

Variability of the polar stratosphere and its influence on surface weather and climate

William Seviour

Atmospheric, Oceanic and Planetary Physics
Department of Physics
University of Oxford

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CHAPTER 1

Introduction

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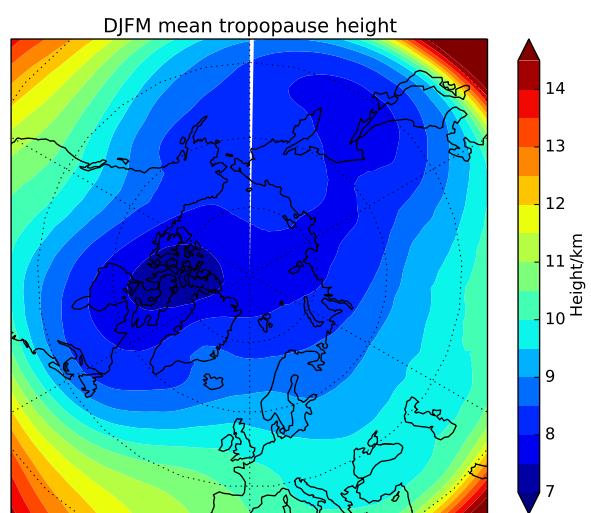


Figure 1.1

CHAPTER 2

A geometrical description of vortex variability

Much of the work contained in this chapter is based upon *Seviour et al.* [2013], published in *Geophysical Research Letters*, although the analysis presented here has been significantly extended.

2.1 Introduction

A quantitative description of stratospheric polar vortex variability is desirable for a number of reasons; it allows for the comparison of different studies, observational data sets, and model simulations, as well as permitting robust definitions of extreme events. Traditional methods to quantify vortex variability have been based on zonal-mean diagnostics, such as the zonal-mean zonal wind [e.g., *Andrews et al.*, 1987]. This was motivated both by the simplicity of these diagnostics and the physical reasoning that the strength of the zonal flow controls the propagation of planetary waves [*Charney and Drazin*, 1961, Section 1.2.2]. *McInturff* [1978] provided the first quantitative definition of SSWs¹ (referred to in that text as “major stratospheric warmings”) using zonal mean quantities as below.

A stratospheric warming can be said to be major if at 10 mb or below the latitudinal mean temperature increases poleward from 60 degrees latitude and an associated circulation reversal is observed (i.e.,

¹In the literature, this is often called “the WMO definition”.

mean westerly winds poleward of 60° latitude are succeeded by mean easterlies in the same area).

A number of variations of this definition have since appeared in the literature. Most commonly, the temperature gradient criterion has been neglected and/or zonal wind reversals at a particular latitude (usually 60°N) used instead of the stricter criterion of a reversal everywhere poleward of 60°N [e.g., *Labitzke and Naujokat, 2000; Christiansen, 2001; Reichler et al., 2012*].

Although the reversal of zonal-mean zonal wind is physically relevant for the propagation of planetary waves, the choice of 60°N and 10 hPa in the definition of SSWs is less physically significant. Indeed, different numbers of SSWs are identified if these locations are varied. *Butler et al. [2014]* found that a greater number of events are identified if the threshold is located either equatorward or poleward of 60°N . Some studies have aimed to avoid this sensitivity to spatial location by quantifying vortex variability through empirical orthogonal function (EOF) analysis, using fields over a larger area. This includes the Northern Annular Mode (NAM) (calculated either from the three-dimensional geopotential height field [*Baldwin and Dunkerton, 2001*] or zonal-mean geopotential height [*Baldwin and Thompson, 2009*]), EOFs of zonal wind [*Limpasuvan et al., 2004*], and vertical profiles of polar cap-averaged temperature [*Kuroda, 2004*]. SSW events are then defined by a threshold in the principal component of the relevant EOF.

As it has become increasingly recognised that SSWs generally occur as either split or displaced vortex events, studies have aimed to objectively distinguish these two types of event. Commonly this has been achieved through Fourier decomposition of the zonal wave structure. For instance, *Nakagawa and Yamazaki [2006]* defined SSWs through a polar temperature criterion and then split these events into two groups depending on whether the 150 hPa Eliassen-Palm (EP) flux prior to the events was dominated by zonal wavenumber one or two. *Charlton and Polvani [2007b]* (hereafter CP07) introduced a new classification method, which does not rely on Fourier decomposition; first they identified events using the traditional wind reversal at 60°N , 10 hPa criterion, then they calculated the circulation around the two largest contours of relative vorticity on the vortex edge. If these two contours have a circulation ratio of 2:1 or lower the event is classified as a split, and all other events are automatically classed as displacements.

Both Fourier decomposition of the zonal wave structure and the method of *Charlton and Polvani [2007b]* rely on an Eulerian framework, with fields analysed at a fixed spatial location. *Waugh [1997]* first applied two-dimensional moment

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diagnostics (otherwise known as elliptical diagnostics) to the stratospheric polar vortex to provide an alternative semi-Lagrangian (or vortex-oriented) framework. These diagnostics are calculated by fitting an ellipse to a contour and then determining its properties such as the centre, orientation, aspect ratio, and area (a further diagnostic, excess kurtosis—a measure of the ‘peakedness’ of the distribution—was introduced by *Matthewman et al.* [2009]). This allows the movement and elongation of the vortex to be quantified. *Waugh* [1997] also compared these diagnostics to the traditional Fourier decomposition. He showed that wave 1 and 2 amplitudes relate most strongly to the displacement and elongation of the vortex respectively, however, these relationships were not found to be strong, with correlations of daily values less than 0.5. These weak relationships were attributed to the fact that planetary wave propagation can be affected by changes in the meridional PV gradient, even if the vortex shape and location are fixed. Furthermore, the wave 1 amplitude depends to some extent on the elongation of the vortex as well as the location of the centre (and similarly for the wave 2 amplitude). He concluded that it is difficult to extract quantitative information about the shape and location of the vortex based on wave amplitudes alone, highlighting the advantages of the moment diagnostics.

Hannachi et al. [2010] then applied a hierarchical clustering algorithm to daily values of the area, centroid latitude, and aspect ratio diagnostics and found that the vortex falls preferably into three clusters corresponding to undisturbed, split, and displaced states. These groupings were used by *Mitchell et al.* [2013] (hereafter M13) to identify split and displaced vortex events; if the vortex remained in the split or displaced cluster for at least five consecutive days it was classified as the corresponding event. Significantly, as discussed in Section 1.3.2.1, M13 demonstrated that split vortex events penetrated deep into the troposphere and resulted in significant surface anomalies, while anomalies associated with displaced vortex events do not descend far below the tropopause. This is in agreement with *Nakagawa and Yamazaki* [2006] who found tropospheric anomalies to be larger following SSWs with dominant wave 2 amplitude, however, it contrasts with *Charlton and Polvani* [2007b], who found little difference in the tropospheric impact of split and displaced vortex events. This highlights the potential importance of the method of classification of split and displaced vortex events in any study.

In this chapter we wish to develop a method for the classification of split and displaced vortex events with the following properties:

1. Based on vortex moment diagnostics.

2. Can be easily applied to a range of data sets, including climate model simulations.
3. Computationally inexpensive.

The motivation for the use of moment diagnostics includes their advantages in quantifying the shape and location of the vortex, as noted above. This, in turn, is desireable because the location of the vortex near the tropopause may be important for understanding the regional tropospheric effect of stratospheric anomalies [e.g., *Ambaum and Hoskins*, 2002, Section 1.3.2.3]. Previous calculations of vortex moment diagnostics have been based on the distributions of quasi-conservative tracers such as PV on isentropic surfaces [*Mitchell et al.*, 2011] or long-lived tracer (e.g., N₂O) concentrations [*Waugh*, 1997]. These quantities have strong meridional gradients allowing for clear determination of the vortex edge [*Nash et al.*, 1996]. Unfortunately, many climate models do not output PV or tracer concentrations, and these are often computationally expensive or impractical to calculate. As such, we wish to develop a method which uses geopotential height, a variable which is output by all contemporary climate models. This effort will also allow us to test the robustness of the result of M13 regarding the different surface impacts of split and displaced vortex events using a semi-independent classification method and extended data set.

The remainder of this chapter is structured as follows. The next section introduces the necessary theoretical background for the calculation of moment diagnostics. Section 2.3 describes the methods used for the classification of split and displaced vortex events, and compares these events with those determined by M13 and CP07. Section 2.4 contrasts the surface impacts of split and displaced vortex events calculated using the new method and discusses potential mechanisms behind any differences.

2.2 Vortex moment diagnostics

The moments, M_n , of a one-dimensional distribution can be classified by their order, n , and provide familiar parameters. These are the area under the distribution (0th order), mean (1st order), variance (2nd order), skewness (3rd order), and kurtosis (4th order), given by

$$M_n = \int_S x^n f(x) dx, \quad (2.1)$$

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where S represents the extent of the distribution, $f(x)$, to be integrated over. The extension of this for a two-dimensional distribution is straightforwardly

$$M_{nm} = \iint_S x^n y^m f(x, y) dx dy, \quad (2.2)$$

where the order of the moment is now defined as $m + n$, meaning it is possible to have different diagnostics with the same order (e.g., M_{01} , M_{10}). Although these diagnostics can be further extended to three dimensions, this has been demonstrated to be highly computationally expensive [Li and Ma, 1994], and would require assumptions about the lower and upper bounds of the vortex region. We therefore calculate two-dimensional moment diagnostics for the stratospheric polar vortex on quasi-horizontal surfaces. We use two variables; geopotential height ($f(x, y) = Z(x, y)$) on the 10 hPa pressure level, and potential vorticity ($f(x, y) = q(x, y)$) on the 850 K potential temperature (isentropic) surface, which lies close to 10 hPa. Following Waugh [1997], the calculation of moment diagnostics is simplified by transforming the spherical data $q(\phi, \lambda)$ and $Z(\phi, \lambda)$, where ϕ is latitude and λ longitude, to cartesian coordinates using the polar stereographic projection

$$x = \frac{\cos \lambda \cos \phi}{1 \pm \sin \phi}, \quad y = \frac{\pm \sin \lambda \cos \phi}{1 \pm \sin \phi}, \quad (2.3)$$

where the positive sign is used in the Northern Hemisphere and negative in the Southern Hemisphere.

