# A near-global climatology of oceanic coherent eddies

Josué Martínez-Moreno[1], Andrew McC. Hogg[1], and Matthew H. England[2]

[1]Australian National University
[2]University of New South Wales

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## Abstract

Ocean eddies influence regional and global climate through mixing and transport of heat and properties. One of the most recognizable and ubiquitous feature of oceanic eddies are coherent vortices with spatial scales of tens to hundreds of kilometers, frequently referred as "mesoscale eddies". Coherent mesoscale eddies are known to transport properties across the ocean and to locally affect near-surface wind, cloud properties, and rainfall patterns. Although coherent eddies are ubiquitous, their climatology, seasonality, and long-term temporal evolution remains poorly understood. Here, we examine the kinetic energy contained by coherent eddies and present the seasonal, interannual and long-term variability using satellite observations between 1993 to 2019. A total of $\sim$37 million coherent eddies are detected in this analysis. Around 50% of the kinetic energy contained by ocean eddies corresponds to coherent eddies. Additionally, a strong seasonal cycle is observed, with a 3-6 months lag between the wind forcing and the response of the coherent eddy field. The seasonality of the number of coherent eddies and their amplitude reveals that the number of coherent eddies responds faster to the forcing ($\sim$3 months), than the coherent eddy amplitude (which lags by $\sim$6 months). This seasonal cycle is spatially variable, so we also analyze their climatology in key oceanic regions. Our analysis highlights the relative importance of the coherent eddy field in the ocean kinetic energy budget, implies a strong response of the eddy number and eddy amplitude to forcing at different time-scales, and showcases the seasonality, and multidecadal trends of coherent eddy properties.

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# A near-global climatology of oceanic coherent eddies

**Josué Martínez-Moreno[1], Andrew McC. Hogg[1], and Matthew H. England[2]**

[1]Research School of Earth Science and ARC Center of Excellence for Climate Extremes, Australian National University, Canberra, Australia

[2]Climate Change Research Centre (CCRC), UNSW Australia, Sydney NSW, Australia

**Key Points:**

- Coherent eddies contain around 50% of the total surface ocean kinetic energy budget.
- Seasonal cycle of the number of coherent eddies and the coherent eddy amplitude reveals a 3-6 month lag to wind forcing.
- The seasonal lag between the number and the amplitude of coherent eddies suggests a role for the inverse cascade.

Corresponding author: Josué Martínez-Moreno, `josue.martinezmoreno@anu.edu.au`

## Abstract

Ocean eddies influence regional and global climate through mixing and transport of heat and properties. One of the most recognizable and ubiquitous feature of oceanic eddies are coherent vortices with spatial scales of tens to hundreds of kilometers, frequently referred as "mesoscale eddies". Coherent mesoscale eddies are known to transport properties across the ocean and to locally affect near-surface wind, cloud properties, and rainfall patterns. Although coherent eddies are ubiquitous, their climatology, seasonality, and long-term temporal evolution remains poorly understood. Here, we examine the kinetic energy contained by coherent eddies and present the seasonal, interannual and long-term variability using satellite observations between 1993 to 2019. A total of $\sim$37 million coherent eddies are detected in this analysis. Around 50% of the kinetic energy contained by ocean eddies corresponds to coherent eddies. Additionally, a strong seasonal cycle is observed, with a 3–6 months lag between the wind forcing and the response of the coherent eddy field. The seasonality of the number of coherent eddies and their amplitude reveals that the number of coherent eddies responds faster to the forcing ($\sim$3 months), than the coherent eddy amplitude (which lags by $\sim$6 months). This seasonal cycle is spatially variable, so we also analyze their climatology in key oceanic regions. Our analysis highlights the relative importance of the coherent eddy field in the ocean kinetic energy budget, implies a strong response of the eddy number and eddy amplitude to forcing at different time-scales, and showcases the seasonality, and multidecadal trends of coherent eddy properties.



## Plain language summary

Coherent eddies are the most common feature of ocean variability observable from satellites. They are crucial in ocean dynamics as they can transport properties over long distances and interact with the atmosphere. Our study investigates the seasonal, interannual, and long-term changes in the abundance and intensity of coherent eddies, by automatically identifying individual eddies over the available satellite altimeter record. The seasonal cycle suggests a transition from numerous, smaller, and weaker coherent eddies, to fewer and larger, and stronger coherent eddies over the season. In addition, a long-term adjustment of the coherent eddy field is identified with possible links to long-term changes in the climate system.

