An assessment of recently released high-degree global geopotential models based on heterogeneous geodetic and ocean data

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Full paper

Keywords: Global geopotential model assessment, heterogeneous gravity data, ocean reanalysis data, mean dynamic topography, geostrophic current

DOI: https://doi.org/10.21203/rs.3.rs-83076/v1

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Abstract

The development of the state-of-the-art global geopotential model (GGM) broadens its applications in ocean science, which emphasizes the importance for model assessment. We validate the recently released high-degree GGMs over the South China Sea using geodetic observations and synthetic/ocean reanalysis data. The assessment against a recently conducted high resolution (~ 3 km) airborne gravimetric survey over the Paracel Islands shows that XGM2019e_2159 has the highest accuracy (~ 3.1 mGal). However, the comparison with airborne/shipborne data hardly discriminate the qualities of other GGMs that have or truncated to same degree and order. Whereas, the validation results of GGMs against synthetic/ocean data are not identical. XGM2019e_2159/XGM2019 has the best quality, and the accuracy of associated mean dynamic topography (MDT) is 2.5 cm, and this value changes to 7.1 cm/s (6.8 cm/s) when the zonal (meridian) geostrophic currents are assessed. In contrast, the assessments of other GGMs show that they have deteriorated accuracies compared to XGM2019e_2159/XGM2019; in particular, the widely used EGM2008 has the worst performance, and the accuracies of associated MDT and zonal (meridian) currents are reduced by 3.9 cm and 4.0 cm/s (5.5 cm/s), respectively, compared to results derived from XGM2019e_2159/XGM2019. These results suggest that the choice of GGM in oceanographic research is crucial, especially in coastal zones and regions that only fill-in data were used for GGM development. Moreover, the existing synthetic/ocean data may be served as an additional data source for global/regional gravity field assessment, which is especially useful in regions that lack of control data.

1. Introduction

The knowledge of global geopotential model (GGM) enables a wealth of applications in ocean science. For instance, the combination of GGM and satellite altimetry data allows to monitoring ocean state from space in a global scale (Bingham et al. 2011a; Knudsen et al. 2011; Volkov and Zlotnicki 2012; Rio et al. 2014), which is beneficial for studying coastal ecosystem processes and understanding heat and energy cycles as well as water exchanges over oceanic areas. Moreover, GGM facilitates the applications in height datum unification (e.g., Rummel 2012; Wu et al. 2016; Filmer et al. 2018), the study of oceanic lithosphere (e.g., Kaban et al. 1999; Rummel et al. 2002; Tenzer et al. 2015), and oil/gas explorations as well as other offshore activities (e.g., Braitenberg and Ebbing 2009; Rio et al. 2011; Sampietro 2015).

The wide applications of GGMs emphasize the improvement of these models in terms of accuracy and spatial resolution. The state-of-the-art spaceborne techniques, such as Gravity Recovery and Climate Experiment (GRACE) (e.g., Tapley et al. 2003, 2005) and Gravity Field and Steady-State Ocean Circulation Explorer (GOCE) (e.g., Pail et al. 2011), improve GGM at long wavelength with unprecedented accuracy and spatial resolution (Pail et al. 2010; Bruinsma et al. 2013; Brockman et al. 2014). However, the low resolution of satellite-only GGM derived from GRACE/GOCE data remains a barrier for ocean state study at medium- and short-wavelength bands, especially for wavelength shorter than ~ 100 km (e.g., Jayne 2006; Albertella et al. 2012). Satellite-only model can be enhanced by combining satellite altimetry measurement as well as airborne and surface (terrestrial and shipborne) gravity data, and the enhanced
solution is the so-called combined GGM. The combined GGM dramatically improve the accuracy and spatial resolution of global gravity field, and the widely used high-degree model like EGM2008/EIGEN-6C4 represents the global gravity field at a resolution of ~10 km (Pavlis et al. 2012, 2013; Förste et al. 2014). Consequently, the use of combined GGM allows to map the mean ocean circulation at more detailed scales than satellite-only model (e.g., Andersen et al. 2009; Vianna and Menezes 2010).

However, large uncertainties were found in combined GGM attempting to study the detailed mean ocean state at a regional scale, by a magnitude of decimeter level, e.g., see Farrell et al. (2012). These uncertainties are attributed to two main aspects. First, the noise in observation propagated into GGM, known as commission errors. The properties of commission errors are heterogeneous considering GGMs were computed with different data and data preprocessing strategies. Second, GGM lacks the ability to recover the short-wavelength signals beyond its maximal expansion degree, known as omission errors. The uncertainty in GGM may cause strong oscillations up to the magnitude of decimeter level, particularly in regions that only fill-in data were used in GGM development, and this remains a major obstacle to oceanographic studies and geophysical investigations (McAdoo et al. 2013; Skourup et al. 2017; Fecher et al. 2017). Moreover, combined GGM that computed by merging altimetry-derived data suffer from the coastal problem (e.g., Huang et al. 2017; Wu et al. 2019), since the altimeter data contain larger errors close to coast/island than in open seas, due to the severely contaminated waveforms and deteriorated geophysical corrections (Deng and Featherstone 2006; Andersen and Scharroo 2011; Abulaitijiang et al. 2015).

Whereas, the development of satellite altimetry leads to the improvement of marine gravity field, and the solution computed with recent altimetry data (e.g., CryoSat-2, Jason, SARAL/Altika) shows improved accuracy compared to the one derived from old altimeter data (e.g. Geosat and ERS-1), by a factor of 2 to 4 (Sandwell et al. 2013, 2014; Garcia et al. 2014). As a result, the GGMs that developed with recent altimeter data may have better quality. In addition, the accumulation of high-quality satellite altimetry/gravimetry data and the improved data preprocessing strategies as well as weighting schemes may further contribute to improve combined GGM (e.g., Fecher et al. 2017). Given the fact that GGM plays a more important role in ocean science than ever, it is crucial for evaluating the recently released GGM before they are used for oceanographic researches; however, little attention has been paid to model assessments over oceans. This study focuses on the assessment of recently released high-degree GGMs over a local area, where no locally surveyed gravity data have been combined for GGM development. This study provides an insight into the qualities of GGMs at other oceanic areas that only fill-in or altimetry-derived data were used for model development, e.g., most regions of Asia. For validation purpose, the traditionally used geodetic observations (e.g., heterogeneous gravity data) are incorporated (e.g., Arabelos et al. 2010; Hirt et al. 2011); besides, ocean reanalysis data are used, which were successfully applied to validate altimeter-derived mean dynamic topography (MDT) and height datum unification (Ophaug et al. 2015; Idžanović et al. 2017; Filmer et al. 2018).