In order to calculate moment diagnostics for the stratospheric polar vortex we must first isolate the vortex region by defining the vortex edge. Different methods have previously been used for this calculation; Waugh and Randel [1999] used the mean PV at the maximum of the mean meridional PV gradient, while Matthewman *et al.* [2009] defined the vortex edge on a daily basis, using the average value of PV poleward of 45°N nine days before the onset of a SSW (their SSWs were defined by zonal-mean zonal wind reversal, as in CP07). A more complex method due to Nash *et al.* [1996], starts by transforming PV to ‘equivalent latitude’ [?] coordinates, before defining the vortex edge as the position of the largest gradient in a plot of PV against equivalent latitude. This method was applied in Mitchell *et al.* [2011] to calculate the vortex edge.

None of the three methods outlined above are found to be appropriate for the present study. We wish to directly compare the PV and geopotential height-derived moments, but the methods of Waugh and Randel [1999] and Nash *et al.* [1996] rely on meridional gradients in PV and so may not be transferable to

geopotential height. Furthermore, the method of *Matthewman et al.* [2009] is impractical because we wish to define the events from the moment diagnostics, so will not know their dates before calculation. Instead, we pick a simple definition; PV (q_b) or geopotential height (Z_b) on the vortex edge is defined as the value of the December-March (DJFM) mean at 60°N for the Northern Hemisphere and the June-September (JJAS) mean at 60°S for the Southern Hemisphere. This is seen to lie close to contours defined by the above methods, and results are insensitive to small changes in the latitude chosen.

Having defined the vortex edge, we extend the method *Matthewman et al.* [2009] to isolate the vortex region by introducing a transformed PV field, \hat{q} , given by

$$\hat{q}(x, y) = \begin{cases} q(x, y) - q_b & \text{if } q(x, y) > q_b, \\ 0 & \text{if } q(x, y) \leq q_b, \end{cases} \quad (2.4)$$

and similarly for geopotential height

$$\hat{Z}(x, y) = \begin{cases} Z(x, y) - Z_b & \text{if } Z(x, y) < Z_b, \\ 0 & \text{if } Z(x, y) \geq Z_b. \end{cases} \quad (2.5)$$

By substituting $f(x, y) = \hat{q}(x, y)$ or $f(x, y) = \hat{Z}(x, y)$ in equation 2.2 it is then possible to calculate the moment diagnostics. The zeroth order moment diagnostic, M_{00} can be used to define the ‘equivalent area’, A_{eq} [*Matthewman et al.*, 2009], as

$$A_{\text{eq}} = \frac{M_{00}}{q_b} \quad \text{or} \quad A_{\text{eq}} = \frac{M_{00}}{Z_b}, \quad (2.6)$$

depending on whether PV or geopotential height based diagnostics are calculated. Because $M_{00} \approx Aq$, where A is the vortex area, the equivalent area can be considered a measure of both vortex strength and area. The first order moment diagnostic can be used to calculate the vortex centroid,

$$(\bar{x}, \bar{y}) = \left(\frac{M_{10}}{M_{00}}, \frac{M_{01}}{M_{00}} \right). \quad (2.7)$$

In order for higher order moment diagnostics to be useful, the moment equation (2.2), must be transformed to the *centralised moment* form [*Hall*, 2005]. This calculates moments relative to the vortex centroid, and is given by

$$J_{mn} = \iint_S f(x, y)(x - \bar{x})^n(y - \bar{y})^m dx dy. \quad (2.8)$$

Two useful parameters can be derived from the second-order centralised moment diagnostics, the vortex orientation, ψ (defined as the angle between the major axis

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of the ellipse and the x -axis) and the aspect ratio, r (defined as the ratio of the lengths of the major to minor axes), given by

$$\psi = \frac{1}{2} \tan^{-1} \left(\frac{2J_{11}}{J_{20} - J_{02}} \right), \quad (2.9)$$

$$r = \left| \frac{(J_{20} + J_{02}) + \sqrt{4J_{11}^2 + (J_{20} - J_{02})^2}}{(J_{20} + J_{02}) - \sqrt{4J_{11}^2 + (J_{20} - J_{02})^2}} \right|^{1/2}. \quad (2.10)$$

Using the area, centroid, orientation, and aspect ratio, the *equivalent ellipse* can be uniquely defined. Figure 2.1 shows the equivalent ellipse calculated from both PV and geopotential height fields over a 16-day period centred on a displaced vortex event (classified using the method in Section 2.3). It can be seen that the equivalent ellipse provides a qualitatively good fit to the vortex, although this is less good in Figures 2.1(c,f) when the vortex becomes less elliptical and filamentation occurs. Greater fine-scale structure and filamentation is visible in the PV field due to its quasi-conservative properties, however reasonable agreement can be seen between the PV and geopotential height ellipses.

Equivalent ellipses for an example of a split vortex event are shown in Figure 2.2. It can be seen that after the vortex has separated the equivalent ellipse becomes less physically significant, as it spans the two vortices. *Matthewman et al. [2009]* introduced the 4th order moment diagnostic, “excess kurtosis”, in order to identify splits of the polar vortex; it is given by

$$\kappa_4 = M_{00} \frac{J_{40} + 2J_{22} + J_{04}}{(J_{20} + J_{02})^2} - \frac{2}{3} \left[\frac{3r^4 + 2r^2 + 3}{(r^2 + 1)^2} \right]. \quad (2.11)$$

This has the property of being negative for a vortex with a “pinched” shape, zero for a perfectly elliptical vortex, and positive for a vortex with a strong central core. When negative kurtosis was detected *Matthewman et al. [2009]* split the PV field into two regions along the minor axis of the equivalent ellipse and re-calculated moment diagnostics for the vortices in these regions separately.

In this study we do not make use of the excess kurtosis or calculate separate diagnostics for split vortices for two reasons. First, as a 4th order diagnostic it is a highly skewed variable, making its use in event classification problematic (this was also found by *Hannachi et al. [2010]*). Second, this procedure is more computationally expensive, requiring about three times the number of calculations during split vortex events. Hence, we calculate single moment diagnostics even when the

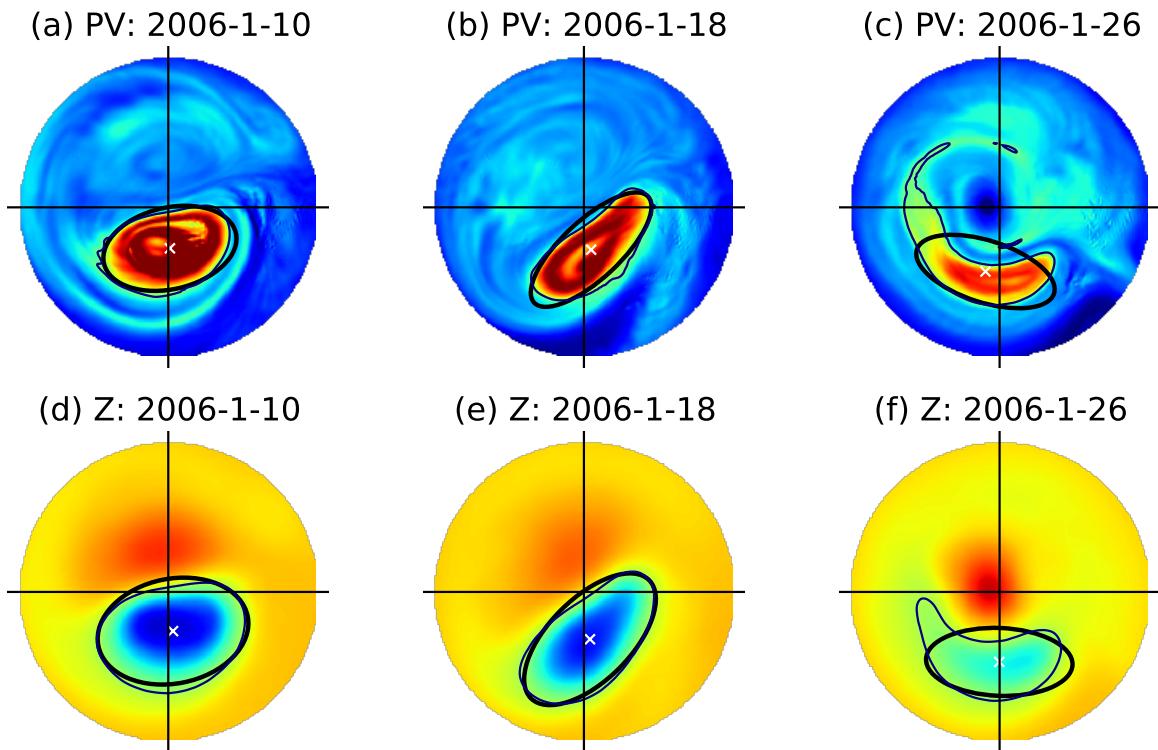


Figure 2.1: PV on the 850 K θ surface (a,b,c) and geopotential height at 10 hPa (d,e,f) 8 days before (a,d), at onset (b,e), and 8 days following the onset (c,f) of a displaced vortex event. Contours of q_b and Z_b are shown in thin black lines, the equivalent ellipse in a thick dark line, and its centroid with a white cross. Data are transformed to cartesian coordinates with a polar stereographic projection.

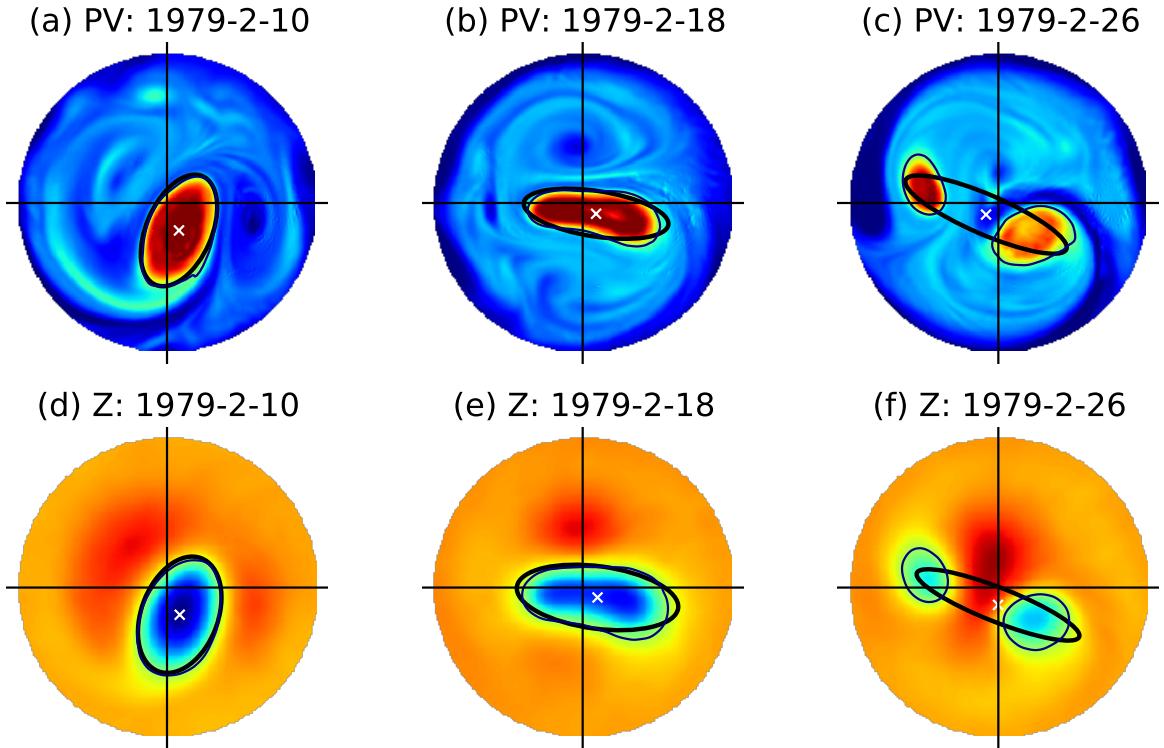


Figure 2.2: As Figure 2.1 but for a split vortex event.

vortex has split, but bear in mind that these may not represent the properties of any real vortex.