# 1 Introduction

Mesoscale ocean variability with spatial scales of tens to hundreds of kilometers is comprised of processes such as vortices, waves, and jets (Ferrari & Wunsch, 2009; Fu et al., 2010). These mesoscale processes are highly energetic, and they play a crucial role in the transport of heat, salt, momentum, and other tracers through the ocean (Wunsch & Ferrari, 2004; Wyrtki et al., 1976; Gill et al., 1974). One of the most recognizable and abundant ocean processes observable from space are mesoscale vortices. Although mesoscale vortices are commonly referred to in the literature as "mesoscale eddies", this term is also often used to describe the total mesoscale ocean variability (the time-varying component of the mesoscale flow), thus, to avoid ambiguity we will refer to mesoscale vortices as *coherent eddies*. Coherent eddies are abundant and energetic; they are essential to ocean dynamics as concluded by many previous studies (Hogg & Blundell, 2006; Siegel et al., 2011; Beron-Vera et al., 2013; Frenger et al., 2013, 2015; Pilo et al., 2015; Schubert et al., 2019; Patel et al., 2020).

Coherent eddies are quasi-circular geostrophic currents. According to their rotational direction and the sign of the Coriolis parameter, the sea surface height anomaly within a coherent eddy can have a negative or positive sea surface height anomaly (cold-core and warm-core coherent eddies, respectively). This characteristic sea surface height signature of coherent eddies has been utilized to identify and track coherent eddies from satellite altimetry (e.g., Chelton et al., 2007; Faghmous et al., 2015; Ashkezari et al., 2016; Martínez-Moreno et al., 2019; Cui et al., 2020). Automated identification algorithms of coherent eddies have revealed their ubiquity in the oceans, with a predominant influence at hotspots of eddy activity such as in boundary current extensions and the Antarctic Circumpolar Current. In these regions, it has been estimated that coherent eddies contribute around 40–50% of the net mesoscale kinetic energy (Chelton et al., 2011) and thus a significant fraction of the total kinetic energy (Ferrari & Wunsch, 2009). Although this estimate showcases the importance of the mesoscale coherent eddy field, the energy contained by coherent eddies was estimated by extracting the total geostrophic velocity within the radius of each detected coherent eddy; thus, it is possible that this estimate may contain energy from other processes. Here we extend on this past work by reconstructing the surface imprint of coherent eddies using a new eddy tracking algorithm and using the latest available satellite record.

There is broad consensus that mesoscale eddy kinetic energy has a pronounced seasonal variability (Qiu, 1999; Qiu & Chen, 2004; Kang & Curchitser, 2017; Uchida et al., 2017). Several hypotheses have been proposed to explain this seasonality including: seasonal variations of atmospheric forcing (Sasaki et al., 2014), seasonality of the mixed layer depth (Qiu et al., 2014; Callies et al., 2015), seasonality of the intensity of barotropic instability (Qiu & Chen, 2004), the variability of the baroclinic instability due to the seasonality of the vertical shear (Qiu, 1999), and a seasonal lag of the inverse energy cascade (i.e. energy is transported between scales, from small to large; Arbic et al., 2013) in combination with the presence of a front in the mixed layer, which can lead to a seasonal cycle of the baroclinic instability (Qiu et al., 2014). On one hand, processes such as barotropic and baroclinic instabilities control the seasonality of coherent eddies in the ocean. On the other hand, recent studies using observations and eddy-permitting climate models suggest slower adjustments of the global ocean that create long-term changes in the coherent eddy field. Such readjustments include a multidecadal increase in the ocean stratification resulting from temperature and salinity changes (Li et al., 2020), a horizontal readjustment of sea surface temperature gradients (Cane et al., 1997; Bouali et al., 2017; Ruela et al., 2020), and an intensification of the kinetic energy, eddy kinetic energy, and mesoscale eddy kinetic energy over the last 3 decades as a consequence of an increase in wind forcing (Hu et al., 2020; Wunsch, 2020; Martínez-Moreno et al., 2021). All of these seasonal factors and long-term readjustments directly influence the annual and decadal response of the coherent eddy field, however, the seasonality of the coherent component of the eddy kinetic energy, as well as the seasonal cycle and trends of the coherent eddy statistics, remain unknown.

Here we present a new global climatology of the coherent eddy kinetic energy by reconstructing the coherent eddy signature from satellite observations. Our study documents the seasonal cycle of the coherent eddy kinetic energy, and the seasonal cycle and long-term trends of the coherent eddy properties over the satellite record. Moreover, we conduct more detailed analyses in regions where coherent eddies dominate the eddy kinetic energy field. The rest of this paper is structured as follows: the data sources and methodology are described in Section 2. Then, we present the climatology, energy ratios, and global seasonality of the coherent eddy kinetic energy in Section 3. Section 4 outlines the global climatology and seasonality of coherent eddy properties, followed by long-term changes of the coherent eddy properties (Section 5). Then we focus our attention on the seasonal cycle and coherent eddy properties in regions dominated by coherent eddies (Section 6). Finally, Section 7 summarizes the main results and discusses the implications of this study.

