
Assessing the impact of SAR altimetry for global ocean analysis and forecasting

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Abstract :

Satellite altimetry provides essential sea level observations to constrain ocean analysis and forecasting systems. New generation of nadir altimeters now provides enhanced capability thanks to a SAR mode that allows reducing the 1 Hz (7 km) measurement noise level from about 3 to 1 cm RMS. A first assessment of the impact of SAR altimetry for global ocean analysis and forecasting is carried out using Observing System Simulation Experiments (OSSEs) with the global Mercator Ocean high resolution 1/12° system. OSSEs are used to quantify the impact of assimilating multiple altimeter missions with and without a SAR mode. A simple twin experiment set up that only takes into account initialisation errors and impact of altimeter random noise is used. Results are analysed in high eddy energy regions where initialisation errors are the most important ones. Both sea surface height and surface velocity analyses and 7-day forecasts are improved. Compared to conventional altimetry, SAR altimetry sea surface height variance errors for both analyses and forecasts are typically reduced by 20% in western boundary currents. This suggests that use of SAR multiple altimeter missions with high-resolution models will significantly improve the capability of the ocean analysis and forecasting systems in the near future.

35 **Introduction**

36 Satellite altimetry is an essential remote sensing technique for operational oceanography (see
37 Le Traon et al., 2015 and Le Traon et al., 2017 for a recent review). Multiple altimeter
38 missions provide all weather, global and high resolution sea level observations that are
39 critical to constrain ocean analysis and forecasting systems (e.g. Lellouche et al., 2013; Oke
40 et al., 2015). New generation of nadir altimeters now provides enhanced capability thanks to
41 a SAR mode (also known as Delay-Doppler processing mode) that allows reducing
42 significantly the measurement noise level compared to conventional pulse limited altimeters
43 (Dibarboure et al., 2014; Boy et al., 2017). Noise level for 1 Hz sampling (about 7 km) is thus
44 about 1 cm rms for SAR altimeters compared to about 3 cm rms for conventional pulse
45 limited altimeters (hereafter referred as CONV altimeters).

46 Cryosat-2 launched in 2010 was the first altimeter mission with a SAR mode. Although
47 Cryosat-2 is a mission dedicated to ice studies, its data have been extensively analyzed to
48 assess the value of altimeter SAR mode over the ocean (e.g. Boy et al., 2017). Sentinel 3 is a
49 constellation of two ocean missions (S3A and S3B) from the European Union Copernicus
50 programme. S3-A was launched in early 2016 and S3-B was launched in Spring 2018. They
51 are both equipped with SAR altimetry. By 2020, Sentinel-6 (Jason CS) that will ensure the
52 long term continuity of the Jason series will also feature a SAR altimetry mode. It is thus
53 expected that in the years to come at least three altimeters with a SAR mode will be flying
54 simultaneously.

55 A reduced noise level allows a better effective resolution of mesoscale variability along the
56 altimeter tracks (e.g. Dufau et al., 2016). It should also lead to improved ocean analyses and
57 forecasts but this effect has not yet been quantified. Note, however, that a better effective 1D
58 resolution along the altimeter tracks will not necessarily translate into a better 2D resolution
59 as the latter is also mainly dependent on the space/time sampling characteristics of the
60 altimeter constellation.

61 A first assessment of the impact of SAR altimetry for ocean analysis and forecasting is
62 performed as part of this study. An Observing System Simulation Experiment (OSSE) is
63 carried out with the Mercator Ocean global $1/12^\circ$ ocean analysis and forecasting system to
64 quantify the impact of SAR versus CONV altimetry. The note is organized as follows. The
65 OSSE design is presented in section 2. Results are discussed in section 3 and main
66 conclusions are summarized in section 4.

67

68 **Observing System Simulation Experiments**

69 OSSEs use two models (see Hoffman and Atlas, 2016 for a recent review). One model is used
70 to perform a “nature” run. The “nature” run (NR) is sampled to yield synthetic altimeter
71 observations and a noise of 1 cm RMS and 3 cm RMS is added to simulate respectively SAR
72 and CONV altimeter observations. These synthetic observations are assimilated into the
73 second model (Assimilated Run or AR) and the model performance is evaluated by

74 comparison to the NR. In this study, both the NR and the AR are based on the global NEMO
75 model at $1/12^\circ$ horizontal resolution and 50 vertical levels (identical twin experiment). The
76 AR uses the SAM2 (*Système d'Assimilation Mercator version 2*) data assimilation system
77 (see Lellouche et al., 2013). It is the same data assimilation system used by Mercator Ocean
78 for the Copernicus Marine Environment Monitoring Service (CMEMS). A Free Run (FR)
79 without assimilation is also used to quantify the relative improvement of altimeter data
80 assimilation.