Code for the calculation of moment diagnostics using the method described in this section is available from <https://github.com/wseviour/vortex-moments>.

2.3 Data and methods

2.3.1 Reanalysis data

For the analysis in this chapter Northern Hemisphere winter daily-mean data for December-March (DJFM) are employed from the European Centre for Medium-Range Weather Forecasts (ECMWF) reanalyses. The ERA-40 data set [*Uppala et al., 2005*] is used from 1958-1978 and ERA-Interim [*Dee et al., 2011*] from 1979-2009. The combination of these two data sets is chosen in order to maximise the total number of years entering the analysis (ERA-40 runs only to 2002), as well as to compare results from the more recent ERA-Interim with previous studies using only ERA-40, such as *Charlton and Polvani [2007b]* and *Mitchell et al. [2013]*.

ERA-Interim is similar to ERA-40 but uses ECMWFs operational four-dimensional variational data assimilation system (4D-Var) as opposed to the 3D-Var system

used in ERA-40. It also has higher horizontal and vertical resolution, improved humidity analysis, model physics, data quality control, bias handling and other improvements as noted in *Simmons* [2007]. The majority of observational data for the stratosphere entering both reanalyses is from radiosonde and satellite measurements. It is important to note that in the pre-satellite era (1958-1971) observations in the stratosphere were much more sparse, leading to greater errors in reanalyses during this time [*Uppala et al.*, 2005].

A number of studies have evaluated the stratospheric circulation in ERA-40 and ERA-Interim against other observations or reanalyses. *Randel et al.* [2004] found ERA-40 to closely match measurements of the zonal stratospheric circulation derived from radiosonde, rocketsonde and lidar measurements. *Karpetchko et al.* [2005] found that the representation of the polar vortices in ERA-40 agrees well with the NCEP/NCAR reanalysis, and CP07 demonstrated that this also holds for the occurrence of SSWs. *Seviour et al.* [2012] showed that the strength of the stratospheric meridional mean stratospheric circulation in ERA-Interim agrees well with previous reanalysis, but that the residual vertical velocity is more smoothly represented.

In order to perform a consistent analysis across the two data sets, ERA-Interim data is linearly interpolated to the lower resolution ERA-40 ($1.125^\circ \times 1.125^\circ$) Gaussian grid. PV is also interpolated from pressure levels to the 850 K isentropic surface (which lies close to 10 hPa), as this quantity has the property of being conserved under adiabatic flow. In the calculation of the vortex edge. Both in the calculation of the vortex edge (climatological mean q or Z at 60°N/S) and the moment diagnostics themselves, no clear jumps were seen between ERA-40 and ERA-Interim data sets. As such, the two are considered together with no bias corrections. For the remainder of this thesis, this combined ERA-40 and ERA-Interim data set is referred to as ‘ERA’.

2.3.2 Moment diagnostic calculation

In order to calculate the moment diagnostics, the values of PV and geopotential height on the vortex edge (q_b and Z_b) must first be determined. These are the $60^\circ\text{N DJFM}/60^\circ\text{S JJAS}$ mean values of PV at 850 K (q_{850}) and 10 hPa geopotential height (Z_{10}) respectively. They are found to be $q_b = 460$ PVU (1 PVU = $10^{-6}\text{Km}^2\text{kg}^{-1}\text{s}^{-1}$) and $Z_b = 30.2$ km for the Northern Hemisphere, and $q_b = 618$ PVU and $Z_b = 29.0$ km for the Southern Hemisphere. Using these

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values the moment diagnostics are calculated from ERA data for 1958–2009 using the method described in Section 2.2.

As discussed in Section 2.2 the excess kurtosis diagnostic is not used in the present analysis. In the interests of simplicity, only the aspect ratio and centroid latitude diagnostics are used to identify events, and the centroid longitude, orientation and equivalent area are not used. The aspect ratio and centroid latitude are the most intuitive diagnostics for this purpose, with a high aspect ratio and poleward centroid latitude expected during split vortex events, and a low aspect ratio and equatorward centroid latitude expected during displaced vortex events.

Figure 2.3 shows the distributions of these two quantities calculated from q_{850} and Z_{10} for the Northern Hemisphere vortex. The centroid latitude distributions are almost identical, with a peak near 80°N which is in agreement with previous studies [Mitchell et al., 2011; Waugh and Randel, 1999]. The aspect ratio distributions have a similar shape, with a peak at about 1.3, but the PV based diagnostic has a larger tail. This is because the PV field contains more small-scale filamentary structures than geopotential height (e.g. Figures 2.1 and 2.2), making high aspect ratios more likely. As well as having similar distributions, the time series of the PV and geopotential height derived diagnostics (not shown) are significantly correlated, with correlation coefficients of 0.9 for daily centroid latitude and 0.6 for aspect ratio. Overall, these results suggest that geopotential height-derived moment diagnostics are appropriate for the identification of split and displaced vortex events.

Figure 2.4 shows the same distribution as Figure 2.3, but for the Southern Hemisphere vortex aspect ratio and centroid latitude. As in the case of the Northern Hemisphere, the geopotential height and PV-based distributions have very similar shapes, with the PV-based aspect ratio having a slightly larger tail. Comparing the Northern and Southern Hemisphere distributions it can be seen that there is much less variability in both aspect ratio and centroid latitude in the Southern Hemisphere. This is because of the reduced planetary wave propagation into the Southern Hemisphere stratosphere, in turn a result of lesser forcing from orography and land-sea temperature contrasts. The peak in the Southern Hemisphere centroid latitude is at about 86°S ; the same as that found by Waugh and Randel [1999].

A result of this reduced Southern Hemisphere vortex variability is that only one SSW has been observed in the Southern Hemisphere (discussed further in Chapter 4). The rest of this chapter relates to the classification and impacts of split

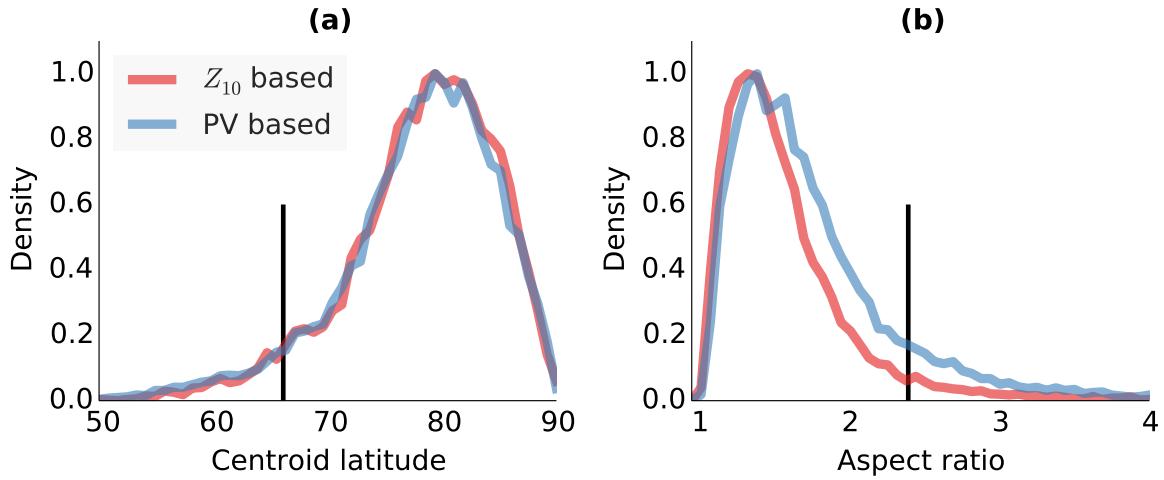


Figure 2.3: Distributions of the December-March centroid latitude (a) and aspect ratio (b), of the Northern Hemisphere stratospheric polar vortex over 1958-2009. Diagnostics are calculated from geopotential height at 10 hPa (Z_{10}) and potential vorticity at 850 K (PV). Thresholds of 66°N in centroid latitude and 2.4 in aspect ratio are used to define events, and are indicated by the black vertical lines.

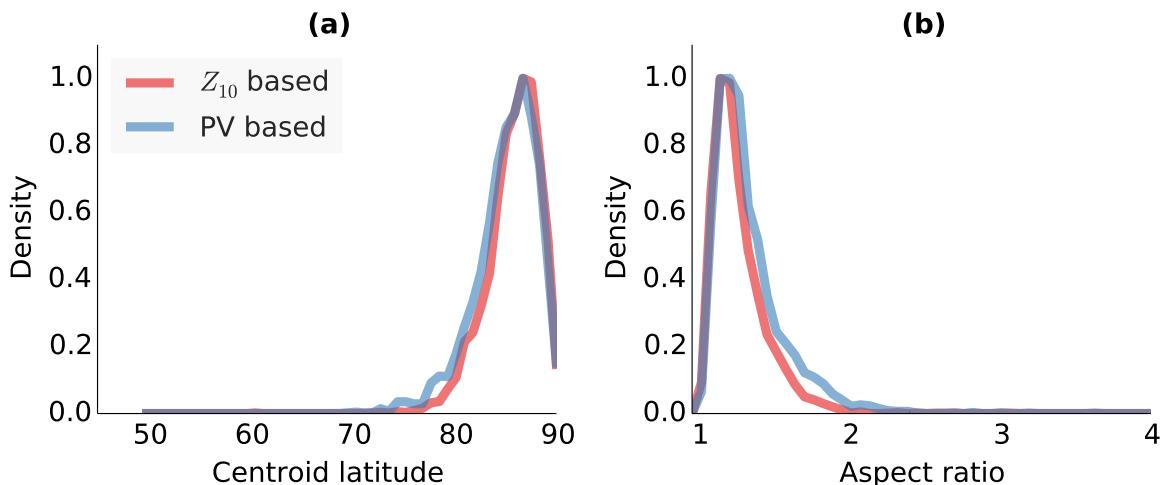


Figure 2.4: As Figure 2.3 but for moment diagnostics calculated for the Southern Hemisphere stratospheric polar vortex over June-September.