## 2 Methods

We use daily sea surface height (SSH) data made available by the Copernicus Marine Environment Monitoring Service in near real time (CMEMS, 2017). This gridded product contains the sea surface height and geostrophic velocities with daily 0.25° resolution from January 1993 to 2019. The daily geostrophic velocities allow us to compute the kinetic energy (KE) and eddy kinetic energy (EKE) over the satellite record. The main source of EKE is the time-varying wind (Ferrari & Wunsch, 2009); thus, we also compute the seasonal cycle of the wind magnitude from the JRA55 reanalysis (Japan Meteorological Agency, Japan, 2013) using wind velocities at 10m above the ocean's surface.

Over the same record, coherent eddy statistics from Martínez-Moreno et al. (2019), hereafter MM19, are analyzed and compared with those released by Chelton & Schlax (2013), hereafter CS13. Both datasets are gridded in a 1° resolution and are produced via automated eddy identification algorithms using closed contours of SSH. However, these datasets have important differences in the criteria they use to identify and record coherent eddies statistics. The major differences include: (i) MM19's algorithm requires an adjustment between a 2D Gaussian and the SSH anomaly (SSHa) surface within the identified closed contour, while CS13's only uses the outermost closed contour of SSH; (ii) MM19's dataset reports the maximum SSHa within the identified coherent eddy, while CS13's algorithm reports the maximum SSH value minus the discrete level in which the coherent eddy was identified; and (iii) MM19's dataset includes all detected coherent eddies, while CS13's dataset excludes coherent eddies with lifetimes shorter than four weeks and coherent eddy amplitudes smaller than 1cm. Moreover, MM19's algorithm allows the reconstruction of the coherent eddy field under the assumption that coherent eddies have a 2D Gaussian imprint in the sea surface height. This Gaussian reconstruction of the coherent eddy field then allows us to estimate the coherent geostrophic eddy velocities and thus the kinetic energy contained only by coherent eddies.

### 2.1 Kinetic Energy decomposition

Kinetic energy is commonly divided into the mean and time-varying components through a Reynolds decomposition. At a given time, the surface velocity field $\mathbf{u} = (u, v)$ is split into the time mean ($\overline{\mathbf{u}}$) and time varying components ($\mathbf{u}'$). Moreover, MM19 proposed to further decompose the eddy kinetic energy into the energy contained by coherent features ($\mathbf{u}'_{\mathbf{e}}$) and non-coherent features ($\mathbf{u}'_{\mathbf{n}}$). Therefore the KE equation can be written as:

$$\mathrm{KE} = \underbrace{\overline{u}^2 + \overline{v}^2}_{\text{MKE}} + \underbrace{\underbrace{{u'}_e^2 + {v'}_e^2}_{\text{CEKE}} + \underbrace{{u'}_n^2 + {v'}_n^2}_{\text{nCEKE}} + \mathcal{O}_c^2}_{\text{EKE}} + \mathcal{O}^2 \tag{1}$$

Due to the properties of this decomposition, the second order term $\mathcal{O}^2$ is zero when averaged over the same period as $\overline{\mathbf{u}}$. However, $\mathcal{O}_c^2$ is not necessarily negligible, unless it is averaged over time and space. More information about the decomposition of the field into coherent features and non-coherent features is explained in Martínez-Moreno et al. (2019). A global snapshot of each component of kinetic energy decomposition is shown in Figure 1, where the KE and EKE are comprised of rings and filaments. As expected, the decomposition of EKE into CEKE and nCEKE components exhibits only the ring-like signatures expected of coherent eddies, while the non-coherent component primarily shows filaments, with some mis-identified coherent eddies.

### 2.2 Eddy statistics

The eddy statistics used in this study include (i) the eddy count ($\mathrm{cEddy}_n$) defined as the number of coherent eddies per grid cell, (ii) the eddy diameter defined as the diameter of a circle with equal area to the closed contour of each identified eddy, and (iii) the mean eddy amplitude defined as the mean amplitude of the coherent eddies within the cell ($\mathrm{cEddy}_{amp}$). The latter metric can be separated into positive ($\mathrm{cEddy}^+_{amp}$) and negative ($\mathrm{cEddy}^-_{amp}$) coherent eddy amplitudes, defined as the mean amplitude of warm core and cold core coherent eddies, respectively, within the cell. The polarity independent eddy amplitude ($|\mathrm{cEddy}_{amp}|$) is defined as:

$$|\mathrm{cEddy}_{amp}| = \frac{1}{2}\left(\mathrm{cEddy}^+_{amp} - \mathrm{cEddy}^-_{amp}\right) \tag{2}$$