81 The OSSEs were started from January 7, 2009 over a one-year time period. Two different
82 initial conditions (i.e. January 7, 2009) for the NR and for the AR are required so that we can
83 quantify the impact of assimilating pseudo observations of the NR in the AR. This was
84 achieved by running the two free run NEMO configurations initialized from climatology but
85 at different times. The NR simulation was started in 2003 and the AR was initialized from a
86 $1/12^\circ$ free run started from 2006. Both NR and AR are forced with ECMWF (European
87 Centre of Medium Weather Forecasting) operational 3-h atmospheric data.

88 To assess the impact of the number of altimeter data, three satellites (Jason-1, Jason-2 and
89 Envisat) have been considered. Jason-1 and Jason-2 have a 10-day repeat cycle and Envisat a
90 35-day repeat cycle. Jason-1 was in its interleaved orbit with its ground tracks just in between
91 Jason-2 tracks. Jason-1, Jason-2 and Envisat simulated observations were derived from the
92 NR with an along-track resolution of 7 km (1 Hz) (real Envisat, Jason-1 and Jason-2 tracks
93 were used to simulate the observations). A first OSSE (CONV altimetry) uses an observation
94 white noise of 3 cm RMS that was simulated and added to these pseudo observations. A
95 second OSSE (SAR altimetry) uses an observation noise of 1 cm RMS. Note that as we use
96 the same model resolution for the assimilated run and nature run, we do not have to take into
97 account representativity errors. The observation error covariance matrix is reduced to a
98 diagonal matrix with 9 cm^2 for CONV altimeters and 1 cm^2 for SAR ones.

99 This study is a first attempt only to assess the sensitivity of ocean analyses and forecasts to
100 the level of random noise in altimeter data. We only assimilate altimeter data and, apart from
101 random noise, we do not consider other sources of errors and, in particular, systematic errors
102 related to the use of external Mean Dynamic Topography (see Le Traon et al., 2017).

103 Our OSSE design is also a simplified one. We use an identical twin experiment (the same
104 model is used for the AR and the NR) and do not include model and forcing errors in the
105 OSSEs but only initialization errors (see discussion in Halliwell et al., 2014 and Hoffman and
106 Atlas, 2016). This simplified design can result in an overestimation of the impact of altimeter
107 data assimilation. Initialization errors are, however, the most important ones in high eddy
108 energy regions. This was checked by comparing our OSSE innovations (i.e. observations
109 minus model forecasts) statistics in high eddy energy regions with those derived from the
110 global Mercator Ocean operational system that uses the same $1/12^\circ$ model and data
111 assimilation method. Innovation variances relative to the total signal variance from our
112 OSSEs are consistent with the ones derived from the global Mercator Ocean model. Our
113 OSSEs are thus able to simulate a large part of the error growth between reality and a model

114 assimilating real observations. We also checked that there is not a convergence of the AR
115 towards the NR over time. Our innovations statistics remain stable over time after an initial
116 spin up of about 2 months.

117

118 **Main results**

119 The two assimilation experiments (SAR and CONV) start the 7th of January 2009 and end
120 the 30th of December 2009. The difference between a given simulation and the NR are used
121 to derive statistics of errors on analyses and 7-day forecasts over the last 7 months (June-
122 December 2009).

123 Impact of assimilation of altimeter data is analysed on sea surface height (SSH) and surface
124 zonal and meridional velocities (U, V). Errors on temperature and salinity at depths are also
125 analysed to quantify the sensitivity of the results for the deep ocean fields. Analyses are
126 focused on regions with high mesoscale variability, notably Gulf Stream (GS), Agulhas
127 Current (AC) and Kuroshio (KU).

128 Fig. 1 shows the Mean Squared Error (MSE) in the SSH for the free run (FR), i.e. the
129 difference between the FR and NR. As expected, the FR shows large differences with the NR
130 as they provide two uncorrelated mesoscale variability fields.

