# Seastates-NET: A Machine Learning Forecasting Model for Understanding Wave-Current Interactions

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Work with O. Akar, B. Chapron, F. Ardhuin, H. Bull, E. Moschos

Thursday, September 25, 2025







4<sup>TH</sup> INTERNATIONAL WORKSHOP ON WAVES, STORM SURGES, AND COASTAL HAZARDS Incorporating the 18th International Waves Workshop ines.larroche@amphitrite.fr





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 Motivation
 Architecture
 Producing forecasts
 Physical coherence
 Temporal coherence
 Next steps









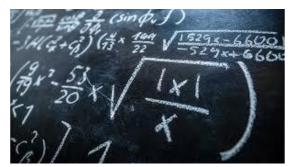
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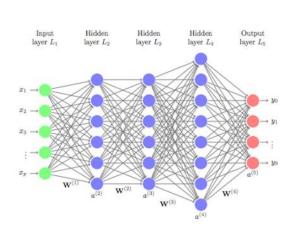
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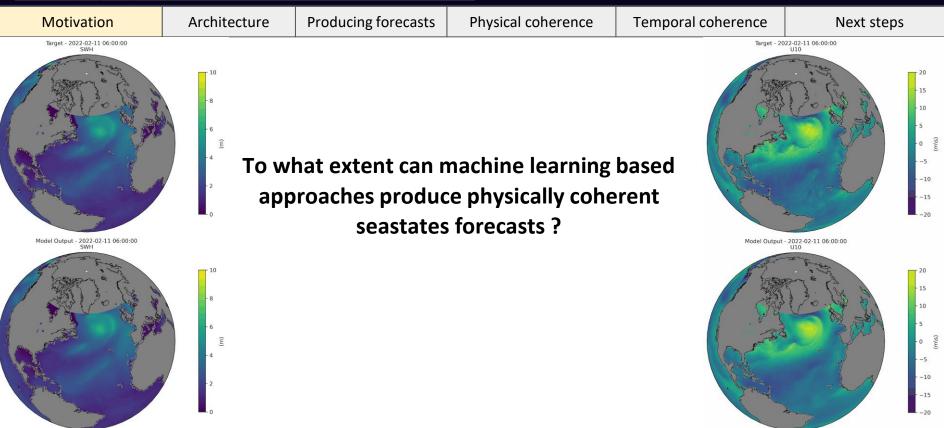




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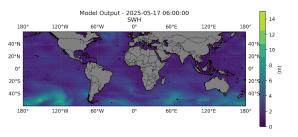




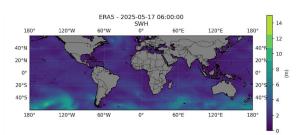


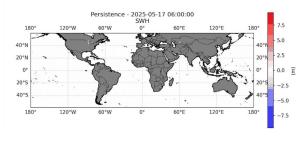
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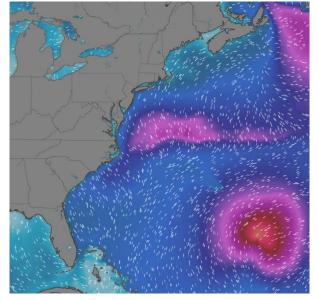
How to minimize error propagation and ensure temporal coherence of forecasts?





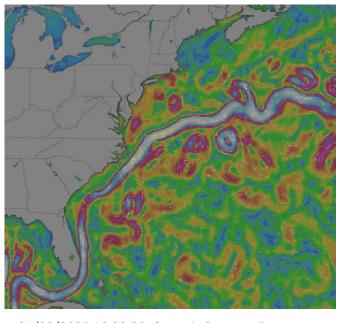


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21/09/2025 16:00:00, SWH Forecast, IFS Forecasting Model, <a href="https://weatherviz.amphitrite.fr/">https://weatherviz.amphitrite.fr/</a>

How to build on those experiments to integrate knowledge on interactions between ocean waves and currents?