2. Study Area And Data
The South China Sea (SCS) is selected as the study area, which extends from 0°N to 24°N latitude and 99°E to 121°E longitude. The SCS is a semi-enclosed marginal sea, and it connects with the East China Sea, the Pacific, and the Indian Ocean through the Taiwan Strait, the Luzon Strait, and the Strait of Malacca, respectively (e.g., Ho et al. 2000), see Fig. 1 and the background information displays the bathymetry derived from the General Bathymetric Chart of the Oceans (GEBCO) (Weatherall et al. 2015). The SCS is dominated by seasonal monsoons with active mesoscale eddies (Jia and Liu, 2004; Gan et al. 2006; Chen et al. 2011) and major water exchanges occurring at the Taiwan Strait, Luzon Strait, and Sunda Shelf (e.g., Hwang and Chen, 2000). The ocean state study over the SCS presents particular challenges due to the complex topography, monsoon winds, and high variability of local hydrological conditions (Wang et al. 2003; Chen et al. 2011; Xu et al. 2012). This offers a good opportunity to assess the performances of recently published GGMs. In the following, heterogeneous geodetic observations and synthetic/ocean reanalysis data are introduced for model assessment.

2.1 Global geopotential models

Several recently published high-degree GGMs, i.e., EGM2008, EIGEN-6C4, GECO, SGG-UGM-1, GOCO05c, XGM2016, XGM2019, and XGM2019e_2159 are selected, and the associated information is seen in Table 1. The reason for choosing the models above is that these models have relatively higher spatial resolutions and better accuracies compared to most of other GGMs, see the validation results against the globally distributed GPS/levelling data in http://icgem.gfz-potsdam.de/home. An investigation of error degree variances offers an insight into the error spectra of GGM, regarded as internal error estimates, and it supplies a rudimentary quality assessment (e.g., Pail et al. 2011). Figure 2 shows the degree-wise accumulated error degree variances in terms of geoid height, demonstrates the error up to the maximal degree of each model. EGM2008 with the degree and order (d/o) of 2190 has large cumulative error, and its error rises rapidly from degrees 30–220, and reaches ~ 7.3 cm by the degree of 220 and then increases slowly to 8.2 cm. Whereas, the accumulated errors of models that have similar expansion degree and order as EGM2008, i.e., GECO (d/o 2190), SGG-UGM-1 (d/o 2159), EIGEN-6C4 (d/o 2190), and XGM2019e_2159 (d/o 2190) are reduced to approximately 4.2, 2.7, 3.4, and 3.1 cm, respectively, which is a reduction by up to 67% compared to EGM2008's error. The prominent error in EGM2008 at the frequency bands between degree 30–220 is mainly due to the lack of GOCE data, and the other four models discussed above that developed with GOCE data have better quality in this frequency band, where GOCE data play a dominate role (e.g., Gruber et al. 2010). Moreover, the combination of updated surface gravity data (e.g., terrestrial and altimetry-derived data) may be the reason that EIGEN-6C4/XGM2019e_2159 has smaller error than EGM2008 at short-wavelength band. The comparison of GGMs that have lower truncated degrees, i.e., GOCO05C (d/o 720), XGM2016 (d/o 719), and XGM2019 (d/o 760), show that GOCO05C has the largest error, and its error increases dramatically after degree 170 and reaches 12.5 cm at degree of 720. Whereas, the cumulative error of XGM2016/XGM2019 is ~ 1.1/2.5 cm, which is smaller than that of GOCO05C.

It is noteworthy that the correlation of error coefficients of GGM is ignored when (accumulated) error degree variances are computed, and the GGM's uncertainties at a specific geographic location cannot be
estimated. While, a more rigorous way for internal error estimate is implemented through error propagation by using the full error variance-covariance matrix of spherical harmonic coefficients (e.g., Balmino 2009). However, considering the limited accessibility of full error variance-covariance matrix of high-degree GGM and the associated huge computation load, this method may be not feasible. Moreover, polar gap problem exists in GGMs developed with GOCE data, which especially affects the accuracies of zonal and near-zonal coefficients (Pail et al. 2011). In total, error degree variances only supply a global mean of internal error and cannot be regarded as the realistic error estimate.

Table 1 Description of global geopotential models
<table>
<thead>
<tr>
<th>Model</th>
<th>Expansion degree</th>
<th>Data used for model development</th>
<th>Remarks</th>
</tr>
</thead>
<tbody>
<tr>
<td>EGM2008</td>
<td>2190</td>
<td>GRACE data, terrestrial, altimetry-derived, and airborne gravity data</td>
<td>EGM2008 was computed without GOCE data. The DNSC07 data, which is the predecessor of DNSC08GRA, was used over the South China Sea (Pavlis et al. 2012, 2013)</td>
</tr>
<tr>
<td>GECO</td>
<td>2190</td>
<td>GOCE-only TIM R5 (d/o 250) and EGM2008</td>
<td>GECO was computed by combining GOCE-only TIM R5 model into EGM2008 (Gilardoni et al. 2015). GOCE-only TIM R5 was developed by using satellite-to-satellite tracking (SST) data and GOCE satellite gravity gradiometry (SGG) data over the entire period (Pail et al. 2011)</td>
</tr>
<tr>
<td>SGG-UGM-1</td>
<td>2159</td>
<td>GOCE SST and SGG data, and EGM2008</td>
<td>SGG-UGM-1 was developed by merging GOCE SST and SGG (d/o 220) into EGM2008 (Liang et al. 2018)</td>
</tr>
<tr>
<td>EIGEN-6C4</td>
<td>2190</td>
<td>LAGEOS, GRACE RL03, GOCE SGG data, and terrestrial data.</td>
<td>Terrestrial data were DTU12 geoid data at ocean and EGM2008 geoid height grid for continents (Förste et al. 2014)</td>
</tr>
<tr>
<td>GOCO05c</td>
<td>720</td>
<td>GOCO05S, and surface gravity anomaly data</td>
<td>GOCO05S (d/o 280) was developed by combining GRACE (ITGS-Grace2014s), GOCE, kinematic orbits, and satellite laser ranging (SLR) data. DTU13GRA-derived data were used in ocean (Fecher et al. 2016)</td>
</tr>
<tr>
<td>XGM2016</td>
<td>719</td>
<td>GOCO05S, and surface gravity</td>
<td>XGM2016 was computed by combining GOCO05S and a global 15′×15′ grid provided by National Geospatial-</td>
</tr>
<tr>
<td>Gravity Grid</td>
<td>Intelligence Agency (NGA) (Pail et al. 2018)</td>
<td></td>
<td></td>
</tr>
<tr>
<td>-------------</td>
<td>------------------------------------------</td>
<td></td>
<td></td>
</tr>
<tr>
<td>XGM2019/</td>
<td>XGM2019 and XGM2019e_2159 were developed using the same data, but the former was truncated to d/o 760. DTU13GRA-derived data were used over oceans (Zingerle et al. 2019)</td>
<td></td>
<td></td>
</tr>
<tr>
<td>GOCO06S,</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>XGM2019e_2159</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Surface</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Gravity Data</td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

### 2.2 Heterogeneous gravity data

#### 2.2.1 Airborne gravity disturbances

The First Geodetic Surveying Team of Ministry of Natural Resources of China conducted an airborne gravimetric survey in 2018, covered the Paracel Islands that located in the northwest SCS, see the enclosed area of the red rectangle in Fig. 1. This area ranges from 15.5°N to 18.2°N latitude and 111.0°E to 113.3°E longitude. The airborne survey was implemented with a GT-2A gravimeter, which contained 87 flights in total to complete 61594 line kilometres, and it covered ~270 kilometres in east-west direction and ~325 kilometres in north-south direction, see Fig. 3. The survey lines were north-south oriented and spaced at 1 km, while the control lines were east-west oriented and spaced at 5 km. The height of flight ranged from 739 to 847 m above the mean sea level.