131 Fig. 2 shows the MSEs in the SSH for the analyses and forecasts of the two different
132 assimilation runs (SAR and CONV altimetry) as estimated from the difference with the NR.
133 Both SAR and CONV assimilation runs strongly reduce analysis and forecast errors. SAR
134 results are globally better than CONV results.

135 To summarize results shown on the different maps and to focus on regions with high
136 mesoscale variability, error variances for three Western Boundary Current (WBC) regions
137 (Gulf Stream, Agulhas, Kuroshio) are given in Table 1. Relative error variance reduction of
138 SAR versus CONV altimetry is given in Table 2.

139 Compared to the FR error variance, SSH analysis errors for SAR and CONV altimetry are of
140 about 10%. This shows the strong contribution of multiple altimeter data assimilation to
141 constrain mesoscale variability in the global 1/12° data assimilation system. 7-day SSH
142 forecast errors are about twice as large as SSH analysis errors (about 20% of the FR error
143 variance). Velocity analysis and forecast errors are, as expected, larger and are respectively
144 about 30% and 50% of the FR error variance for analysis and forecast errors. Note that there
145 are significant differences between the three regions. Largest errors are generally found in
146 the Gulf Stream and the smallest ones in the Kuroshio. We do not have a clear explanation
147 for this result but note that this is consistent with what we observe with real observations in
148 our operational system.

149 SAR altimetry provides better results for the three different WBC regions both for SSH
150 analyses and forecasts. Although the improvements with respect to the FR error variance are

151 small, the relative improvement with respect to the CONV error variance is quite significant
152 and is on average of about 20%. The largest impact is obtained in the Kuroshio where the
153 relative improvement is almost 40%. Comparable results are obtained for the surface zonal
154 and meridional velocity but the relative impact of SAR versus CONV altimetry is smaller and
155 is on average of about 10%.

156 Similar calculations were done for temperature and salinity fields. Assimilation of multiple
157 altimeters has a significant impact on the upper ocean temperature fields. Use of SAR
158 altimetry versus CONV altimetry showed slightly improved results but not as large as for
159 SSH and surface velocity.

160

161 **Conclusion**

162 Observing System Simulation Experiments (OSSEs) carried out with a global analysis and
163 forecasting system at 1/12° have been used to assess for the first time the impact of future
164 multiple altimeter missions in SAR mode. A simple twin experiment set up that only takes
165 into account initialization errors and impact of altimeter random noise is used. Results show
166 a positive impact. In high eddy energy regions where initialization errors are the most
167 important ones, SSH analysis and forecast errors are typically reduced by about 20% with
168 respect to conventional altimeter missions. This suggests that the future altimeter missions
169 developed as part of the EU Copernicus programme should improve the quality of CMEMS
170 analyses and forecasts. This should now be checked with more comprehensive OSSEs and
171 real data. Sensitivity of the results to the data assimilation scheme and its evolutions should
172 also be carried out.

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| Sea Level | Gulf Stream | | Agulhas | | Kuroshio | |
|---------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> |
| CONV | 37 | 83 | 21 | 48 | 27 | 59 |
| SAR | 33 | 75 | 16 | 38 | 17 | 38 |
| Free12 | 360 | 360 | 366 | 366 | 341 | 341 |
| U | Gulf Stream | | Agulhas | | Kuroshio | |
| | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> |
| CONV | 280 | 454 | 198 | 301 | 279 | 412 |
| SAR | 257 | 431 | 182 | 278 | 214 | 316 |
| Free12 | 1027 | 1027 | 891 | 891 | 874 | 874 |
| V | Gulf Stream | | Agulhas | | Kuroshio | |
| | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> |
| CONV | 271 | 427 | 210 | 321 | 243 | 337 |
| SAR | 251 | 405 | 191 | 289 | 207 | 290 |
| Free12 | 855 | 855 | 970 | 970 | 826 | 826 |

220

221 Table 1: Mean Squared Errors in the analysis and 7-day forecast of the sea surface height
 222 and the zonal (U) and meridional (V) velocities for the Gulf Stream, the Agulhas Current and
 223 the Kuroshio regions (as defined by Jcommops, see www.jcommops.org). Units in cm^2 for
 224 SL and cm^2s^{-2} for U and V.