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and displaced vortex events and so focusses only on the Northern Hemisphere. However, it should be noted that all the methods below can also be applied to the Southern Hemisphere.

2.3.3 Event identification

Previous attempts to identify SSW events have used a clustering method [*Coughlin and Gray, 2009; Hannachi et al., 2010*]. These methods attempt to classify the vortex state for each day into a number of groups, which may be specified beforehand or determined by the clustering algorithm. Individual days within the same cluster should be physically similar, while those in different clusters distinct. More precisely, clustering aims to maximise the between-cluster variance while minimising the within-cluster variance. In the case of the stratospheric polar vortex, clusters may represent, for instance, stable, split, and displaced states. Events are then typically defined by the vortex persisting in a particular cluster for a number of days.

A large number of clustering algorithms exist, and some may be more appropriate than others for certain uses. Here, three different algorithms are applied to the moment diagnostics in centroid latitude-aspect ratio space, and their outcomes shown in Figure 2.5(a,b,c). Details of the three algorithms are given below:

(a) **K-means** clustering requires the number of clusters, K , to be specified beforehand (in Figure 2.5, $K = 3$). The algorithm begins by randomly selecting K data points to be the centroids of the initial clusters, all other data points are assigned to the cluster with the nearest centroid. Having assigned the initial cluster membership, the algorithm proceeds as follows:

1. Compute the centroids (the vector means), \bar{x}_k of each cluster.
2. Calculate the distance between the current data point, x_i , and each of the K \bar{x}_k s. (Various distance measures can be used; in Figure 2.5(a), the Euclidean distance is used).
3. If x_i is not in the group with the closest mean then reassign it to that group, otherwise repeat step 2 for x_{i+1} .

This is repeated until a full cycle through each x_i produces no reassessments. An advantage of this method is that it is computationally efficient, but the major disadvantage is that the number of clusters must be pre-determined.

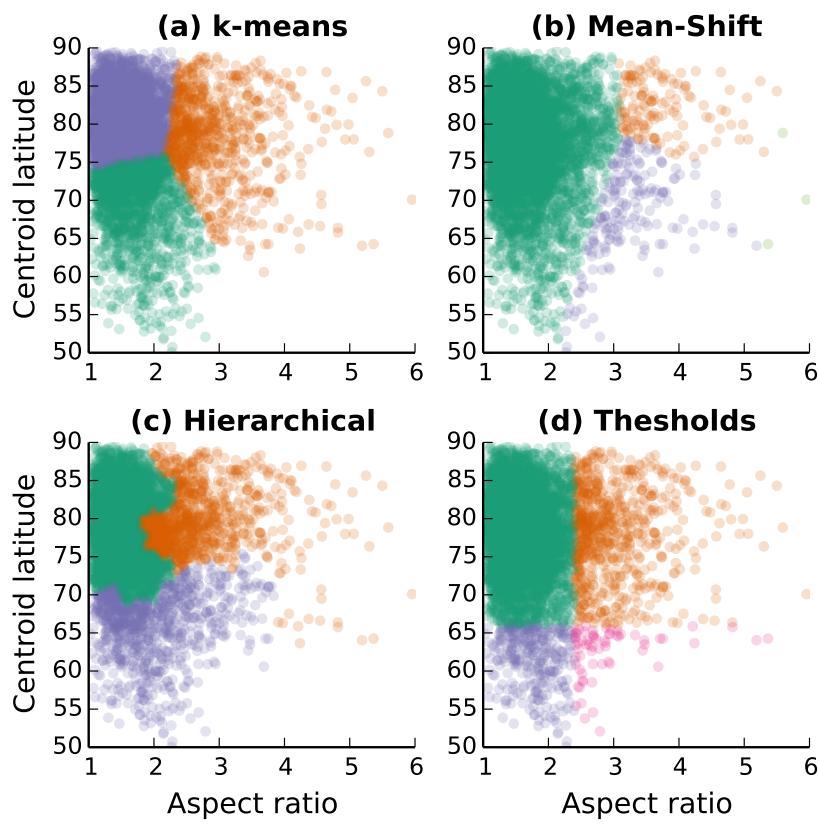


Figure 2.5: Three clustering algorithms and a threshold division applied to the moment diagnostics in centroid latitude-aspect ratio space. For the *k*-means and hierarchical algorithms three clusters were specified. The mean-shift algorithm determined the number of clusters to be 4.

2.3. DATA AND METHODS

Several methods exist to estimate the ideal number of clusters, which generally have the aim of finding the best compromise between minimising within-cluster variance and maximising between-cluster variance. *Coughlin and Gray [2009]* applied K -means clustering to several variables representing the stratospheric polar vortex. They used a method known as silhouette values [?] and determined the ideal number of clusters to be two (representing stable and disturbed vortex states).

- (b) **Mean-shift** clustering aims to discover ‘blobs’ in a data set. It works by updating candidates for centroids to be the mean of the points within a given region. That is, given a candidate centroid \mathbf{x}_i for iteration t , the candidate is updated according to

$$\mathbf{x}_i^{t+1} = \mathbf{x}_i^t + \mathbf{m}(\mathbf{x}_i^t), \quad (2.12)$$

where \mathbf{m} is the mean shift vector. This is calculated as

$$\mathbf{m}(\mathbf{x}_i) = \frac{\sum_{\mathbf{x}_j \in N(\mathbf{x}_i)} K(\mathbf{x}_j - \mathbf{x}_i) \mathbf{x}_j}{\sum_{\mathbf{x}_j \in N(\mathbf{x}_i)} K(\mathbf{x}_j - \mathbf{x}_i)}, \quad (2.13)$$

where $K(\mathbf{x}_j - \mathbf{x}_i)$ is a kernel function which determines the weight of nearby points. Typically, and in Figure 2.5(b), a Gaussian kernel is used, $K(\mathbf{x}_j - \mathbf{x}_i) = e^{-c\|\mathbf{x}_j - \mathbf{x}_i\|^2}$. $N(\mathbf{x}_i)$ represents the set of points for which $K(\mathbf{x}_i) \neq 0$. This shifting is repeated until \mathbf{m} converges. Following this calculation, the candidates are then filtered to remove near duplicates. The greatest advantage of this method is that it automatically sets the number of clusters, so no prior assumptions about the data set are required. A disadvantage is that it requires multiple nearest neighbour searches during each iteration, and so may not be scalable to large data sets. In Figure 2.5(b) the number of clusters was determined to be four.

- (c) **Hierarchical** clustering proceeds by calculating a series of nested clusters. To begin with, all data points are considered each as a separate cluster and then at each iteration the nearest two clusters are merged. There are a number of methods to identify the distance between clusters when those clusters consist of more than one member. Following *Hannachi et al. [2010]* the *complete-linkage* method; defining the distance as the largest distance between members in the two groups. As with the K -means clustering, the number of clusters desired must be pre-determined, otherwise the algorithm will run to completion with a single cluster consisting of all data points. Again, many methods exist to

determine the optimum number of clusters. *Hannachi et al.* [2010] used the gap statistic method [*Tibshirani et al.*, 2001] with vortex area, centroid latitude, and aspect ratio moment diagnostics, and found a slight preference for three clusters. As such, three clusters are used in Figure 2.5(c).

Figure 2.5 demonstrates that the three clustering methods produce very different results. As well as the size and extent of the clusters, there is also disagreement between this and past studies on the optimum number of clusters; *Coughlin and Gray* [2009] found two clusters using a silhouette values method, *Hannachi et al.* [2010] found three clusters using the gap statistic, while the mean-shift algorithm applied here produces four clusters. Further sensitivity tests were performed by randomly removing 1% of the data and re-calculating the clustering. It was found that very different clusters were calculated with this small alteration to the data, suggesting that these clusterings may not be robust if applied to different data sets, such as climate model simulations. The likely reason for this sensitivity is that the data itself is not highly clustered; as can be seen in Figure 2.3 no clear bimodality is present. Rather, it is more appropriate to view the split and displaced vortex states as the tails of a distribution rather than distinct clusters or regimes.

For the reasons above, clustering methods are deemed inappropriate for the present study, and a simpler, more robust, thresholds-based method is introduced. Days with an aspect ratio > 2.4 (11% of all days) or a centroid latitude $< 66^\circ\text{N}$ (5% of all days) are classified as split and displaced states respectively. A small number of days lie beyond both thresholds, and these are classified as a mixed state (1% of all days). The vast majority of days (83%) lie in the stable state, where neither threshold is exceeded. The choice of thresholds is somewhat subjective but the results presented below are not sensitive to the exact choice of threshold. They were chosen to give a similar frequency of split and displaced vortex events (identified using the method below) as CP07 and M13.

Mitchell et al. [2011] found that the aspect ratio and centroid latitude follow an extreme value distribution [*Coles*, 2001] and it is noted that both thresholds chosen here lie beyond the extreme value thresholds of their respective distributions (these were found to be 2.3 for aspect ratio and 72°N for centroid latitude). Some theoretical motivation for the aspect ratio threshold can also be provided by the theoretical stability of an idealised elliptical vortex. *Love* [1893] found that the Kirchoff ellipse (an elliptical patch of uniform vorticity in a quiescent fluid) is linearly unstable if the aspect ratio exceeds 3. The aspect ratio threshold of 2.4

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used here lies below this limit, and so under this idealised model it might expect that some split vortex events do not display a full separation into two vortices.

Having classified each day into these four groups, a persistence criterion is introduced in order to identify split and displaced vortex *events*. A displaced vortex event requires the centroid latitude to remain equatorward of 66°N for 7 days or more, while a split vortex event requires the aspect ratio to remain higher than 2.4 for 7 days or more. The onset date is defined as the day that the appropriate threshold is first exceeded, and to ensure that no events are counted twice, these onset dates are required to be spaced at least 30 days apart, chosen to reflect radiative timescales in the lower stratosphere [Newman and Rosenfield, 1997]. Using this method, 17 displaced and 18 split vortex events (listed in Table ??) are identified over the 52 winters, an average of 7 per decade. This frequency lies between the values of CP07 (6 per decade) and M13 (8 per decade). Although data is restricted to DJFM in this analysis, no measures are taken to exclude early final warmings which may occur in late March. This is motivated by the fact that these are highly dynamically driven events which may have significant impacts on the troposphere [Hardiman et al., 2011]. The events defined here may therefore include some which would traditionally be classed as final warmings (i.e. the zonal-mean zonal wind does not return to westerly). For this reason, there events are not referred to as SSWs, but simply as split and displaced vortex events.