The GT-2A gravimeter recorded the raw data at a frequency of 18.75 Hz, and the gravity data was calculated by subtracting the GPS-derived aircraft accelerations from the inertial accelerations, which were then corrected for the Eötvös effect and compensated for the off-level corrections. The derived gravity disturbances were filtered by a low pass filter with the cut-off frequency of 0.01 Hz to reduce high-frequency noise, which were then resampled to 2 Hz corresponding to the epoch of GPS measurements. The spatial resolution of the derived data after the filtering is ~3 km. The gravity data were referenced to the China Geodetic Coordinate System 2000 (CGCS 2000), and the geodetic coordinates were referenced to the GRS80 reference ellipsoid. Seven repeat lines were conducted for quality control, and the overall standard deviation (SD) of the variations of repeat lines was ~1.44 mGal. Moreover, the crossover measurements on survey/control lines offer an overview of the data quality, and the SD of the differences at crossovers was ~1.54 mGal, showing in good agreement with the statistics of repeat lines. This airborne survey includes ~1,854,900 point-wise data, which haven't been used for global/regional gravity field model modelling.

#### 2.2.2 Shipborne gravity anomalies

Marine gravity anomalies are retrieved from the National Geophysical Data Center (NGDC) from the National Centers for environmental information (NOAA), where worldwide shipborne gravity data collected during marine cruises from 1939 to present are available. The original data suffers from instrument errors, navigational errors, and biases stemming from the inconsistency of height systems as well as other systematic errors (e.g., Denker and Roland, 2005; Wu et al. 2017a). DTU17GRA is introduced
to ensure the quality of shipborne data. This model combined the 25 years of satellite altimetry data and included recent geodetic mission data from Jason-1, CryoSat-2, and SARAL/Altika. The comparison with independent data showed that DTU17GRA had improved precision compared with the previous versions of altimetry-derived gravity database developed at DTU space (Andersen and Knudsen, 2019). The erroneous data are firstly removed through a 3-sigma rule, i.e., data are identified as blunders if the difference between shipborne data and DTU17GRA-derived quantities are larger than three times of the SD of all the differences. Since NGDC-derived data originated from various epochs and systematic errors were likely to exist, we applied a crossover adjustment to reduce the systematic errors. The duplicate data were removed and we assumed a constant bias for each track. Note that not all the systematic errors can be estimated due to the lack of track information for some cruises. The SD of the differences at crossovers was estimated as 8.4 mGal, which is slightly smaller than the SD of the difference between DTU17GRA-derived data and shipborne data before crossover adjustment (~ 9.0 mGal).

### 2.3 Existing MDTs and Ocean models

The performances of GGMs are investigated for MDT and geostrophic current recovery, where an existing synthetic MDT and three ocean models are introduced for cross validation. The synthetic MDT is called CNES-CLS13MDT, and it covers the period of 1993–2012 at a resolution ~ 0.25° (30 km). This model was estimated using the CNES-CLS11 MSS data and EGM-DIR R4 (a satellite-only GGM) as the raw solution, which was then enhanced by in situ data to recover unresolved small-scale signals (Rio et al. 2011). Three ocean models, i.e., the Simple Ocean Data Assimilation, version 3 (SODA3) (Carton et al. 2018), the ocean reanalysis product of the European Centre for Medium-Range Weather Forecasts, version 5 (ECMWF ORAS5) (Zuo et al. 2017), and the Ocean Circulation and Climate Advanced Modeling Project (OCCAM) (Fox and Haines, 2003), are ocean reanalysis products provided with the field of dynamic topography. SODA3 was developed by ocean reanalysis with enhancements to model resolution, observation, forcing data, and the addition of active sea ice. This model maps the ocean state from 1980 to 2017, and it has a 0.25° horizontal resolution and 50 vertical levels. ORAS5 is a recently released ocean reanalysis product from the ECMWF and was developed based on Ocean ReAnalysis Pilot 5 (Zuo et al. 2017) using the same ocean and sea ice model and data assimilation method. ORAS5 has a horizontal resolution of 0.25° and 75 vertical levels, and it supplies monthly data from 1979 to 2018. The OCCAM MDT (0.5° horizontal resolution) maps the ocean state from 1993–2004, and was developed by a hydrodynamic model forced with wind stresses from the ECMWF, hydrographic data, and surface temperature (Fox and Haines, 2003).

### 3. Results And Discussion

#### 3.1 Validation against airborne/shipborne gravity data

The expansion degrees of EGM2008, EIGEN-6C4, GECO, SGG-UGM-1, and XGM2019e_2159 are higher than those of XGM2016, XGM2019, and GOC005c. For the sake of comparison, the computations with the former five GGMs are not only carried out up to the maximal degrees but also truncate to degree 720.
Table 2 shows the statistics of the difference between the airborne gravity data and GGM-synthesized quantities at the flight altitude. The statistics derived from XGM2016, GOCO05c, and GGMs that truncated to degree 720 are very close, the accuracies of which are all ~ 9.0 mGal. The GGMs truncate to d/o 720 cannot recover the spectral contents with the wavelengths shorter than ~ 30.4 km, and consequently, large inconsistencies are observed. Figure 4 demonstrates the discrepancy between GGM and airborne data (several representative models are displayed), and most significant misfits concentrate at regions close to islands that belong to the Paracel Islands (see Fig. 1). The reason may be due to the degraded quality of altimetry data used in developing GGMs, while airborne gravimetry does not suffer from the problem of waveform contamination as in satellite altimetry near coast/island and provides more accurate observations.

The expansion of GGMs with the degrees of 2190/2150 to the maximal degrees recover more small-scale signals and significantly reduce the discrepancies against the airborne data, i.e., by the magnitudes of ~ 5 mGal, compared to ones derived from the models truncated to 720, see Table 2. However, GGM with d/o of 2190 samples the gravity field at a resolution of ~ 10 km, which is inferior to the mean resolution of airborne data (~ 3 km), and the high-frequency signals have the wavelength shorter than 10 km are missing in GGMs. As a result, the difference between GGM and airborne data demonstrate as high-frequency features.

