Ocean OSSEs and OSEs for hurricane applications

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What are OSEs?

- Observing System Experiments (OSEs) aim at quantifying the impact of existing observations, using a numerical model that assimilates observations
- The impact of a certain type of observations is estimated by **comparing two** experiments:
 - One in which all the available observations are assimilated
 - Another one in which all available observations are assimilated, except for the observations from the array under study
 - The difference in error reduction between both experiments quantifies the benefit of the observations
- Alternatively, one can estimate the error reduction gained by assimilating only the observations under study, compared to the absence of data assimilation

What are OSSES?

- Observing System Simulation Experiments (OSSEs) are the cousins of OSEs
- They **aim** at **examining** the performance of:
 - An observation platform or system that does not exist yet (e.g. satellites)
 - A modified configuration of an existing network (e.g. moorings, gliders etc.)
- In OSSEs, the observations are extracted from a second, independent simulation that represents the Truth. That simulation is called the Nature Run
- Simulated observations are extracted from the Nature Run to mimic the observations we want to study
- The **simulated observations** are then **assimilated** into the data-assimilative model, **as if they were real observations**
- The performance is estimated in a similar way as OSEs



AOML ocean OSSE system

- Nature Run (NR):
 - Multi-year unconstrained simulation by an advanced ocean model, validated to represent the "truth")
 - HYbrid Coordinate Ocean Model (HYCOM) run at 0.04° resolution

Ocean Forecast System:

- Forecast Model: HYCOM with substantially different configuration from the NR ("fraternal twin" system)
- Ocean Data Assimilation procedure: Statistical interpolation system designed specifically for the HYCOM model



Example of an ocean OSSE: Impact of glider motion

OSSE evaluation of assimilating an array of profilers

- Simulate daily **1000 m temperature-salinity profiles** over a grid within the analysis box (right) at 2° resolution
- Profiles **simulated from the Nature Run** in May-October 2014, and then assimilated into the Forecast Model



For stationary profilers, accurate correction is confined to regions immediately surrounding the profiler locations (blue points)

Root Mean Square Error (RMSE) in the average temperature between the surface and 100 m depth



50° W

Profiler Locations

Example of an ocean OSSE: Impact of glider motion

Gliders deployed



• Each glider moves in a figure-8 pattern at 0.25 m/s sampling 1000 m T-S profiles





Comparison of **errors** with respect to no observation assimilated:

- Gliders: **40%** error reduction
 - Stationary profilers: only 14%

Root Mean Square Error in the average 0-100 m temperature for both study cases

Key findings

• Arrays of ocean profilers deployed at **fixed locations** at a nominal separation distance of 2° have an impact that is **limited around measurement locations**

- This limited radius of accurate correction is substantially extended by assimilating profiles from moving gliders
- Arrays of **underwater gliders** deployed at a nominal separation distance of 2° provide **significantly improved reduction of errors** compared to static platforms
- Results are presented in:

• Halliwell, G.R., Goni, G.J., Mehari, M.F., Kourafalou, V.H., Baringer, M. and Atlas, R. (2020). OSSE assessment of underwater glider arrays to improve ocean model initialization for tropical cyclone prediction. *J. Atmos. Ocean. Technol.*, 37(3), 467-487

 Other observing systems and other aspects of the ocean observing strategy studied by our group



AOML coupled ocean-hurricane OSE system

- Coupled model HYCOM-HWRF adapted from operational NOAA EMC system
- HWRF H218 version (3 domains of resolution 13.5/4.5/1.5 km)
- HYCOM component of the coupled model:
 - Same Forecast Model used for ocean OSSEs
 - 1/12° horizontal resolution
 - Assimilates ocean observations prior to coupling with HWRF
 - Used to examine various initial ocean conditions for the coupled experiments, depending on the ocean observations assimilated in the ocean model, while keeping the same atmospheric component
- Simulations: "cycles" of 5-day forecast using the coupled model

Example of a coupled OSE: Impact of of ocean observations on hurricane forecasts during Hurricane Michael (2018)

- We performed various ocean simulations with the HYCOM model:
 - A simulation forced to represent **climatological ocean conditions** ("Clim")
 - A simulation in which all available ocean observations (altimetry, SST, in situ float data) are assimilated to make the simulation as close to reality as possible ("All Obs")
 - A free-running simulation, without constrain from data assimilation of observations ("No DA")
- The simulations started on January 1st, 2018 (i.e., before hurricane season)