Figures 2.6 and 2.7 show geopotential height at the peak of each of the split and displaced vortex events. The peak is defined as the day with the maximum aspect ratio or minimum centroid latitude in the two weeks following the onset date of split and displaced vortex events respectively. Almost all of the split vortex events show two clearly separated vortices or a pinched vortex shape, which is approximately symmetrical about the North Pole. Two exceptions are Figures 2.6 (a) and (k), in which the vortex is highly elliptical but not clearly split. Figure 2.6(n) shows an event with a highly elliptical vortex that is also somewhat displaced from the pole, indicating that it has some displaced nature. The majority of split vortex events are seen to occur along the 90°E-90°W axis, in line with the climatological wave-2 pattern [Andrews et al., 1987]. Figure 2.6(h) shows an exception to this, with an orientation orthogonal to the majority of events.

The displacement events mostly show a smaller and weaker vortex, owing to the fact that they are more common later in winter (see Figure 2.8). Some events, particularly those occurring in late March, are also likely to be events which would traditionally be defined as final warmings. It can be seen that the

No.	Event onset	Event type	ΔT_{10} (K)	\bar{U}_{10} (m s ⁻¹)
1*	1961-3-9	D	10.2	2.7
2*	1962-1-30	S	1.9	38.9
3*	1962-3-7	S	-1.0	16.9
4*	1964-3-15	D	11.9	1.3
5†	1966-2-26	D	2.5	-5.9
6	1967-12-29	S	13.0	19.4
7†	1970-1-5	S	8.5	-4.0
8	1971-1-15	S	10.8	-1.7
9*	1972-2-4	S	-1.6	33.6
10†	1973-2-4	S	7.3	-6.6
11*	1974-3-12	D	5.3	-4.8
12*	1975-3-16	D	7.6	-8.0
13*	1976-3-31	D	8.2	-13.3
14†	1977-1-7	S	7.6	-5.5
15*†	1978-3-25	D	2.5	-9.3
16	1979-2-18	S	5.6	-0.4
17	1984-2-25	D	11.6	-4.4
18	1984-12-25	S	15.0	-1.7
19*	1986-1-7	S	3.4	29.9
20*	1986-3-21	D	9.1	-12.2
21	1987-1-20	D	8.3	-7.7
22	1987-12-10	S	9.8	-3.0
23*	1992-3-22	D	7.6	-4.4
24*†	1995-2-2	D	5.6	7.7
25	1998-12-15	D	8.2	8.1
26	1999-2-24	S	6.6	-12.7
27	2001-2-7	S	5.2	-7.2
28*	2001-3-15	S	-6.8	12.1
29*	2002-3-21	S	-1.5	5.1
30	2003-1-17	S	6.1	16.8
31	2004-1-2	D	5.8	-4.8
32*	2005-3-11	D	3.1	-5.0
33	2006-1-17	D	4.2	-14.3
34	2008-2-18	D	4.6	2.3
35	2009-1-18	S	13.2	16.9

Table 2.1: A summary table of displaced (D) and split (S) vortex events, identified from 10 hPa geopotential height data from 1958-2009. ΔT_{10} represents the mean area-weighted 50°-90°N cap temperature anomaly at 10 hPa calculated 5 days either side of the event onset date. \bar{U}_{10} represents \bar{U} at 60°N and 10 hPa averaged over the same period. Asterisks (*) represent those numbers that do not coincide (i.e. within 10 days and of the same type) with events defined by CP07 and daggers (†) events which do not coincide with events of M13.

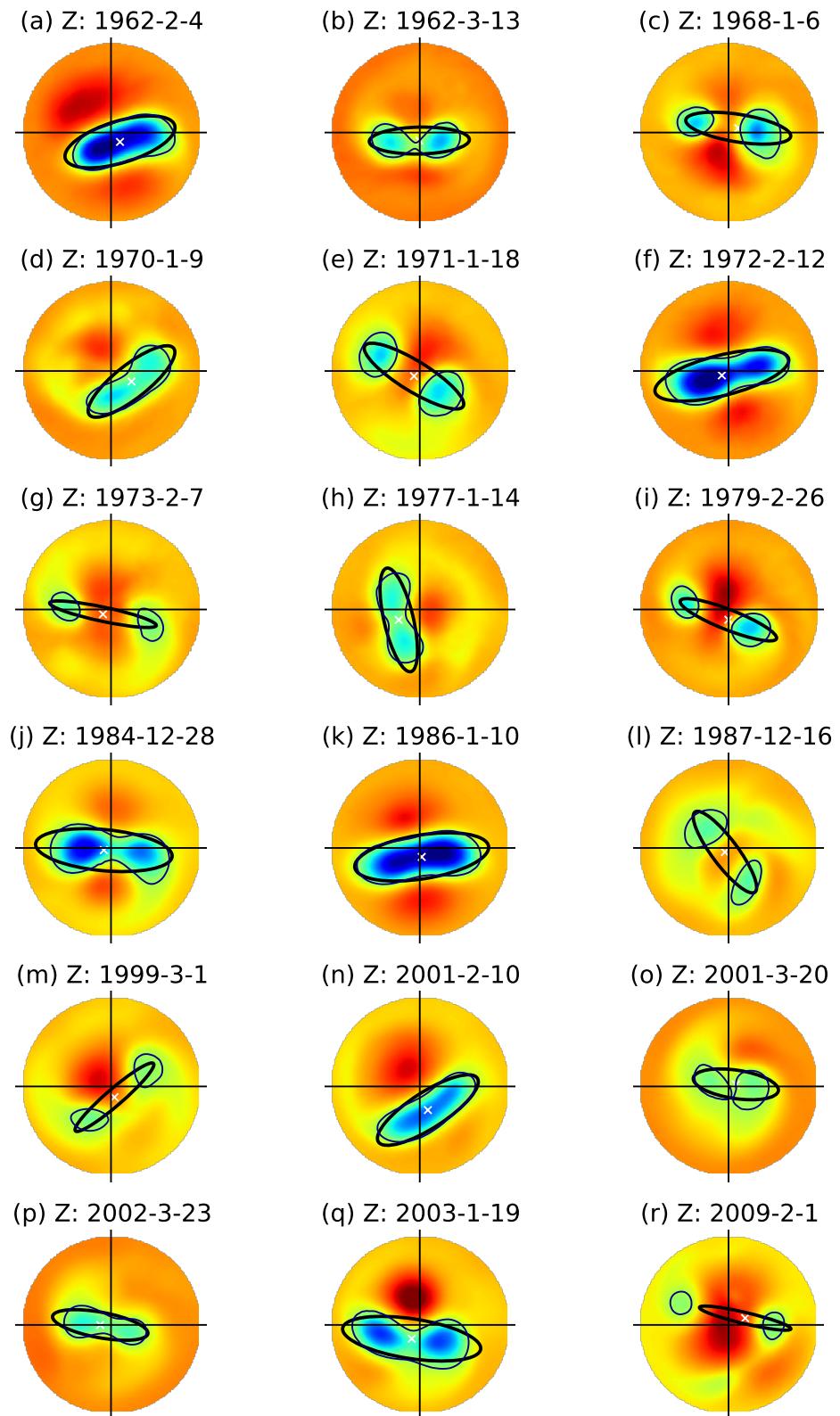


Figure 2.6: 10 hPa geopotential height at the peak of each of the 18 split vortex events identified in ERA. The peak is defined as the day with the largest aspect ratio during the two weeks following the onset date. The vortex edge is shown as a thin black contour, the equivalent ellipse the thick black contour and its centroid as a white cross. Data are transformed to cartesian coordinates with a polar stereographic projection.

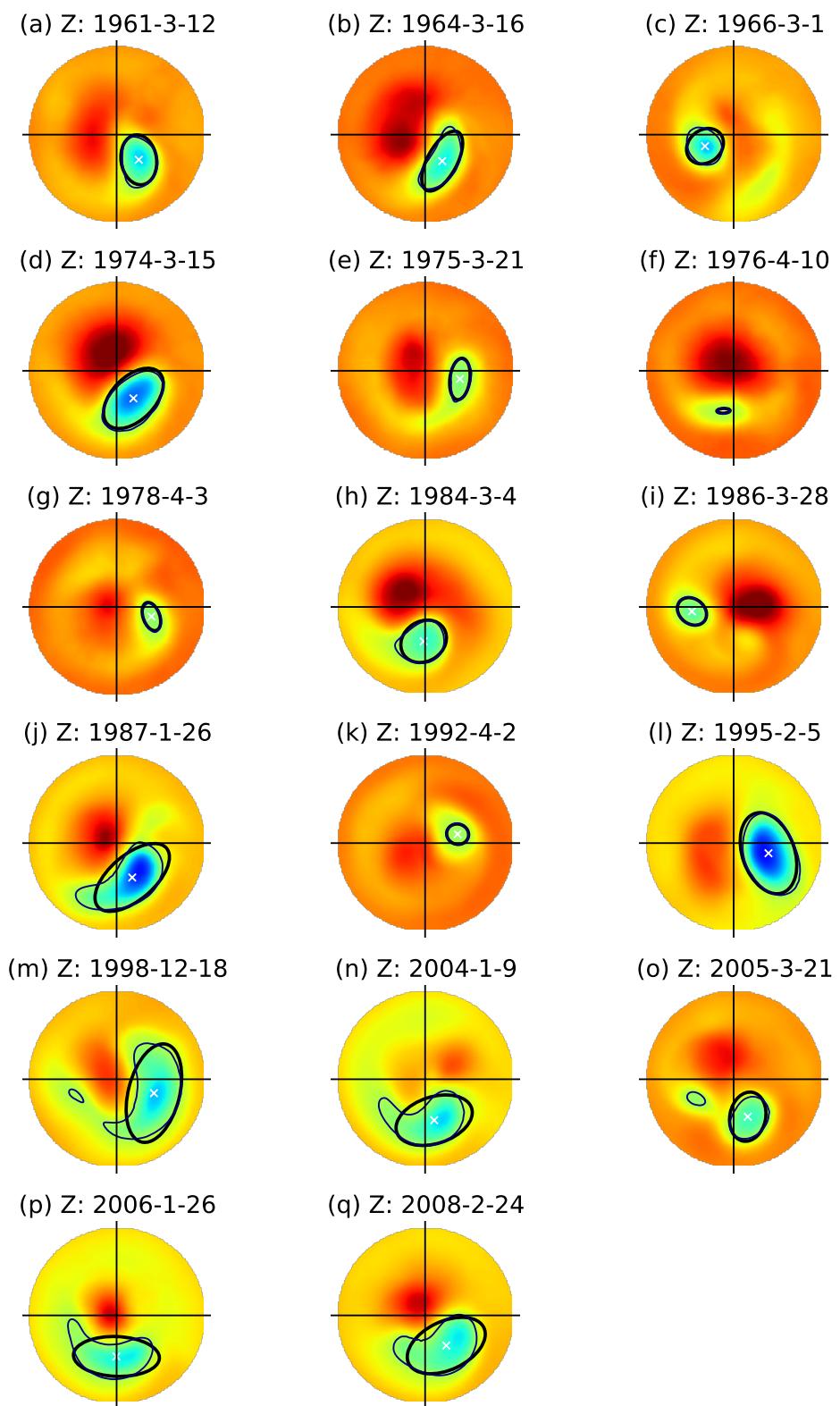


Figure 2.7: As Figure 2.6 but for the 17 displaced vortex events identified in ERA.