The mutual comparisons show that EGM2008, GECO, and SGG-UGM-1 have comparable precisions, i.e., ~ 4.0 mGal. GECO/SGG-UGM-1 that computed based on EGM2008 but with GOCE data does not demonstrate better result than EGM2008. Possible reason is that GOCE data mainly contribute to long-wavelength bands (degree 30–220), and the effects introduced by GOCE data are not prominent in terms of gravity disturbances since they are dominated by local short-wavelength features. EIGEN-6C4 does not show improved accuracy compared to EGM2008/GECO/SGG-UGM-1, although EIGEN-6C4 was computed based on the updated altimetry data, i.e., DTU10GRA data, which have improved accuracy compared to the altimetry data used in developing EGM2008 (Andersen et al. 2010). Whereas, XGM2019e_2159 has the best quality and its accuracy is ~ 3.2 mGal, and the discrepancy between XGM2019e_2159 and airborne data reduces dramatically close to islands, see Fig. 4. XGM2019e_2159 combined the recently released DTU13GRA data, which included the altimeter data from 1993–2013 with CryoSat-2 and Jason-1 data (Andersen et al. 2013), and the comparison with independent marine/airborne surveys showed that DTU13GRA had superior quality than previous versions, e.g., DNSC08GRA and DTU10GRA data (Andersen et al. 2013). Thus, the incorporation of recent high quality altimetry data may be the main reason that XGM2019e_2159 has better accuracy than GGMs that have similar expansion degrees.

Table 2. Statistics of the difference between the airborne gravity data and quantities computed from GGMs over Paracel Islands. (units: mGal)
The SD of the differences between the shipborne gravity data and quantities synthesized from GGMs with the degrees of 2190/2159 are ~ 9.4 mGal, see Table 3. However, the qualities of GGMs cannot be discriminated (see Fig. 5), and this is probably due to the limited accuracy of shipborne data, the quality of which may be questionable since some of them were collected decades ago without GPS navigation. Considering the restricted distribution of the airborne survey and suspicious quality of the shipborne data as well as the data voids of marine surveys in the western and northern SCS, the validation against local airborne/shipborne data cannot be treated as the representative error estimate of GGM over the South China Sea.

### Table 3. Statistics of the difference between the shipborne gravity measurements and data synthesized from GGMs over South China Sea

<table>
<thead>
<tr>
<th>Degree</th>
<th>Max</th>
<th>Min</th>
<th>Mean</th>
<th>SD</th>
</tr>
</thead>
<tbody>
<tr>
<td>EGM2008</td>
<td>720</td>
<td>53.2</td>
<td>-26.5</td>
<td>-0.9</td>
</tr>
<tr>
<td>EGM2008</td>
<td>2190</td>
<td>36.1</td>
<td>-18.2</td>
<td>-0.8</td>
</tr>
<tr>
<td>EIGEN-6C4</td>
<td>720</td>
<td>54.4</td>
<td>-25.2</td>
<td>-0.6</td>
</tr>
<tr>
<td>EIGEN-6C4</td>
<td>2190</td>
<td>35.4</td>
<td>-16.5</td>
<td>-0.4</td>
</tr>
<tr>
<td>GECO</td>
<td>720</td>
<td>54.0</td>
<td>-25.9</td>
<td>-0.7</td>
</tr>
<tr>
<td>GECO</td>
<td>2190</td>
<td>37.0</td>
<td>-17.2</td>
<td>-0.6</td>
</tr>
<tr>
<td>SGG-UGM-1</td>
<td>720</td>
<td>53.6</td>
<td>-25.1</td>
<td>-0.8</td>
</tr>
<tr>
<td>SGG-UGM-1</td>
<td>2159</td>
<td>36.6</td>
<td>-17.0</td>
<td>-0.7</td>
</tr>
<tr>
<td>XGM2019e_2159</td>
<td>720</td>
<td>53.5</td>
<td>-25.3</td>
<td>-0.7</td>
</tr>
<tr>
<td>XGM2019e_2159</td>
<td>2190</td>
<td>32.3</td>
<td>-28.9</td>
<td>-0.8</td>
</tr>
<tr>
<td>GOCO05c</td>
<td>720</td>
<td>53.4</td>
<td>-26.0</td>
<td>-0.8</td>
</tr>
<tr>
<td>XGM2016</td>
<td>719</td>
<td>53.4</td>
<td>-26.3</td>
<td>-0.7</td>
</tr>
<tr>
<td>XGM2019</td>
<td>760</td>
<td>53.7</td>
<td>-25.5</td>
<td>-0.7</td>
</tr>
<tr>
<td>XGM2019</td>
<td>720</td>
<td>53.7</td>
<td>-25.4</td>
<td>-0.7</td>
</tr>
</tbody>
</table>

3.2 Mean dynamic topography comparison

Before computing the geodetic MDT, we study the error information of different versions of MSS to choose an appropriate MSS. The interpolation errors of two recently released models, i.e., DTU15MSS (Andersen et al. 2015) and DTU18MSS (Andersen et al. 2018), are studied. Figure 6 shows the errors of MSS models, and the root mean square (RMS) of errors of DTU15MSS, and DTU18MSS are 1.95 and 1.78 cm, respectively, which indicates that DTU18MSS has better quality. We observe DTU18MSS has better quality along the southern coast of Guangdong in China, the eastern coast of Vietnam and Malaysia, and the western coast of Luzon and coastal areas along Paiawan in Philippines. The reason
that DTU18MSS outperforms DTU15MSS is mainly due to the incorporation more high-quality altimeter data and improved data pre-processing methods (Andersen et al. 2018).

MDT determined through a geodetic approach illustrates the departure of mean sea surface from geoid/quasi-geoid (e.g., Bingham et al. 2011a, 2014; Griesel et al. 2012). The raw geodetic MDT is computed as the difference between DTU18MSS and quasi-geoid computed from GGM truncated to its maximal degree. For cross validation, CNES-CLS13MDT, SODA3 MDT, ORAS5 MDT, and OCCAM MDT are introduced, where the former three models have a resolution of 0.25°, while the resolution of OCCAM is 0.5°. The raw geodetic MDT contains small-scale contents that cannot be resolved in synthetic/ocean data, and we apply a Gaussian filter with a correlation length of 60 km to the raw geodetic MDT for a spectrally consistent comparison with synthetic/ocean data. Different MDTs are referenced to various time periods, and we use the method suggested by Bingham and Haines (2006) to unify the time period, where all the models are adjusted to the geodetic MDT time period (1993–2018). The AVISO altimetric sea level anomaly (SLA) is used to standardize all the MDTs to the required period (e.g., Rio et al. 2011). The CNES-CLS13MDT is adjusted to the 1993–2018 period computed as CNES-CLS13MDT (93–2018) = CNES-CLS13MDT (93–2012) + MSLA (93–2018) – MSLA (93–2012), and MSLA denotes the mean value of SLA over a specific time period. For OCCAM MDT, a similar method is used to adjust the period to 1993–2018. For SODA3, we firstly compute the mean SODA MDT by averaging the monthly data from 1993 to 2017, which is then adjusted to 1993–2018 using the SLA data. For ORAS5, the associated MDT is retrieved by averaging the monthly data from 1993 to 2018.