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226

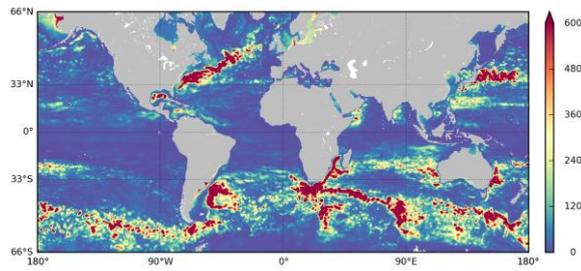
| Error reduction (in %) SAR versus CONV | Gulf Stream | | Agulhas | | Kuroshio | |
|---|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> | <i>Analysis</i> | <i>Forecast</i> |
| Sea Level | 13 | 9 | 22 | 22 | 37 | 35 |
| U | 8 | 5 | 8 | 7 | 23 | 23 |
| V | 7 | 5 | 9 | 10 | 15 | 14 |

227

228 Table 2: Reduction (in percentage) of Mean Squared Errors (MSEs) between SAR and
 229 CONV for Sea Level (SL), zonal (U) and meridional (V) velocity analysis forecast errors.
 230 Statistics are given for three WBC regions: Gulf Stream (GS), Kuroshio (KU) and Agulhas
 231 Current (AC).

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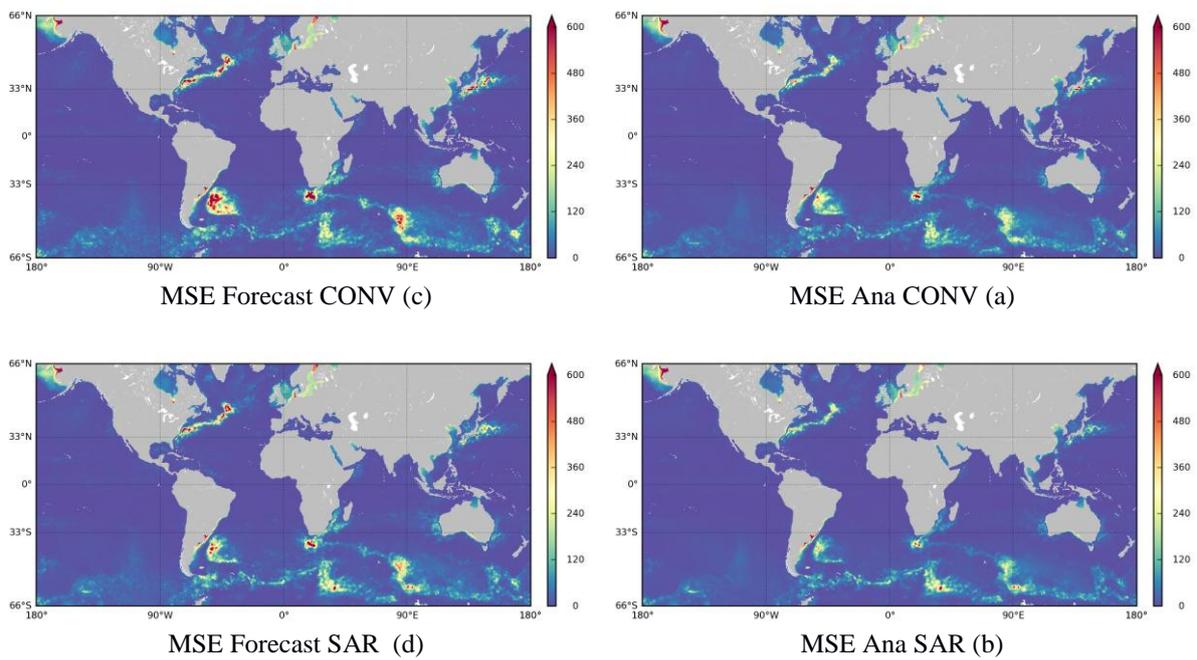


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Figure 1: Mean Squared Error for the Free Run. Units in cm^2 .

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Figure 2: Mean Squared Error for the CONV (a) and SAR (b) analyses and CONV (c) and SAR (d) forecasts for the global high resolution $1/12^\circ$ Mercator Ocean system. Units in cm^2 .

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