2.3. DATA AND METHODS

majority of displacement events occur in the direction of the 0-90°E quadrant, again in line with the climatological wave-1 pattern. However, there are some exceptions to this, for instance Figures 2.7 (c) and (i), which show a westward-displaced vortex.

2.3.4 Comparison with CP07 and M13

The split and displaced vortex events identified using the above method are now compared with those of the CP07 and M13 methods. Table ?? identifies those events which do not coincide with the events of CP07 and M13, where ‘coincide’ is taken to mean events within 10 days and of the same type. Of the 35 events identified, 16 were found not to coincide with events of CP07 (10 displacement and 6 split). Six events were found not to coincide with those of M13 (3 displacement and 3 split), although this comparison only covers the 28 events from 1958-2002, as it was not possible to reproduce the M13 method over the longer period studied here because of the difficulties with hierarchical clustering discussed in Section 2.3.3. Just two completely new events were identified (i.e. not coinciding with either CP07 or M13); these are the displaced vortex events with onset dates 1978-3-25 and 1995-2-2.

Table ?? also shows polar cap averaged 10 hPa temperature anomalies (ΔT_{10}), averaged 5 days either side of the event to give a measure of the event magnitude. The events of CP07 show a larger average anomaly than events identified with the current method, although the two are not statistically significantly different: CP07 average 8.6 K [6.1, 10.9] split and 7.8 K [5.5, 9.9] for displaced vortex events, while the current method averages 5.7 K [3.0, 8.3] for split and 6.8 K [5.5, 8.2] for displaced vortex events (numbers in square brackets represent the 95% uncertainty range, calculated using a bootstrap test). It can be seen that while the vast majority of events show positive values of ΔT_{10} (i.e. warming), four events show negative values. All of these events are also identified by M13, and they attributed the negative values to the presence of a strong, cold vortex prior to the event. Zonal-mean zonal wind at 60°N and 10 hPa (\bar{U}_{10}), averaged over the same period is also shown in Table ?? . The majority of events show negative values, in line with the traditional wind reversal criterion, although some show positive values. This again may result from a strong vortex prior to these events, as well as the fact that the current method may detect events with a distorted but strong vortex.

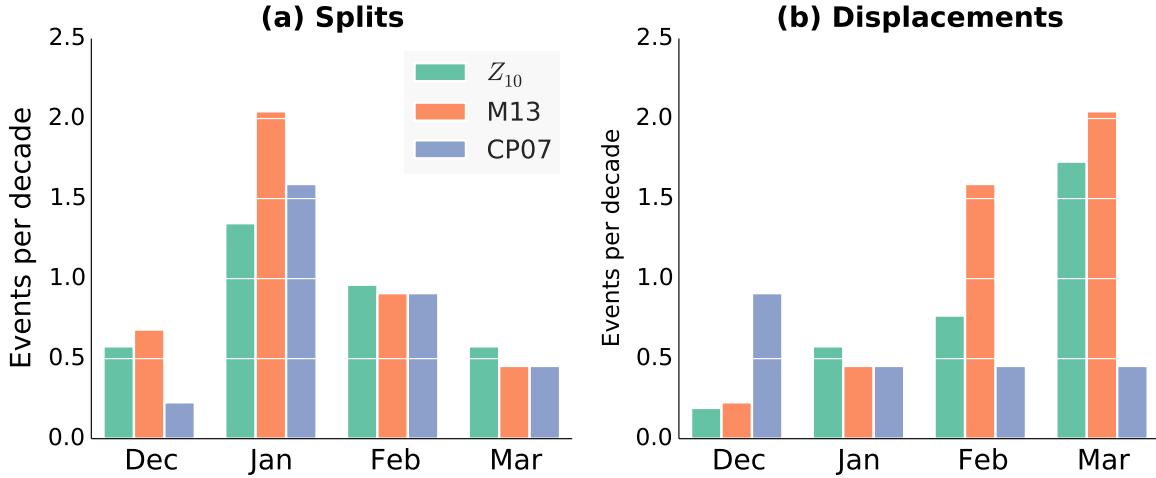


Figure 2.8: Histogram of the seasonal distribution of displaced and split vortex events, from the current (Z_{10}) method, M13 and CP07.

The seasonal distribution of split and displaced vortex events identified by the current method (Z_{10}), M13, and CP07, is shown in Figure 2.8. In all three methods split vortex events are more frequent in early-mid winter, with a peak in January. For displaced vortex events, both the current method and M13 show a skew towards events occurring later in winter. However, there is less similarity with the CP07 distribution of displaced vortex events. CP07 indicates an approximately flat distribution throughout winter, and many fewer displaced vortex events overall. It should be noted that the seasonal distribution of split vortex events from the moment based methods does not arise from the underlying climatology of aspect ratio, which remains approximately constant throughout winter (e.g., 3.2). The centroid latitude does however, show a small equatorwards trend throughout winter, which may to some extent account for the seasonal distribution of displaced vortex events [Mitchell *et al.*, 2011].

Figure 2.9 compares the average shape of the stratospheric polar vortex following the split and displaced vortex events identified by the three methods. Composites of PV in the mid-stratosphere (850 K) are shown averaged 5 days following each event. For the split vortex events, the current method (Z_{10}) method clearly shows two separated vortices, one centred over Canada and the other over Siberia. For the M13 events the split vortex composite shows the vortex stretched across the same 90°W-90°E line, although not as clearly split, while the composite for the CP07 events looks very different. This has a weak vortex centred over Canada, with the other over Northern Europe in a similar location to the composite for displaced events. All three composites for displaced events show a vortex

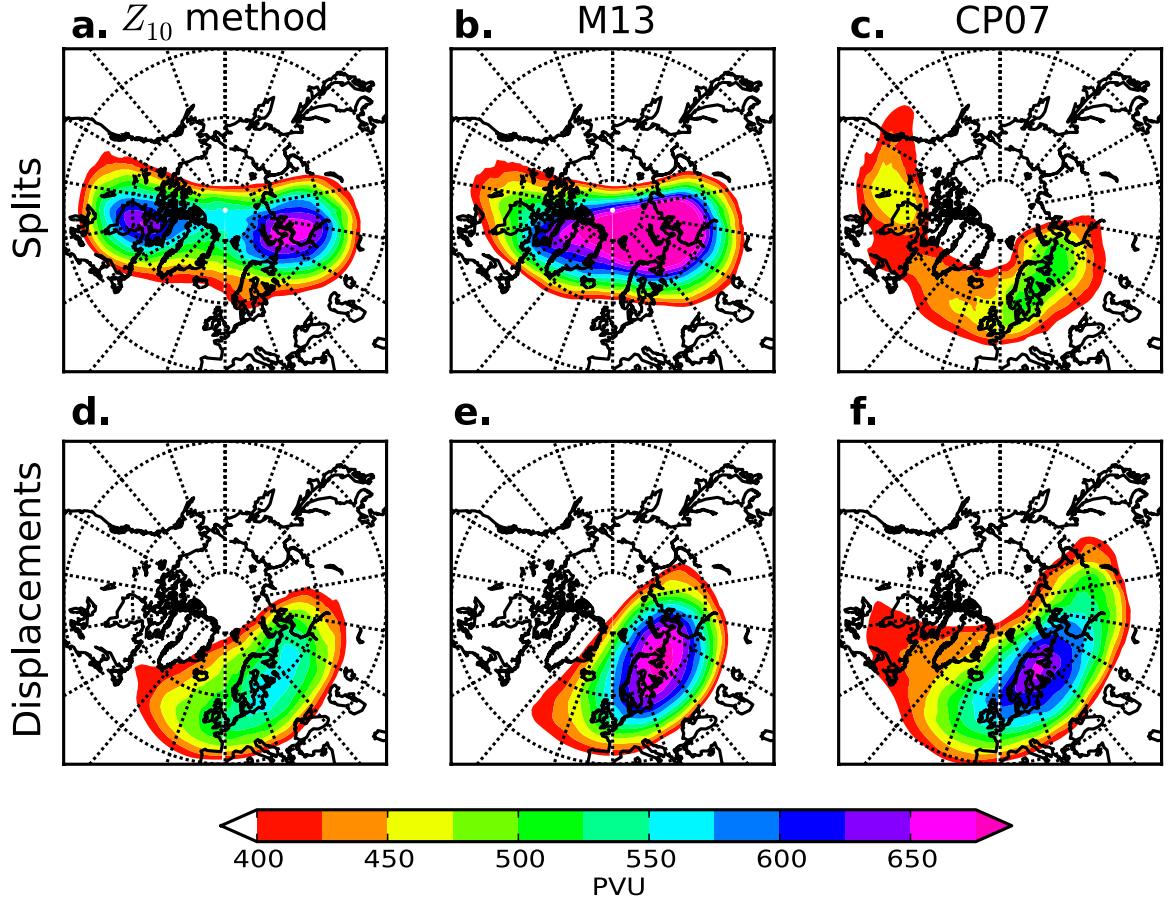


Figure 2.9: Composites of potential vorticity at the 850 K isentropic surface from the ERA reanalysis over 1958-2009. Composites are taken over the 5 days following the onset date of split vortex events (a,b,c) and displaced vortex events (d,e,f). The current (Z_{10}) method (a,b) is compared with that of M13 (b,e) and CP07 (c,f).

centred over Northern Europe, but this extends most westward in the CP07 composite, suggesting that there may be some contamination from misdiagnosed split vortex events.