Different MDTs generally have analogous structures, vary in a range of around 0.5 m, see Fig. 7, where the maximum value (up to 0.9 m) appears around the western coast of Cambodia; while, the minimum value (roughly 0.5 m) occurs in the northern SCS. However, prominent discrepancy between GGM-derived MDT and synthetic/ocean model is observed, particularly in northern SCS, by a magnitude up to 10 cm, where GGM-derived MDTs have smaller dynamic topography. The behaviors of MDTs computed from GGMs are heterogeneous, where the signals derived from EGM2008, GECO, SGG-UGM-1, and EIGEN-6C4 have more significant oscillations over the southern part, compared to ones calculated from other four GGMs. Moreover, the magnitude of MDT signals in synthetic/ocean model is not consistent, where CNES-CLS13MDT has smaller values over northern SCS, while ORAS5 has larger signals around Luzon Strait. Extreme values existing in GGM-derived MDT along the coast of Hainan, eastern coast of Vietnam, and western coast Brunei and Malaysia, are identified as outliers, due to the uncorrected errors in MSS and in quasi-geoid (e.g., Hipkin et al. 2004; Wu et al. 2017b, 2019). The remaining errors in MSS are mainly due to the orbit errors and errors in various range corrections (e.g., Andersen et al. 2009). However, these errors have been significantly reduced with the incorporation of recent altimeter data, even in coastal area, see Fig. 6. While, coastal quasi-geoid suffers from the scarcity of gravimetric data (e.g., shipborne/airborne data), degraded quality of altimetry-derived data, and bias/tilt among different data sets (e.g., Huang et al. 2017; Wu et al. 2019). The EGM2008 commission errors, composed of the low-degree errors estimated using a satellite-only model through error propagation and high-degree ones computed through a surface integral formula using surface gravity data (Pavlis et al. 2012), are seen in Appendix A. These errors reach...
decimetre level along the coastal regions, suggesting that the computed geodetic MDT prominently suffer from the errors in GGM, even though the application of filtering suppresses the high-frequency noises.

CNES-CLS13MDT and three ocean models are used as control data for model assessment, however, the lack of formal error of synthetic/ocean model remains an obstacle for deriving reliable results through an individual model. Thus, we not only provide the results computed from each synthetic/ocean model, but also give the statistics derived from the comparison with mean value of all synthetic/ocean models, which provide sufficient independence and redundancy to allow more robust comparison. Figure 8 demonstrates the discrepancy between MDT computed from GGM and mean of all synthetic/ocean data, where EGM2008-derived MDT has the largest oscillations, and the maximum/minimum value is 17.9/-19.7 cm, with a SD of 6.4 cm, see Table 4. The significant long-wavelength errors are observed in EGM2008-derived MDT, by a magnitude of cm level, and this is probably due to the lack of GOCE data, and these long-wavelength errors are reduced when GGM with GOCE data is applied, i.e., see the result of GECO-/XGM2019e_2159-derived MDT in Fig. 8. Moreover, coastal problem is extremely prominent in the MDT computed from EGM2008, especially around the coast of Hainan, Vietnam, Malaysia, and Brunei, where errors reach more than 10 cm. This is attributed to the use of lower quality of altimetry-derived data in EGM2008, and data voids occurred close to coast/island for the time when EGM2008 was computed, thus the quality of associated quasi-geoid become dubious. Moreover, since no locally surveyed gravity data (i.e., shipborne/airborne data) were involved in GGM computation, and altimetry data played a dominated role in gravity field recovery over SCS. In contrast, SGG-UGM-1-/GECO-derived MDT shows less variations and improved consistency against the ocean data, and the SD value reduces to 3.0/3.9 cm. The incorporation of GOCE is the main reason that these two MDTs show improved performance at long-wavelength band. Moreover, the application of GECO/SGG-UGM-1 substantially reduces the coastal errors, e.g., along the coast of Hainan and Vietnam. The mutual comparison shows GECO has better quality than SGG-UGM-1 in MDT modelling, where the different methods for model development and data merging/assimilation may account for these differences, though GECO and SGG-UGM-1 are both developed by combining EGM2008 and GOCE data. EIGEN-6C4 has comparable accuracy as GECO in MDT modelling, i.e., ~ 3.1 cm, and coastal errors in EIGEN-6C4-derived MDT are reduced compared to the one derived from GECO/SGG-UGM-1. EIGEN-6C4 was also computed by combining GRACE, GOCE, and EGM2008 data, but it included DTU12 geoid data in ocean and this may be the main reason that EIGEN-6C4 has better performance than EGM2008/GECO/SGG-UGM-1 in coastal MDT computation. We also notice that more small-scale contents propagate into EIGEN-6C4-derived MDT, particularly in the southern SCS, indicating that the Gaussian filter may not be an optimal way to make a spectrally consistent fusion of MSS and GGM. The comparisons with local shipborne/airborne data show that these GGMs discussed above have identical qualities; moreover, these models typically show comparable accuracies when validated against GPS/levelling data, e.g., see Featherstone et al. (2018) and Wu et al. (2018). However, this is not true when comparing with synthetic/ocean data, where the accuracies of different models are heterogeneous.

The use of XGM2019e_2159 leads to a more consistent MDT with synthetic/ocean data, demonstrates less variations compared to the MDTs described above. The error of MDT calculated from
XGM2019e_2159 is ~ 2.5 cm, with a reduction of ~ 0.5/0.6/1.5/3.0 cm, compared to MDT computed from GECO/EIGEN-6C4/SGG-UGM-1/EGM2008. The improved performance for XGM2019e_2159 is attributed to the combination of recent satellite gravimetry and altimetry data, where XGM2019e_2159 combined GOCO06s (a recently released GRACE/GOCE satellite-only model) at long wavelength and DTU13GRA data at short-wavelength. DTU13GRA has better quality than the previous versions, such as DTU10GRA, and the coastal gravity field in XGM2019e_2159 was improved accordingly. This result is commensurate with the validation against airborne data, where XGM2019e_2159 has the best quality.

For the MDTs computed with GGMs that have lower expansion degree and order, GOCO05c-derived MDT has an accuracy of 2.9 cm, while, the accuracy of XGM2016-/XGM2019-derived MDT is slightly better, by a magnitude of 0.3/0.4 cm. XGM2016 was developed using the same methodology as for GOCO05c, but the input surface data were heterogeneous, where GOCO05c used DTU13GRA data, while XGM2016 combined NGA gridded data at ocean. XGM2019- and XGM2019e_2159-derived MDT have almost identical features, since XGM2019 was computed using the same input data and modelling method as XGM2019e_2159, but truncated to d/o 760.

The comparison of each synthetic/ocean model and GGM-derived MDT show that CNES-CLS13MDT/SODA has smaller discrepancy against the geodetic MDTs, compared to ORAS5/OCCAM. This indicates that geodetic MDT may also be used for synthetic/ocean model assessment, particularly in regions lack of in situ data (e.g., buoys and hydrological profiles). However, it should be emphasized that these results are rudimentary ones since the error information of ocean model is not available and no in situ data over SCS can be used for evaluating synthetic/ocean model and geodetic MDT.