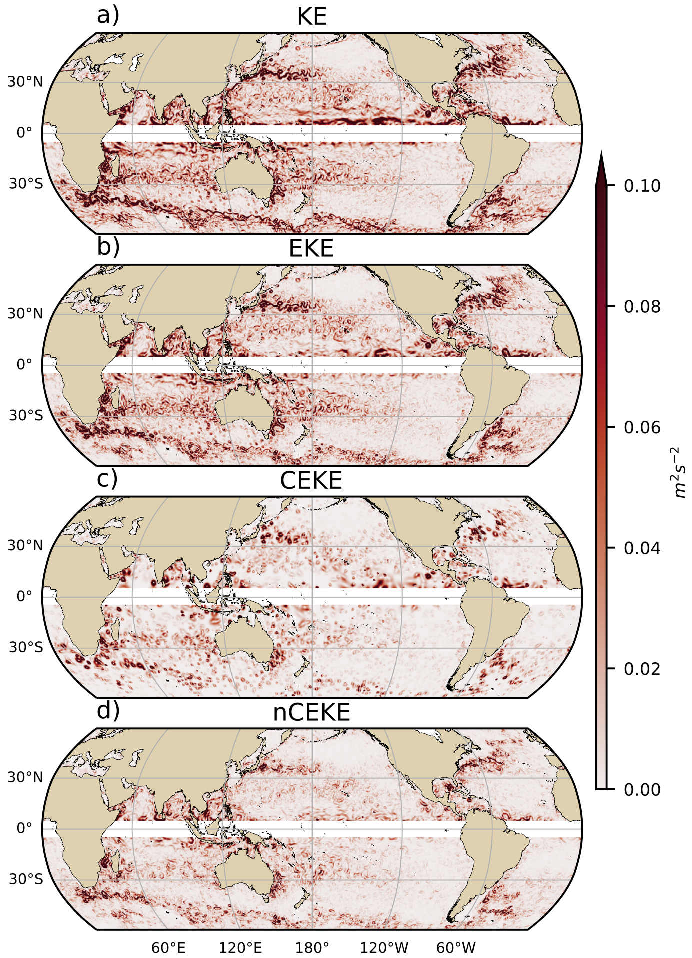


**Figure 1.** Snapshot of surface kinetic energy ($\overline{\mathrm{KE}}$), surface eddy kinetic energy ($\overline{\mathrm{EKE}}$), surface coherent eddy kinetic energy ($\overline{\mathrm{CEKE}}$), and surface non-coherent eddy kinetic energy ($\overline{\mathrm{nCEKE}}$) for the 1st of January 2017.

Note that the cEddy$^{+}_{amp}$ and cEddy$^{-}_{amp}$ are sign definite, thus the difference will always be positive, whereas the gridded averaged cEddy$_{amp}$ can be negative or positive noting the dominant polarity of coherent eddies in the region, and the absolute value of cEddy$_{amp}$ is denoted by cEddy$_{|amp|}$. We analyze the climatology and trends of the above eddy statistics over the available satellite record, namely between 1993 and 2019. We exclude the equatorial region (10°S - 10°N) and regions poleward of 60°, because the geostrophic approximation is invalid near the Equator and the satellite spatial coverage at high-latitudes is unable to resolve the coherent eddy scales polewards of 60°. Note that the climatology of cEddy$_n$ is computed by adding all the identified eddies over the record, while all other climatological statistics are computed as the time-average over the record. Seasonal climatologies are calculated for the monthly average of each coherent eddy statistic, while hemispheric time-series are filtered with a running average of 90 days. Trends of cEddy$_n$ and $|$cEddy$_{amp}|$ are calculated by coarsening the dataset to a 5° grid, and then linear trends are computed for each grid point. The statistical significance of trends is assessed by a modified Mann-Kendall test above the 95% confidence level (Yue & Wang, 2004).

Time averages are denoted by $\overline{\phantom{x}}$, while area-weighted averages are denoted using $\langle \quad \rangle$, where the area-weighted average of a function $f$ is:

$$\langle f \rangle = \frac{\int f \xi dx dy}{\int \xi dx dy}, \tag{3}$$

where $\xi$ is a mask that is set to zero in grid cells where no coherent eddies were identified and one elsewhere.