Overall, Figure 2.9 demonstrates that the current method succeeds (in a composite sense) in identifying displaced and split vortex events events at least as well as the methods of M13 or CP07. When comparing the three methods, CP07 is the clear outlier. This is most likely because the CP07 approach employs a zonal-mean threshold which cannot accurately capture some extreme events (as discussed in M13).

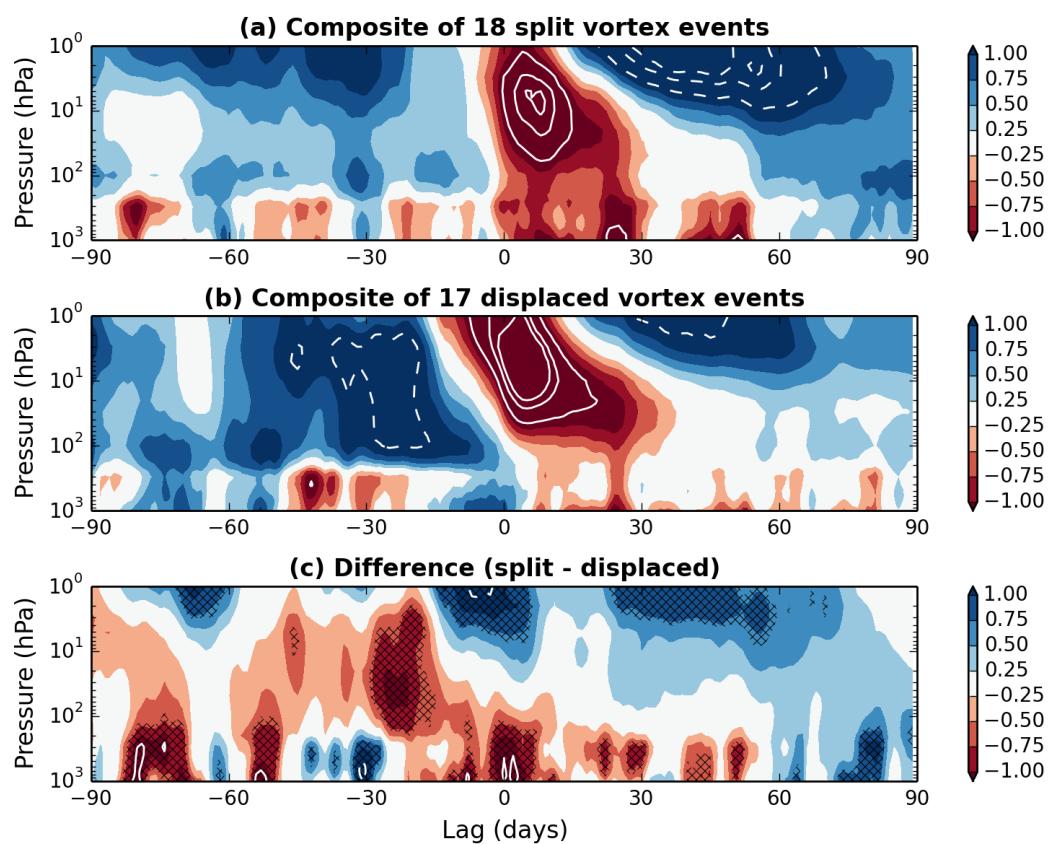


Figure 2.10: Composites of the time-height evolution of the NAM during (a) 17 vortex displacement events and (b) 18 splitting events. (c) shows the difference in these composites, and hashed regions represent those that are 95% significant according to a two-tailed bootstrap test. Lag 0 is at the onset of an event as measured at 10 hPa. Contour intervals are 0.25 and the region between -0.25 and 0.25 is unshaded. Data is from the ECMWF Reanalyses 1958-2009.

2.4 Influence on the troposphere

Having verified that this new method identifies split and displaced vortex events as skillfully as previous methods, it is now possible to study their influence on the troposphere. This is motivated by the result of M13 who, as discussed in Section 1.3.2.1, found tropospheric anomalies to be larger following split vortex events than displaced vortex events. Figure 2.10(a,b) shows time-height composites of the NAM over the 90 days following split and displaced vortex events. Here the method of *Baldwin and Thompson [2009]* is used to define the NAM as the leading empirical orthogonal function (EOF) of daily wintertime (November-April) zonal mean geopotential height anomalies poleward of 20°N . The anomalies are calculated by subtracting the seasonal cycle which has been smoothed with a 90-day low-pass filter. The daily NAM anomalies are then determined by projecting daily geopotential anomalies onto the leading EOF patterns. Finally, the NAM is normalised at each level so that the entire time series has unit variance.

In agreement with M13, it can be seen that the tropospheric NAM is more negative during the 60 days following split vortex events than displaced vortex events. Also similar to M13 is the fact the vertical evolution for the two events greatly differs, with split vortex events occurring almost instantaneously throughout the depth of the atmosphere and displaced vortex taking almost two weeks to propagate through the stratosphere. The near-barotropic nature of split vortex events suggests that resonant excitation of the barotropic normal mode [*Esler and Scott, 2005*] is an important influence in this case.

The difference in the NAM composites (split minus displaced) is shown in Figure 2.10(c). Statistical significance in this difference is calculated with the null hypothesis that there is no difference between the NAM response to split and displaced vortex events, and assessed using a two tailed bootstrap test with the following procedure:

- i. The labels ‘split’ and ‘displacement’ are randomly re-assigned to the 35 events.
- ii. NAM composites and the composite difference of these randomly assigned events are calculated.
- iii. The above steps are repeated 10 000 times, to form a distribution of random composite differences. If the true composite difference lies $< 2.5\%$ or $> 97.5\%$ within this distribution, then it can be said to be 95% significant.

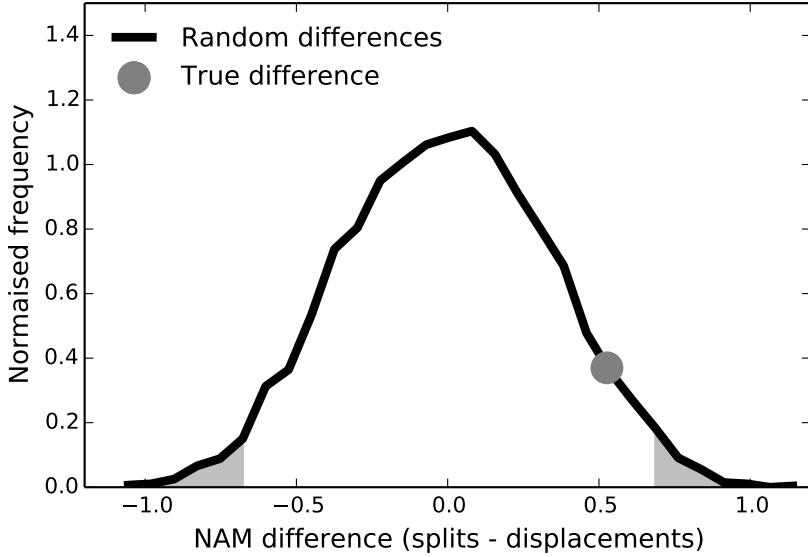


Figure 2.11: Distribution of 0-30 day mean NAM composite differences between split and displaced vortex events, formed by randomly shuffling the labels ‘split’ and ‘displacement’ between events. The 95% significant region (according to a two-tailed test; i.e. < 2.5% and > 97.5%) is shaded and the true composite difference is at the 94th percentile.

Some significant differences are seen between the split and displaced vortex composites. For instance, a more negative stratospheric NAM is seen to precede displaced vortex events, while the dipole in the upper stratospheric and tropospheric NAM near lag 0 represents the difference in baroclinicity of the two types of event. Some regions of significant differences are seen in the tropospheric NAM from 0-60 days, but there are also some regions that are not significant. Care must be taken when interpreting the importance of small significant regions these may arise by chance, even if no physical relationship exists.

The difference in the tropospheric anomalies following split and displaced vortex events is tested more robustly by examining surface anomalies averaged over the 30 days following onset. This difference is again tested using the bootstrap procedure outlined above. The distribution of randomly calculated composite differences along with the true composite difference is shown in Figure 2.11. It can be seen that the true NAM difference does not lie in the 95% significant region, so the null hypothesis that there is no difference between anomalies following split and displaced vortex events cannot be rejected. It should be noted that the statistical test here is different to that carried out by M13. They tested whether the surface NAM following split and displaced vortex events were different from randomly selected winter dates, finding that anomalies following splits are, but those following displacements are not. They did not, however, test the *difference*

2.4. INFLUENCE ON THE TROPOSPHERE

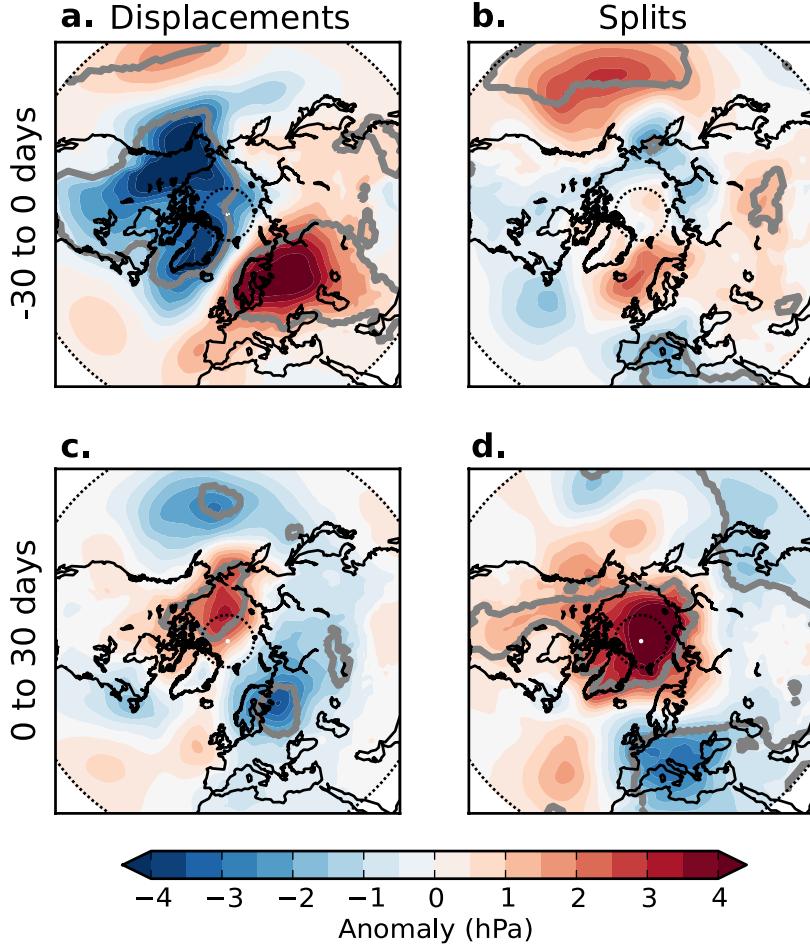


Figure 2.12: Composites of mean sea-level pressure anomalies in the 30 days before (a,b) and 30 days after (c,d) the onset dates of displaced (a,c) and split (b,d) vortex events from the Z_{10} method. Data is from the ECMWF reanalyses (1958–2009). Anomalies are calculated for each day and gridpoint from the climatology for that day of the year and gridpoint. Grey contours indicate regions of greater than 95% statistical significance according to a bootstrap significance test.

between split and displaced vortex events.

