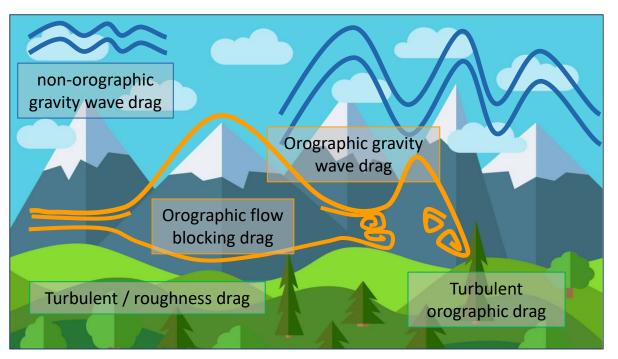
#### **Energy budget**

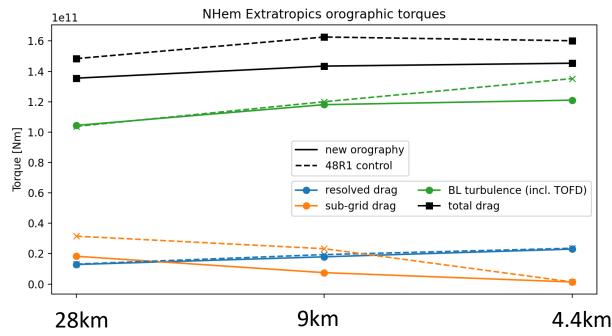






### SUB-GRID OROGRAPHIC PROCESSES STILL IMPORTANT AT HIGH RESOLUTION





Annelize Van Niekerk, Birgit Sützl

- Updated field processing so that subgrid drag evolves smoothly and consistently with resolution.
- Exploiting high-resolution data to build ancillary fields (Copernicus DEM at resolution 30m)
- Bayesian optimization strategy for tuning subgrid drag

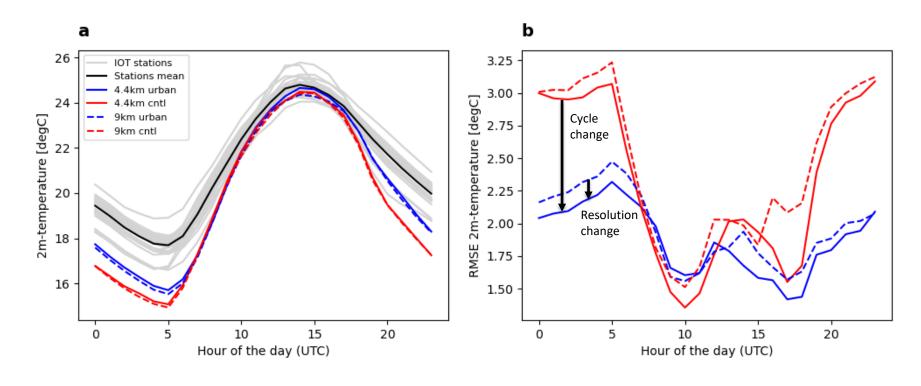






#### **IMPACT OF CITIES AT THE LOCAL SCALE**

Paris RDP project evaluating Paris t2m against 30 IOT stations







#### **HIGH-RESOLUTION DATA ASSIMILATION**

#### FC 4km vs 9km (old)

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			n.hem	s.hem	tropics	europe
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FC 4km vs 9km (new)

250

100 250

500

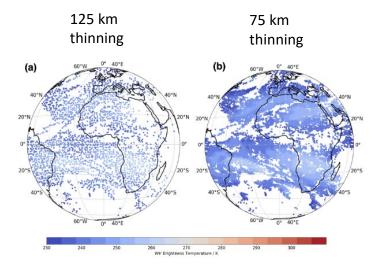
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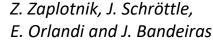
#### AN+FC 4km vs 9km

		n.hem	s.hem	tropics	europe
		rmsef/sdef	rmsef/sdef	rmsef/sdef	rmsef/sdef
an z	100				
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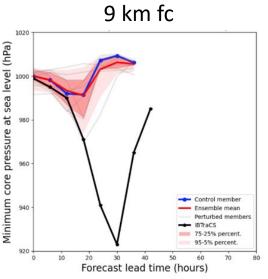


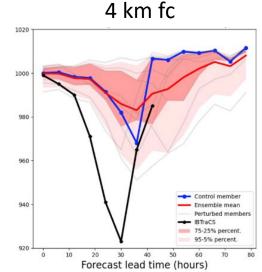


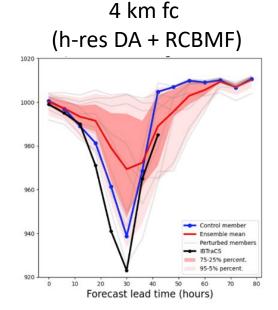
# **QUANTIFYING UNCERTAINTY**

Evaluating 4.4 vs 9 km 10-member ensembles with SPP + additional physics changes

> **Tropical Cyclone Otis** (24-25 Oct 2023)



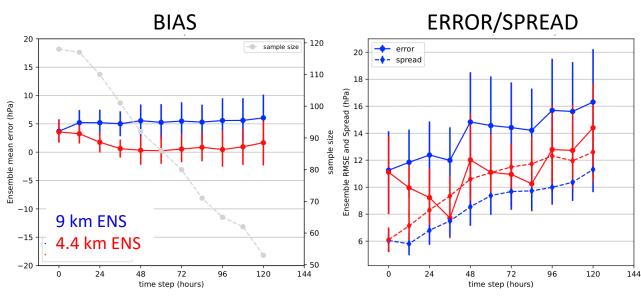




#### 30 initial dates

Aristofanis Tsiringakis







# Representing uncertainties at kilometre scale resolutions

- Funded by **Destination Earth**, work is on-going to test and further develop uncertainty representations at high resolution (Δx ≤4.4 km)
- Lack of affordability to run large IFS ensemble at km-scale in the next five to ten years
- Alternative approach: Use ML to learn probabilistic downscaling and assess realism via comparison with IFS km-scale simulations