## 3 Global Coherent Eddy Energetics

The kinetic energy decomposition estimated from sea surface height measured by satellite altimeters averaged from 1993-2019 is shown in Figure 2. These maps show that many regions of the global ocean are highly energetic in mean KE ($\overline{\text{KE}}$), mean EKE ($\overline{\text{EKE}}$), mean coherent eddy kinetic energy ($\overline{\text{CEKE}}$) and mean non-coherent eddy kinetic energy ($\overline{\text{nCEKE}}$). The spatial pattern highlights well-known regions of the ocean where mesoscale processes are abundant, such as the western boundary current (WBC) extensions and the Antarctic Circumpolar Current. The spatial distribution of the energy contained by the reconstructed mesoscale coherent eddies and non-coherent components are similar (Figures 2c,d). However, there are some regions where coherent eddies dominate over non-coherent, and vice-versa. Overall, this decomposition suggests that boundary current extensions and other energetic regions of the ocean contain both coherent and non-coherent components of the kinetic energy.

Eddy kinetic energy is known to be more than an order of magnitude greater than kinetic energy of the mean flow (MKE; Gill et al., 1974); this result is clearly shown in Figure 3a, which indicates that $\overline{\text{EKE}}$ is responsible for almost all the $\overline{\text{KE}}$ across the ocean, except for regions with persistent currents over time. Such regions are located in the mean boundary extension locations, the equatorial Pacific currents and regions in the Antarctic Circumpolar Current, where the $\overline{\text{EKE}}$ explains around 40% of the $\overline{\text{KE}}$. In a previ-

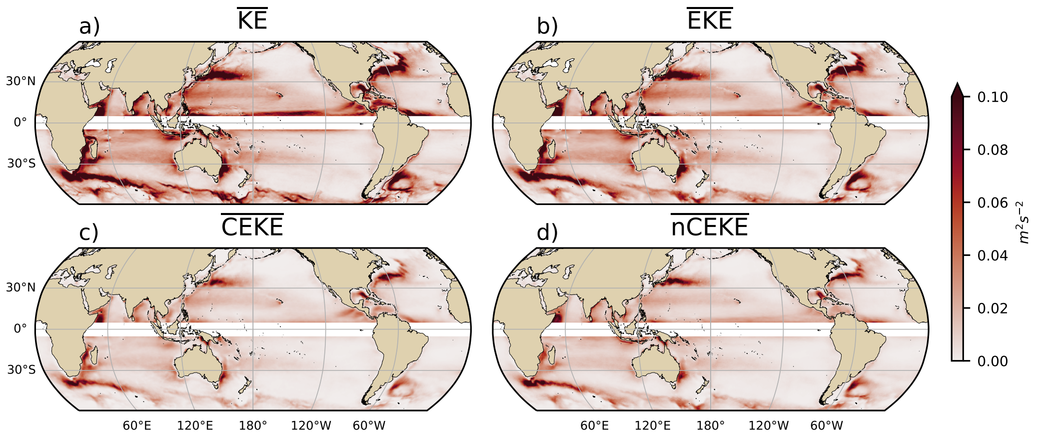


**Figure 2.** a) Mean surface kinetic energy ($\overline{\mathrm{KE}}$); b) surface eddy kinetic energy ($\overline{\mathrm{EKE}}$); c) surface coherent eddy kinetic energy ($\overline{\mathrm{CEKE}}$), and d) surface non-coherent eddy kinetic energy ($\overline{\mathrm{nCEKE}}$) averaged between 1993-2018.

ous study, Chelton et al. (2011) estimated that the EKE within coherent eddies with lifetimes greater than 4 weeks contain between 40-60% of the $\overline{\mathrm{EKE}}$. Our method to reconstruct the coherent eddy signature (Figure 3b) further corroborates that the coherent eddy component ($\langle\overline{\mathrm{CEKE}}\rangle$) has ∼48% of the $\langle\overline{\mathrm{KE}}\rangle$ (Figure 3d). Furthermore, global area averages of the ratios show that $\langle\overline{\mathrm{EKE}}\rangle$ explains ∼78% of the ocean $\langle\overline{\mathrm{KE}}\rangle$ field, while non coherent eddy features contain ∼57% percent of the $\langle\overline{\mathrm{EKE}}\rangle$. Note that the globally averaged coherent and non coherent components do not add to 100% as the cross terms ($\mathcal{O}_c^2$) are non-zero. The spatial pattern reveals a dominance of the $\overline{\mathrm{CEKE}}$ equatorward from the boundary current extensions and in areas with large coherent eddy contributions of around 80% of the region's eddy kinetic energy, such as south of Australia, in the Tehuantepec Gulf, and in the tropical Atlantic. An evident signal is a reduction of the energy contained by coherent eddies at high latitudes and an increase in the energy explained by non-coherent eddies; this signal could be a consequence of the inability of the 0.25° satellite resolution (∼ 13 km at 60° latitude) to resolve coherent eddies with scales smaller than ∼10 km (first baroclinic Rossby radius at 60°; Chelton et al., 1998).