Table 4. The standard deviation of the difference between GGM-derived MDT and synthetic/ocean model

<table>
<thead>
<tr>
<th>Geodetic MDT minus synthetic/ocean model</th>
<th>GECO</th>
<th>SODA</th>
<th>ORAS5</th>
<th>OCCAM</th>
<th>Mean of all synthetic/ocean models</th>
</tr>
</thead>
<tbody>
<tr>
<td>EGM2008</td>
<td>6.0</td>
<td>6.4</td>
<td>7.3</td>
<td>6.8</td>
<td>6.4</td>
</tr>
<tr>
<td>GECO</td>
<td>2.9</td>
<td>3.0</td>
<td>3.7</td>
<td>4.4</td>
<td>3.3</td>
</tr>
<tr>
<td>SGG-UGM-1</td>
<td>3.7</td>
<td>3.7</td>
<td>4.5</td>
<td>5.1</td>
<td>4.1</td>
</tr>
<tr>
<td>EIGEN-6C4</td>
<td>3.0</td>
<td>3.0</td>
<td>3.8</td>
<td>4.4</td>
<td>3.3</td>
</tr>
<tr>
<td>XGM2019e_2159</td>
<td>2.4</td>
<td>2.4</td>
<td>3.0</td>
<td>3.7</td>
<td>2.5</td>
</tr>
<tr>
<td>GOCO05c</td>
<td>2.5</td>
<td>2.7</td>
<td>3.4</td>
<td>3.9</td>
<td>2.9</td>
</tr>
<tr>
<td>XGM2016</td>
<td>2.4</td>
<td>2.4</td>
<td>3.2</td>
<td>3.8</td>
<td>2.6</td>
</tr>
<tr>
<td>XGM2019</td>
<td>2.3</td>
<td>2.4</td>
<td>3.1</td>
<td>3.7</td>
<td>2.5</td>
</tr>
</tbody>
</table>

In addition, the geodetic MDT’s behaviour along zonal/meridian profile is investigated. Figure 9 (a) shows the zonal mean of the misfit between geodetic MDT and the mean of all synthetic/ocean data. EGM2008-derived MDT demonstrates strong oscillations and spike-like errors appear along this profile, by the magnitude up to 5 cm. MDT derived from SGG-UGM-1/EIGEN-6C4 has slightly better performances, however, substantial spike errors are still prominent; for instance, MDT computed from SGG-UGM-1 has strong variations from 18°N to 21°N, where this profile comes cross region around Hainan. This corresponds to the result that MDT derived from SGG-UGM-1 has large errors around Hainan because of coastal problem. By contrast, MDTs computed from other GGMs show improved quality, and almost no apparent spikes are found. XGM2019-/XGM2019e_2159-derived MDT has the smallest variation, and the discrepancy against the synthetic/ocean data is within 3 cm. The errors in MDTs are reduced along the
meridian profile compared to the ones along the zonal profile, see Fig. 9 (b), and this is due to the configuration of satellite orbits, which affects the error structure of GGM-derived geoid heights. As orbit of GRACE/GOCE is almost south-north oriented, the along-track data sampling is much denser than that in the across-track direction; and consequently, larger errors were found in east-west direction than in north-south direction (e.g., Balmino 2009; Bingham et al. 2011b). Similar validation results are concluded along the meridian profile as ones derived from the zonal profile, where the signals calculated from XGM2019/XGM2019e_2159 has the best quality.

3.3 Geostrophic ocean currents comparison

The performances of GGMs are further validated in terms of geostrophic currents. Apart from the synthetic/ocean data shown in Sect. 2.3, another reanalysis dataset derived from an ocean data assimilation system in Asia, the Indian Ocean, and the western Pacific Ocean (AIPO), known as AIPOcean (Yan et al. 2015), is introduced. AIPOcean data was developed based on the ensemble optimal interpolation (EnOI) method, where various types of observations including SLA from AVISO, sea surface temperature and salinity profiles, Global Temperature-Salinity Profile Program, and Array for Real-time Geostrophic Oceanography and Arctic Synoptic Basin-wide Oceanography, were assimilated. AIPOcean data contains daily-averaged three dimensional temperature, salinity, ocean currents from January 1, 1993 to December 31, 2006, with a horizontal resolution of 0.25° and 22 vertical levels. The comparison of AIPOcean data with independent observations and other reanalysis products shows that the quality of AIPOcean data was well controlled, which generally provide the realistic structures of ocean variability in AIPO (Yan et al. 2015).

AIPOcean data map ocean currents from 1993 to 2006 with a horizontal resolution of 0.25°, and synthetic/geodetic MDT is adjusted to this time period based on AVISO altimetric SLA data, and then the geostrophic velocities are computed. Whereas, surface currents provided in ocean model are retrieved and averaged to map the signals over the 1993–2006 time period. Figure 10 shows the zonal velocities computed from GGMs and synthetic/ocean data, which generally reconstruct the surface circulation of SCS. For instance, the blue strip-like features over the northern of SCS that passes through the southern of Hainan is the South China Sea Warm Current (SCSWC), playing a key role in distribution of mass, energy, and heat balances over the northern SCS (Hsueh and Zhong 2004; Chiang et al. 2008; Yang et al. 2008). Moreover, the yellow/red signals along Guangdong coast are known as Guangdong Coastal Current (GCC) (Hu et al. 2000; Gu et al. 2012), however, the structures of GCC are not identical in different models. For instance, the intensity of GCC in CNES-CLS13MDT/SODA is not as strong as in ORAS5/OCCAM/AIPO.

The detailed features of zonal velocities derived from GGMs and ocean data are heterogeneous. For signals computed from GGMs, more scattered structures are observed in EGM2008-derived currents, displaying as prominent long-wavelength patterns, especially in southern SCS. However, these large-scale contents cannot be treated as real ocean-circulation signals, since the long-wavelength content of EGM2008 is questionable due to the lack of GOCE data. In contrast, the velocities computed from other
GGMs show less variations and smoother patterns. It is noticeable that GGM notoriously suffers from the coastal problem, where the errors in MDT are magnified in ocean current computation, since the geostrophic velocities are computed as the gradients of MDT. However, the coastal problem can be mitigated by using the recent altimeter data (e.g., Ophaug et al. 2015; Idžanović et al. 2017) and airborne gravimetric survey (e.g., Hwang et al. 2006; Wu et al. 2019).

CNES-CLS13MDT and SODA demonstrate smoother structures than other ocean models over the southern SCS, and significant small-scale structures are observed in CNES-CLS13MDT over the northern part. While, ORAS5, OCCAM, and AIPO have more intense features over the Guangdong coast, compared to CNES-CLS13MDT/SODA. Different methods and input data for model development are the main reasons for these differences. For example, CNES-CLS13MDT is a synthetic model, estimated through a geodetic method as a raw solution, and then enhanced by in situ data to recover unresolved small-scale contents. While, ocean models are the ocean reanalysis products developed by combining ocean state data, hydrographic data, surface temperature, and so on.