Impact of of ocean observations during H. Michael (2018)

• The data assimilative All Obs simulation represents the ocean features of interest: anticyclonic eddies with high Tropical Cyclone Heat Potential (TCHP), warm surface waters

- The climatological simulation Clim has a **diffused Loop Current** without eddies, and very low TCHP inside the Gulf
- The free running **No DA** simulation has a retracted Loop Current but no warm-core eddies, and overall lower TCHP and SST than observed



0.5

0

100

30

26

Example of a 5-day coupled simulation of Michael (2018)



• Ocean DA leads to higher energy fluxes ²⁵ from the ocean toward the hurricane

Surface enthalpy flux averaged over the 60-66 hour period (left: All Obs, right: No DA)

Observed wind intensities (Best, grey), with simulated ones for the All Obs (red), No DA (blue), Climatology (cyan) cases starting on 6 Oct., 18Z.

- Hurricane tracks close to observed
- All Obs: rapid intensification to Cat. 4
- Unconstrained (*No DA*) and climatology (*Clim*) cases **do not intensify as much** (Cat. 1-2)



Hurricane Michael (2018): ensemble statistics

• Wind intensity and central pressure errors over 4 forecast cycles (every 6 hrs on 6 Oct. 2018, early stage of the storm):

• *No DA*: large error (33.6 kts on average, 55.7 kts at landfall)

• *All Obs.*: **lowest error** (22.8 kts on average, 24.5 kts at landfall): leads to an error reduction of 32% on average, 56% at landfall

• Add SST (magenta, 23.9 kts on average) and Add Argo (green, 26.6 kts on average) show significant contributions of the respective platforms to error reduction (Argo floats, SST)



Key findings

- The coupled ocean-hurricane model is **able to reproduce the rapid intensification** of Hurricane Michael in 2018
- Assimilating ocean observations leads to large error reduction in wind intensity forecast of Michael: strong impacts of the ocean on the storm
- The correct representation of the ocean leads to reduced error in hurricane intensity forecasts, which is best achieved by assimilating a combination of observations (altimetry: mesoscale features, profilers: vertical structure, SST: mixed layer temperature and heat)
- Results are presented in:
 - Le Hénaff, M., R. Domingues, G. Halliwell, J.A. Zhang, H.S. Kim, M. Aristizabal, T. Miles, S. Glenn, and G. Goni (2021). The role of the Gulf of Mexico ocean conditions in the intensification of Hurricane Michael (2018). *Journal of Geophysical Research: Oceans*, 126, p.e2020JC016969.

Other hurricanes investigated: Hurricane Gonzalo (2014), Hurricane Maria (2017)

Current and future developments

Current and future developments

- <u>Current</u>: Ocean diagnostics using the **NOAA operational system** RTOFS-DA, based on HYCOM and on the 3D-Var Navy Coupled Ocean Data Assimilation (NCODA) system: allows us to make diagnostics using the same tools as the operational center
- <u>Current</u>: Three-way coupling ocean-waves-atmosphere (HYCOM-WW3-HWRF), which Hyun-Sook Kim just presented
- Current and future: NOAA Unified Forecast System (UFS)
 - Unified modeling tools for whole (most) of NOAA
 - Atmosphere: FV3, Hurricane Analysis and Forecast System (**HAFS**) for hurricanes
 - Ocean: Modular Ocean Model v.6 (MOM6)
 - In parallel, Joint Effort for Data assimilation Integration (**JEDI**): DA tools for both the atmosphere and the ocean

Current and future developments

- <u>Current</u>: NOAA AOML in Miami involved in code development and configuration testing, for both the atmosphere and the ocean components of UFS, in **collaboration** with NOAA Environmental Modeling Center (EMC)
- <u>Current</u>: **MOM6** on the **North Atlantic** (1/12° + 50 vertical layers) + **JEDI** (3DVar or LETKF)
- <u>Current</u>: **Weakly coupled DA** EnVar for an atmospheric model (HWRF or HAFS), LETKF for an ocean model (MOM6), <u>future</u>: LETKF for a wave model (WW3)
- <u>Future</u>: Strongly coupled DA
- <u>Future</u>: OSEs, OSSEs, Forecast Sensitivity to Observations (FSO) using MOM6, HAFS and JEDI