Figure 4 shows the seasonal cycle of the area-weighted EKE and CEKE for the Northern Hemisphere ($\langle\mathrm{EKE}\rangle_{NH}$ and $\langle\mathrm{CEKE}\rangle_{NH}$; 10°N - 60°N) and Southern Hemisphere ($\langle\mathrm{EKE}\rangle_{SH}$ and $\langle\mathrm{CEKE}\rangle_{SH}$; 60°S - 10°S). In both hemispheres, the $\langle\mathrm{EKE}\rangle$ and $\langle\mathrm{CEKE}\rangle$ peak during summer. In the Northern Hemisphere, the largest $\langle\mathrm{EKE}\rangle_{NH}$ and $\langle\mathrm{CEKE}\rangle_{NH}$

Figure 3. Ratios of the kinetic energy components. a) Map of the proportion of mean eddy kinetic energy ($\overline{EKE}$) versus mean kinetic energy ($\overline{KE}$); b) Map of the fraction of mean coherent eddy kinetic energy ($\overline{CEKE}$) versus mean eddy kinetic energy ($\overline{EKE}$); c) Map of the fraction of mean non-coherent eddy kinetic energy ($\overline{nCEKE}$) versus mean eddy kinetic energy ($\overline{EKE}$); d) Global time and area averaged (represented by $\langle\,\rangle$) fraction of mean eddy kinetic energy ( $\overline{EKE}$ ) versus the global mean kinetic energy ( $\overline{KE}$ ), area averaged fraction of mean coherent eddy kinetic energy ( $\overline{CEKE}$ ) and mean non coherent eddy kinetic energy ( $\overline{nCEKE}$ ) versus global mean eddy kinetic energy ( $\overline{EKE}$ ). Regions where the depth of the ocean is shallower than 1000m are removed from the ratio estimation.

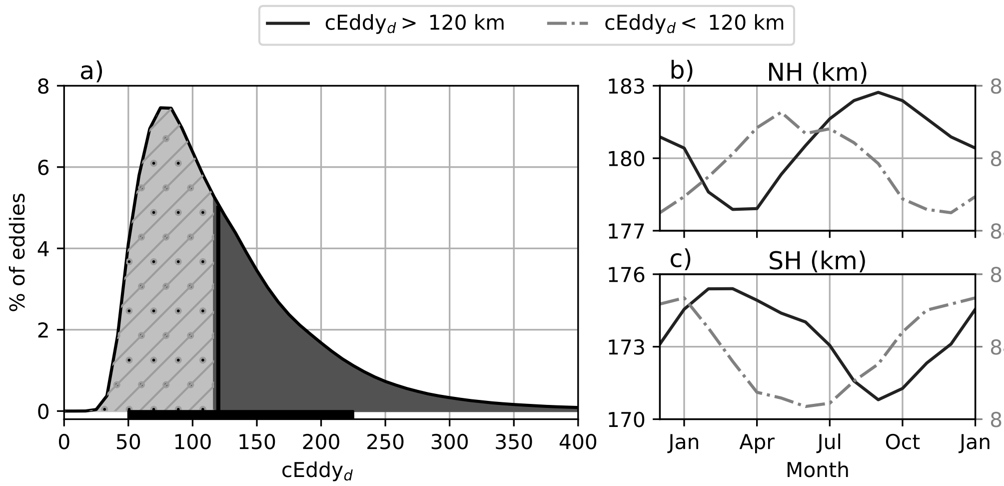


**Figure 7.** Distribution of the identified eddy diameter (cEddy$_d$; km) and hemispherical seasonality of the coherent eddy diameter. a) Distribution in percentage of identified eddy amplitude, solid bar below distribution represents 90% of the identified eddies. Seasonal cycle of the eddy diameter for the b) Northern Hemisphere and c) Southern Hemisphere. Dark solid line and area corresponds to coherent eddies with diameters larger than 120 km, while light gray dash-dotted line and area shows coherent eddies with diameters smaller than 120 km.

## 5 Trends

The results presented in Figures 4 and 6 suggest a long-term readjustment of the coherent eddy field. The long-term trends of the number of coherent eddies, absolute coherent eddy amplitude, and coherent eddy amplitude polarities are further explored in Figure 8 contrasting the MM19 and CS13 methods. Both MM19 and CS13 datasets show consistent spatial patterns in the trends and significance of the number of coherent eddies and the absolute coherent eddy amplitude. Several regions in the ocean, such as the Southern Ocean, North Atlantic and North Pacific, show a decrease in the number of eddies. Those same regions also have a clear increase in the absolute coherent eddy amplitude. These trends are similar to those observed in mesoscale eddy kinetic energy (Martínez-Moreno et al., 2021) and provide additional evidence of a readjustment of the mesoscale eddy field over the last 3 decades.