Figure 11 demonstrates the discrepancy between the zonal geostrophic currents computed from GGMs and the mean of all synthetic/ocean data, and the associated statistics are given in Table 5. The performances of GGMs are heterogeneous, and EGM2008-derived zonal velocities have largest oscillations, where the SD of the inconsistency against the mean of synthetic/ocean data is 11.1 cm/s. The prominent discrepancy occurs over the southern of SCS and along coast of Vietnam, Malaysia and Paiawan, by a magnitude up to 20 cm/s. These inconsistencies demonstrate as significant long-wavelength features, which are attributed to the lack of GOCE data in EGM2008. The comparison of EGM2008 and other models that have similar resolutions (i.e., GECO, SGG-UGM-1, EIGEN-6C4, and XGM2019e_2159) shows that these models have improved quality, and the errors are reduced to 7.1 ~ 7.9 cm/s. The combination of GOCE data and updated altimetry-derived data are the main reasons that these models have superior quality. The coastal errors of ocean currents computed from these four models are significantly reduced, especially in southern coast of Guangdong, north-eastern and south-eastern coast of Vietnam, western coast of Malaysia and Paiawan. The mutual comparison shows that GECO-/XGM2019e_2159-derived zonal velocities have better qualities than ones computed from SGG-UGM-1/EIGEN-6C4, where the accuracy of zonal currents computed from GECO/XGM2019e_2159 is 7.1 cm/s, while the accuracy of signals derived from SGG-UGM-1/EIGEN-6C4 is reduced to 7.7/7.9 cm/s. This is not consistent with the results derived from MDT comparison, where GECO-derived MDT has lower quality than MDT computed from XGM2019e_2159, but with comparable quality as EIGEN-6C4-derived signals. The accuracies of zonal velocities computed from GOCO05c, XGM2016, and XGM2019 are 7.4, 7.4, and 7.1 cm/s, respectively, where XGM2019-derived signals shows better performance. This is identical with the results derived from MDT comparison, where XGM2019 and XGM2019e_2159 demonstrate identical performances in MDT computation.

The comparison of individual synthetic/ocean model with GGM-derived velocities show that CNES-CLS13MDT/SODA has smaller discrepancy against geostrophic currents computed from GGM, and the SD of the difference between CNES-CLS13MDT/SODA-derived velocities and the mean of signals
computed from all GGMs is 7.2/7.0 cm/s. Whereas, this value increases to 7.8 cm/s when AIPO is compared. ORAS5/OCCAM displays largest misfits, and the SD value increases to 8.5/8.4 cm/s. However, the scarcity of in situ data and lack of accuracy information make it difficult to derive a realistic error estimate of ocean model.

Table 5 The standard deviation of the difference between the zonal velocities synthesized from GGMs and those derived from synthetic/ocean data

<table>
<thead>
<tr>
<th>MDT minus synthetic/ocean model</th>
<th>CNES-CLS13MDT</th>
<th>SODA</th>
<th>ORAS5</th>
<th>OCCAM</th>
<th>AIPO</th>
<th>Mean of all synthetic/ocean models</th>
</tr>
</thead>
<tbody>
<tr>
<td>EGM2008</td>
<td>11.4</td>
<td>11.2</td>
<td>13.2</td>
<td>12.6</td>
<td>11.8</td>
<td>11.1</td>
</tr>
<tr>
<td>GECO</td>
<td>7.6</td>
<td>7.5</td>
<td>8.9</td>
<td>8.5</td>
<td>8.3</td>
<td>7.1</td>
</tr>
<tr>
<td>SGG-UGM-1</td>
<td>8.0</td>
<td>8.0</td>
<td>9.6</td>
<td>9.1</td>
<td>8.9</td>
<td>7.7</td>
</tr>
<tr>
<td>EIGEN-6C4</td>
<td>8.0</td>
<td>8.2</td>
<td>9.5</td>
<td>9.0</td>
<td>9.0</td>
<td>7.9</td>
</tr>
<tr>
<td>XGM2019e_2159</td>
<td>7.7</td>
<td>7.4</td>
<td>9.0</td>
<td>8.2</td>
<td>8.3</td>
<td>7.1</td>
</tr>
<tr>
<td>GOCO05c</td>
<td>8.1</td>
<td>7.7</td>
<td>9.2</td>
<td>8.6</td>
<td>8.5</td>
<td>7.4</td>
</tr>
<tr>
<td>XGM2016</td>
<td>7.8</td>
<td>7.7</td>
<td>9.1</td>
<td>8.5</td>
<td>8.5</td>
<td>7.4</td>
</tr>
<tr>
<td>XGM2019</td>
<td>7.7</td>
<td>7.4</td>
<td>9.0</td>
<td>8.3</td>
<td>8.3</td>
<td>7.1</td>
</tr>
</tbody>
</table>

The meridian velocities synthesized from GGMs and synthetic/ocean data are seen in Fig. 12, representing the north-southward ocean circulation of SCS. For instance, a southward along-shelf current is seen along the coast of Vietnam, see the blue stripe-like features, which is mainly caused by local monsoon system (e.g., Hu et al. 2000; Chen et al. 2012). In addition, the red signals cross the Luzon Strait are line with the Kuroshio intrusion, e.g., see Hu et al. (2000) and Xue et al. (2004). The validation results are seen in Fig. 13 and Table 6, where EGM2008 still has the worst performances, the error of the associated velocities reaches 12.3 cm/s. Whereas, the corresponding errors are reduced to 7.6, 8.0, 8.6, and 6.8 cm/s, respectively, when the velocities derived from GECO, SGG-UGM-1, EIGEN-6C4, and XGM2019e_2159 are assessed. These results are not identical as ones derived from the zonal velocities. The accuracy of meridian currents derived from GOCO05c, XGM2016, and XGM2019 is 7.7, 7.3, and 6.9 cm/s, respectively, where XGM2019-derived velocities also have better performance.

Table 6 The standard deviation of the difference between the meridian velocities synthesized from GGMs and those derived from synthetic/ocean models

<table>
<thead>
<tr>
<th>MDT minus synthetic/ocean model</th>
<th>CNES-CLS13MDT</th>
<th>SODA</th>
<th>ORAS5</th>
<th>OCCAM</th>
<th>AIPO</th>
<th>Mean of all synthetic/ocean models</th>
</tr>
</thead>
<tbody>
<tr>
<td>EGM2008</td>
<td>13.2</td>
<td>12.5</td>
<td>13.6</td>
<td>13.8</td>
<td>12.7</td>
<td>12.3</td>
</tr>
<tr>
<td>EIGEN-6C4</td>
<td>9.7</td>
<td>9.0</td>
<td>10.4</td>
<td>10.0</td>
<td>9.1</td>
<td>8.6</td>
</tr>
<tr>
<td>GECO</td>
<td>8.6</td>
<td>7.8</td>
<td>9.6</td>
<td>9.4</td>
<td>9.0</td>
<td>8.4</td>
</tr>
<tr>
<td>SGG-UGM-1</td>
<td>9.2</td>
<td>8.1</td>
<td>9.6</td>
<td>9.7</td>
<td>8.7</td>
<td>8.0</td>
</tr>
<tr>
<td>XGM2019e_2159</td>
<td>7.9</td>
<td>7.2</td>
<td>9.0</td>
<td>8.3</td>
<td>8.0</td>
<td>6.8</td>
</tr>
<tr>
<td>GOCO05c</td>
<td>8.8</td>
<td>8.1</td>
<td>9.8</td>
<td>9.9</td>
<td>8.9</td>
<td>8.4</td>
</tr>
<tr>
<td>XGM2016</td>
<td>8.1</td>
<td>7.7</td>
<td>9.4</td>
<td>8.6</td>
<td>8.3</td>
<td>7.3</td>
</tr>
<tr>
<td>XGM2019</td>
<td>7.8</td>
<td>7.2</td>
<td>9.0</td>
<td>8.3</td>
<td>8.0</td>
<td>6.9</td>
</tr>
</tbody>
</table>