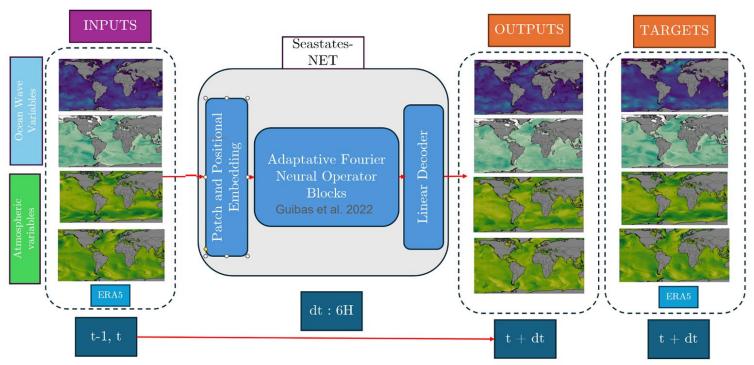
21/09/2025 16:00:00, Oceanic Currents Forecast, ORCast Forecasting Model, <a href="https://weatherviz.amphitrite.fr/">https://weatherviz.amphitrite.fr/</a>

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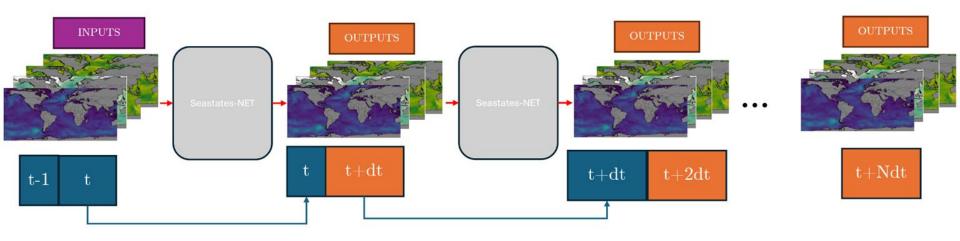


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Architecture Producing forecasts Physical coherence Temporal coherence Motivation Next steps Joint Distribution of wind speed and SWH for 2022 Joint Distribution of wind\_speed and swh (Based on 357 timesteps) 2D RMSE: swh | (Wind speed,swh) | step t+1 (Based on 357 timesteps) Theoretical curves Transition point (7.5 m/s) Transition point (7.5 m/s) 154046 7776 swh (m) 2.0 ks 1.0 0.5 5 10 15 20 25 25 wind speed(m\s) Wind speed (m/s) Wind speed (m\s)

Analysis of Significant Wave Height / Wind speed joint distributions, at 6-hour lead time. (a) Target joint distribution from ERA5 reanalysis. The black curve is the theoretical relationship between winds speed and significant wave height for a fully developed sea, proposed by Hasselman et al (1988) [3]. (b) Seastates-NET estimated joint distribution. (c) Two dimensional RMSE, plotted for Significant Wave Height (SWH).



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Multistep training strategy
Backpropagation Through
Time. (BPTT).
Vlachas et al, 2024

**autoregressive rollouts** rather than on single time step forecasts

Constrain the model on

Sequentially feed the model with its own forecasts



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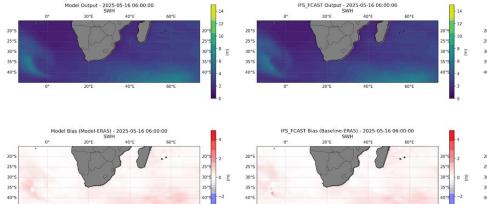
Physical coherence

Temporal coherence

Next steps

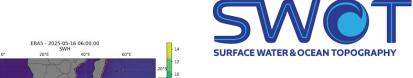
### Study wave-current interactions by:

- Using observations and model data in the training process
- Working at higher resolution









## Thank you!

Thursday, September 25, 2025







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