The observed trends of cEddy$_{|amp|}$ in several oceanic regions have the same scale as sea level rise ($\sim$3cm per decade). By analyzing the positive and negative coherent eddy amplitude, we filter out the observed trends that come from a net increase in sea level.

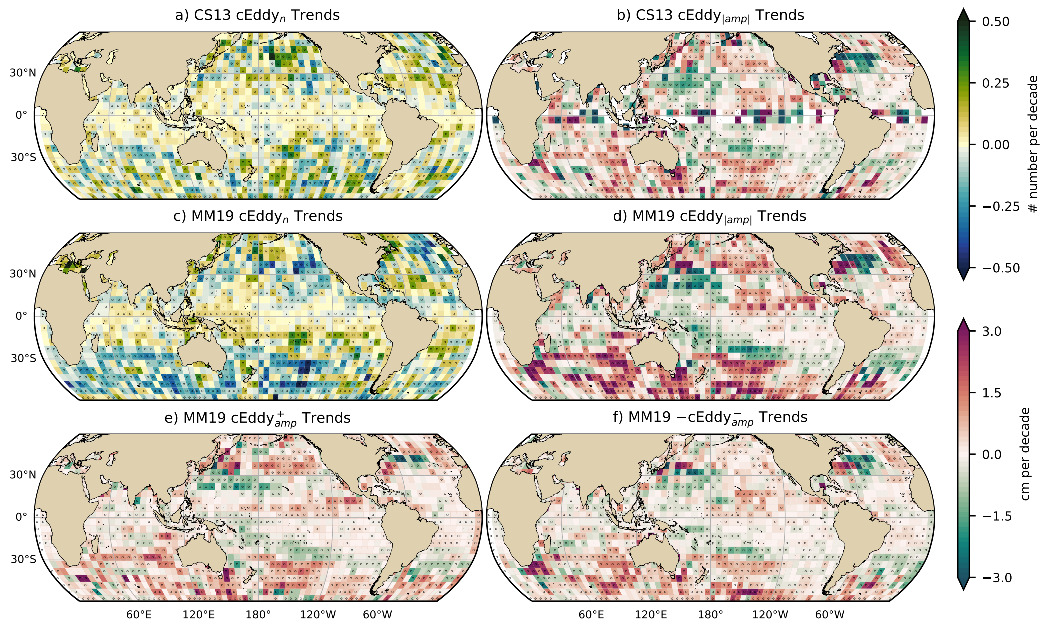


**Figure 8.** Trends of coherent eddy statistics. a) and b) Trends of the number of identified coherent eddies from satellite observations identified using the TrackEddy scheme of MM19, and those reported in CS13's dataset. c) and d) Trends of the absolute value of identified coherent eddy amplitude (cEddy$_{|amp|}$) from satellite observations identified using TrackEddy (after MM19), and those reported by CS13. e) and f) Trends of the eddy amplitude polarity using TrackEddy (cEddy$^+_{amp}$ and cEddy$^-_{amp}$). Gray stippling shows regions that are statistically significant above the 95% confidence level.

In fact, each coherent eddy polarity has intensified in the Southern Ocean and North East Pacific and Atlantic. In other words, the amplitude of each polarity has increased over time, and thus this strengthening is an intrinsic response of the coherent eddy field. Note that the negative coherent eddy amplitude dominates the global |cEddy$_{amp}$| trends (Figure 8e, f). However, different trend patterns can be observed in both positive and negative coherent eddy amplitudes in the North Atlantic and North Pacific, where the negative coherent eddy amplitude in the Western Boundary Currents appears to decrease.

## 6 Regional Climatology

For regions with relatively large proportions of CEKE located at WBC extensions and eastern boundary currents, we investigate the seasonal and long-term variability of the coherent eddy properties. The most energetic WBC include the Gulf Stream, the Kuroshio

Current, and the Agulhas Current (Figures 9, 10, and 11). Coherent eddy generation in boundary current extensions occurs through baroclinic and barotropic instabilities of the mean current, thus all these regions share similar generation dynamics. In all these regions without exception; (i) CEKE contains 50-80% of the EKE in regions equatorward from the mean WBC extensions, (ii) the number of eddies is consistently small over the mean WBC extensions, and (iii) the eddy amplitude is larger over the mean WBC extensions.