4. Conclusions

Wide range of applications of GGMs in ocean science emphasizes the importance for model assessment. We assess the performances of recently released high-degree GGMs over the South China Sea, where local geodetic data (i.e., airborne/shipborne gravity data) and synthetic/ocean reanalysis data are served as the control data.
A comparison with a recently conducted high resolution (~ 3 km) airborne gravimetric survey over the Paracel Islands shows that XGM2019e_2159 has the best quality, the accuracy of which is ~ 3.1 mGal. While, the accuracies of EGM2008, GECO, SGG-UGM-1, and EIGEN-6C4 decrease to ~ 4.0 mGal, however, the qualities of these models cannot be discriminated. The errors of GGMs that have or truncated to d/o 720 increase to ~ 9.0 mGal, since the small-scale signals cannot be recovered by GGM that truncated to lower d/o. In contrast, the shipborne gravity data that retrieved from NGDC cannot discriminate the accuracies of GGMs that have same expansion degrees, due to the limited data precision.

The assessment against synthetic/ocean data show that the accuracies of GGMs are heterogeneous, though the signals computed from GGMs generally reconstruct the surface circulation features of SCS. XGM2019e_2159 has the best quality, showing in agreement with the validation results against airborne data. The SD of the difference between XGM2019-/XGM2019e_2159-derived MDT and the mean of all synthetic/ocean data is ~ 2.5 cm, and this value changes to 7.1 cm/s (6.8 cm/s) when the zonal (meridian) currents are assessed. The assessments of EIGEN-6C4, GECO, SGG-UGM-1, GOC005c, and XGM2016 show that they have deteriorated qualities than XGM2019e_2159/XGM2019, by magnitudes ranging from 0.1 to 1.6 cm in terms of MDT, and 0.4 to 1.8 cm/s when geostrophic velocities are evaluated. EGM2008-derived signals demonstrate the largest oscillations, where the accuracy of associated MDT reduces to 6.4 cm, and this value decreases to 11.1 cm/s (12.3 cm/s) when the zonal (meridian) velocities are assessed. The lack of GOCE data is the main reason for prominent long-wavelength errors presenting in oceanic signals calculated from EGM2008. Moreover, EGM2008-derived contents severely suffer from the coastal problem, which is mainly attributed to the lack of high-quality altimetry-derived data for the time this model was developed.

Numerical results suggest that the choice of GGM in ocean state study is crucial, particularly in regions that only fill-in data were used for model development, even though different GGMs may show comparable results when compared with geodetic data (e.g., airborne/shipborne data and GPS/levelling data). Moreover, synthetic/ocean data are capable of distinguishing GGMs at the frequency band that have the wavelengths longer that ~ 30 km, indicating that these data may be served as an additional data source for validating global/regional gravity field model at oceans.

Abbreviations

GGM: global geopotential model; MDT: mean dynamic topography; GRACE: Gravity Field and Climate Experiment; GOCE: Gravity Field and Steady-State Ocean Circulation Explorer; SCS: South China Sea; GEBCO: General Bathymetric Chart of the Oceans; EIGEN: European Improved Gravity Model of the Earth by New Techniques; d/o: degree and order; GPS: Global Positioning System; NGDC: National Geophysical Data Center; NOAA: National Centers for environmental information; SODA: Simple Ocean Data Assimilation; ECMWF: European Centre for Medium-Range Weather Forecasts; OCCAM: Ocean Circulation and Climate Advanced Modeling.

Declarations
Acknowledgments

The authors gratefully acknowledge the First Geodetic Surveying Brigade of the Ministry of Natural Resources of China for kindly providing the airborne gravity data.

Authors' contributions

YW initiated the study, designed the numerical experiments and wrote the manuscript. AA, XH, ZL, and HW provided the data and gave the beneficial suggestions. YW, AA, and BZ finalized the manuscript. All authors read and approved the final manuscript.

Funding

This study was supported by the National Natural Science Foundation of China (No. 42004008), the Natural Science Foundation of Jiangsu Province, China (No. BK20190498), the Fundamental Research Funds for the Central Universities (No. B200202019), and the Beijing Key Laboratory of Urban Spatial Information Engineering (No. 2020213).

Availability of data and materials


Competing interests

The authors declare that they have no competing interests.

References


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Figure 1

The study area and the associated bathymetry. The region enclosed in the red rectangle represents the surveyed area of an airborne gravimetry over the Paracel Islands. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.
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Difference between shipborne gravity data retrieved from NGDC and quantities synthesized from (a) GOCC005c (d/o 720), (b) XGM2019 (d/o 760), (c) EGM2008 (d/o 2190), (d) EIGEN-6C4 (d/o 2190), and (e) XGM2019e_2159 (d/o 2190) over South China Sea. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.
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Difference between MDT computed from (a) EGM2008, (b) GECO, (c) SGG-UGM-1, (d) EIGEN-6C4, (e) XGM2019e_2159, (f) GOCO05c, (g) XGM2016, (h) XGM2019 and mean value of all synthetic/ocean models. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of
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The zonal (a) and meridian (b) mean of the misfit between GGM-derived MDT and mean of all synthetic/ocean models.
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Difference between the zonal velocities computed from (a) MDT_EGM2008, (b) MDT_GECO, (c) MDT_SGG-UGM-1, (d) MDT_EIGEN-6C4, (e) MDT_XGM2019e_2159, (f) MDT_GOCO05c, (g) MDT_XGM2016, (h) MDT_XGM2019 and the mean of all synthetic/ocean data. Note: The designations
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Figure 12
Meridian geostrophic currents computed from (a) EGM2008, (b) GECO, (c) SGG-UGM-1, (d) EIGEN-6C4, (e) XGM2019_2159, (f) GOCO05c, (g) XGM2016, (h) XGM2019, (i) CNES-CLS13MDT, (j) SODA, (k) ORAS5, (l) OCCAM, and (m) AIPO. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.
Difference between the meridian velocities computed from (a) MDT_EGM2008, (b) MDT_GECO, (c) MDT_SGG-UGM-1, (d) MDT_EIGEN-6C4, (e) MDT_XGM2019e_2159, (f) MDT_GOCO05c, (g) MDT_XGM2016, (h) MDT_XGM2019 and the mean of all synthetic/ocean models. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.

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