In the Gulf Stream, the energy ratio between CEKE and EKE is ~56% (Figure 9). The highest energy ratio occurs in regions with numerous eddies, colocated with regions where the largest $|\text{cEddy}_{amp}|$ gradients occur. The time series of $\text{cEddy}_n$ and $\langle|\text{cEddy}_{amp}|\rangle$ are anti-correlated (-0.52), and they display interannual and seasonal variability. Although Chaudhuri et al. (2009) observed that a positive phase of the North Atlantic Oscillation (NAO) exhibits higher EKE, due to an increase in baroclinic instability, thus suggesting more coherent eddies, we do not find a correlation between the $\text{cEddy}_n$ or the $\langle|\text{cEddy}_{amp}|\rangle$ in the Gulf Stream and the NAO index. Similar to the signal observed in the hemispheric analysis, the eddy count seasonal cycle follows the wind maximum lagging by ~3 months, while the amplitude of the coherent eddies lags by ~ 6 months.

The variability of the $\text{cEddy}_n$ and $\langle|\text{cEddy}_{amp}|\rangle$ in the Kuroshio Current are weakly anti-correlated (-0.41; Figure 10). However, on average 56% of the energy in the region corresponds to CEKE. As observed in the Gulf Stream, there is an important seasonal cycle in the boundary extension, where the eddy count seasonal cycle occurs in March, lagging the wind maximum by ~3 months (January). Meanwhile, the amplitude of the coherent eddies lags the wind maximum by ~ 6 months (June).

In the Southern Hemisphere the strongest boundary current, the Agulhas Current, shows similar behavior to its counterparts in the Northern Hemisphere (Figure 11). On average, coherent eddies in the Agulhas Current contain ~56% of the energy, meanwhile the $\text{cEddy}_n$ seasonal peak occurs in August, while the $\langle|\text{cEddy}_{amp}|\rangle$ peak occurs in January-February. The seasonal lag between the winds, eddy count, and eddy amplitude in each of the WBC extensions is interpreted as being analogous to the lagged response of coherent eddy properties (Figure 6) due to eddy-eddy interactions, consistent with the inverse cascade of energy.

Figure 9. Climatology of the eddy field and coherent eddy field in the Gulf Stream. a) Ratio of mean coherent eddy kinetic energy ($\overline{CEKE}$) versus mean eddy kinetic energy ($\overline{EKE}$); b) Thick lines show the running average over 2 years and thin lines show the running average over 90 days of the coherent eddy number sum and the average coherent eddy amplitude; c) Map of the number of eddies; d) Map of the average coherent eddy amplitude; e) Seasonal cycle of the number of eddies ($cEddy_n$); f) Seasonal cycle of the positive coherent eddy amplitude ( $cEddy^{+}_{amp}$ ), and g) Seasonal cycle of the negative coherent eddy amplitude ( $cEddy_{amp}$ ). Contours in maps correspond to mean sea surface height (m).

al., 2020; Wunsch, 2020; Martínez-Moreno et al., 2021). This long-term readjustment reveals an intensification of the coherent eddy field, possibly due to long-term readjustments in the ocean baroclinic and barotropic instabilities, as well as the strength of the winds.

The reconstruction of the coherent eddies and their statistics has revealed regions with important coherent eddy contributions and a distinct seasonal evolution of the coherent eddies. Western boundary current (WBC) extensions generate eddies through the instability of the main currents and the seasonal cycle of coherent eddies, CEKE, and thus EKE could be associated with an inverse energy cascade observable through lagged seasonal cycles in the coherent eddy statistics. In addition, the amplitude of the seasonal cycle in WBC extensions is two times larger than any other region, thus the seasonality of the coherent eddies in WBC extensions dominates the hemispheric seasonal cycle. Furthermore, the seasonal lag of the inverse energy cascade is coupled with the presence of fronts (Qiu et al., 2014), such as the case for WBC extensions, and our results are consistent with the notion of baroclinic instability generating eddies and, via eddy-eddy interactions, a lagged inverse energy cascade.

The use of satellite observations in this study limits our ability to quantify the importance of the inverse energy cascade seasonality in the control of the coherent eddy seasonal cycle. As mentioned above, there is robust evidence of an increase in eddy-eddy interactions, however we cannot discard important contributions from other processes such as the seasonal cycle of forcing, stratification, and instabilities, which are crucial in the generation of coherent eddies. Although this study can provide a descriptive response of the coherent eddy field, further work is needed to assess the role of eddy-eddy interactions in our changing climate, ocean dynamics, and biogeochemical processes. Furthermore, the SWOT mission could allow us to advance our understanding of eddy-eddy interactions and the seasonal cycle of scales smaller than mesoscale, which may provide further evidence of the inverse energy cascade driving the coherent eddy seasonality. Current generation climate models have just started to resolve mesoscale dynamics, thus, the presented estimate of energy in coherent eddies from satellite observations could be used as a benchmark that facilitates the evaluation of such models, and to quantify the energy contained by mesoscale and more specifically coherent eddies in future climate projections.

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