The NAM does not provide the full description of surface variability, and so in Figure 2.12 composites of MSLP 30 days before and 30 days following the onset dates of displaced and split vortex events are presented. Statistical significance is calculated against the null hypothesis that anomalies before and after split and displaced vortex events are indistinguishable from other winter dates. This is again estimated from a two-tailed bootstrap test, in which 10 000 composites of equal size are formed from randomly selected winter dates, and the percentile of the true composite calculated from this distribution.

The strongest precursor is found for displaced vortex events, with a wave-1

pattern that is similar to the climatological stationary wave pattern [e.g. *Garfinkel and Hartmann, 2008*], suggesting increased wave-1 propagation into the stratosphere. However, the strongest anomalies following events occur after split vortex events, with a pattern resembling the negative phase of the NAM, though with a southern centre of action shifted towards Europe. A further difference between the split and displaced vortex composites is that their is a more negative MSLP anomaly over Scandinavia and Siberia following displaced vortex event. Overall, the main features of Figure 2.12 compare very well with the corresponding diagnostics from M13.

The mechanism of the stratosphere's influence on the troposphere proposed by *Ambaum and Hoskins [2002]* states that changes in the PV near the tropopause affect the tropopause height and induce tropospheric anomalies below (more details are given in Section 1.3.2.3). In order to investigate this mechanism, composites of tropopause height over the 10 days before, 10 days after, and 10-20 days after split and displaced vortex events are shown in Figure 2.13. The measure of tropopause height used is that of *Wilcox et al. [2012a]*, who construct a blended thermal and dynamical tropopause. Significance is again calculated using a two-tailed bootstrap test.

In line with the MSLP anomalies shown in Figure 2.12, tropopause height anomalies are seen to be larger prior to displaced vortex events, with a wave-1-like structure. Following events, tropopause height anomalies are seen to approximately mirror stratospheric PV anomalies (Figure 2.9). That is, following displaced vortex events an elevated tropopause is seen over Europe and Scandinavia, with a lowered tropopause over Canada, and following split vortex events two regions of elevated tropopause are present over Canada and Siberia with a depression between.

It is possible to quantitatively examine (although only approximately) whether these tropopause anomalies are consistent with changes in stratospheric PV above. Changes in tropopause pressure, Δp_{trop} , are related to changes in stratospheric PV, Δq , through

$$\Delta q \approx -q(1 + Bu) \frac{\Delta p_{\text{trop}}}{p_{\text{trop}}}, \quad (2.14)$$

where Bu is the Burger number, which is approximately equal to one for any PV anomaly [*Ambaum and Hoskins, 2002*]. The change in tropopause height, Δh_{trop}

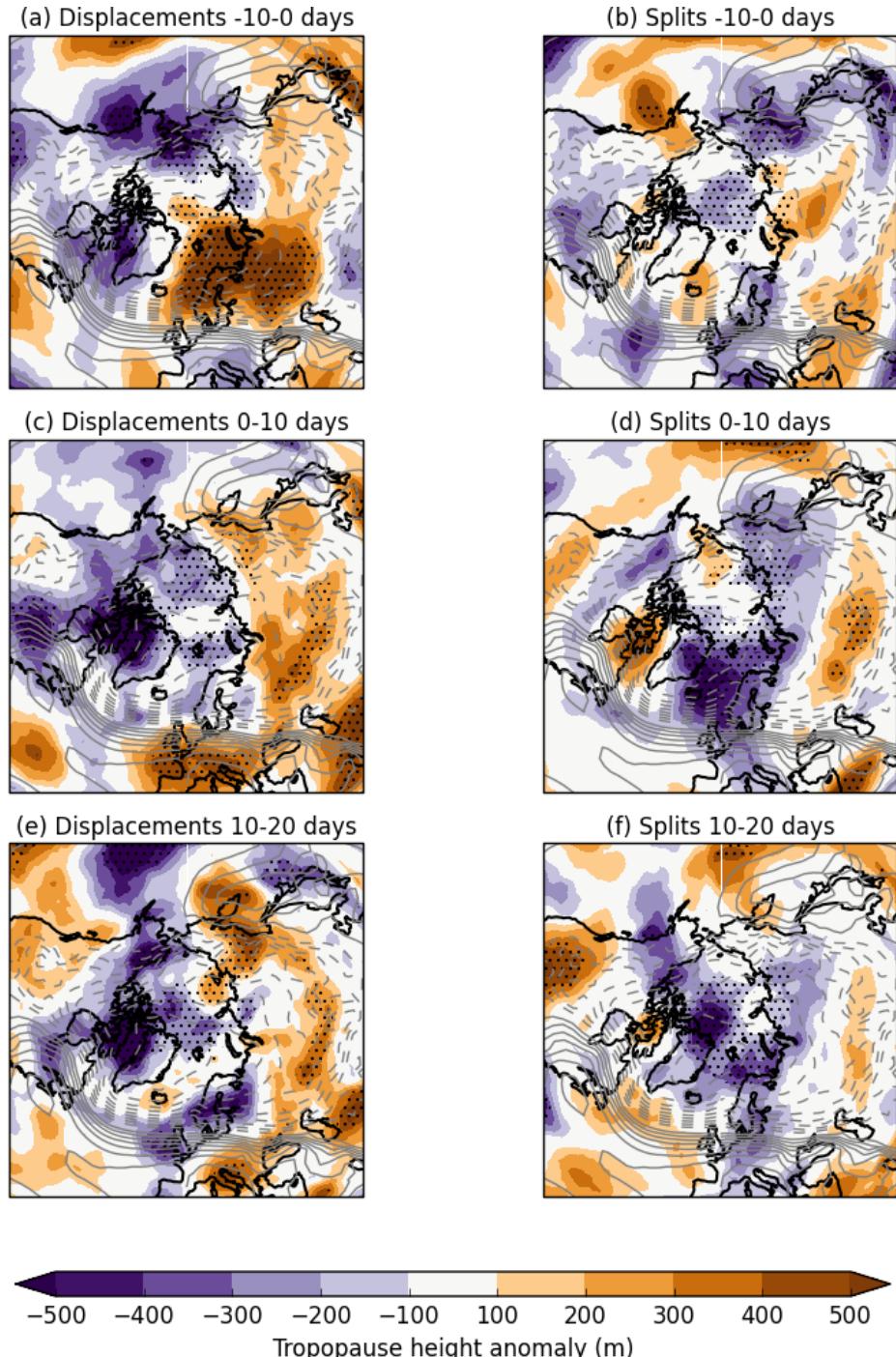


Figure 2.13: Composites of tropopause height anomalies averaged 10 days before (a,b), 10 days after (c,d) and 10-20 days after displaced and split vortex events. Anomalies are calculated for each day and gridpoint from the climatology for that day of the year and gridpoint. Stippling indicates regions of greater than 95% statistical significance according to a Monte-Carlo significance test. Grey contours indicate the first EOF of NH mean sea-level pressure, which explains 33% of the variance (dashes represent negative values).

can be calculated using the hydrostatic relation

$$\Delta h_{\text{trop}} = -\frac{\Delta p_{\text{trop}}}{p_{\text{trop}}} \frac{RT_{\text{trop}}}{g}, \quad (2.15)$$

where T_{trop} is the tropopause temperature. Hence

$$\Delta h_{\text{trop}} = \frac{\Delta q}{q} \frac{RT_{\text{trop}}}{g(1 + Bu)}. \quad (2.16)$$

Using a typical value of the PV change as $\sim 10\%$ (e.g., see Figure 2.9), along with $T_{\text{trop}} = 210\text{K}$, gives a change of tropopause height of $\Delta h_{\text{trop}} \approx 300\text{m}$, which is indeed approximately in line with the tropopause height anomalies seen in Figure 2.13. This, along with the fact that the pattern in tropopause height anomalies approximately mirrors that of stratospheric PV anomalies, suggests that these tropopause height anomalies are induced by changes in stratospheric PV above.

Also shown in Figure 2.13 is the surface NAM pattern (the leading EOF of DJFM daily MSLP). It can be seen that following split vortex events more than displaced (especially days 0-10), the negative tropopause height north of Iceland aligns more closely with the minimum in the NAM (this region is also a node of the NAO). This may be significant if it is expected that the fluctuation-dissipation theorem (FDT) holds in the tropospheric response to stratospheric forcing. For systems in which the FDT holds, the response of a system projected on a mode of variability should linearly scale with the projection of the forcing on that mode [Ring and Plumb, 2008]. Under the assumption that the tropopause height perturbation represents the “forcing”, this may project more strongly on the NAM/NAO following split vortex events, consistent with a greater surface response to these events. Overall, however, the pattern correlations between the split and displaced vortex tropopause height anomalies and the NAM are not statistically significantly different because the tropopause height field is very noisy. In order to give a more detailed analysis a greater number of events would be needed.

2.5 Conclusions

Recent research has demonstrated the need to distinguish between split and displaced stratospheric polar vortex events because of their different dynamics and impacts on the troposphere. However, previous methods to identify these events are impractical for application to climate model or seasonal prediction simulations

2.5. CONCLUSIONS

because they are highly sensitive to model climatology or rely on non-standard variables. Motivated by this, we have developed a new method to identify displaced and split vortex events which requires only geopotential height at 10 hPa. The method is summarised as follows:

- i. To identify the vortex region, a single contour of 10 hPa geopotential height is selected. This is the value of the DJFM mean zonal-mean at 60°N.
- ii. Using this contour the centroid latitude and aspect ratio moment diagnostics can be calculated.
- iii. Events are identified using a threshold criterion: Displaced events are occur if the centroid latitude remains equatorward 66°N for 7 days or more. Split events occur if the aspect ratio remains above 2.4 for 7 days or more. In order to ensure events are not counted twice, no two events may occur within 30 days.

Vortex moment diagnostics derived from geopotential height are highly correlated with those derived from PV, although fewer high aspect ratio values are seen. The use of geopotential height here is motivated by the fact that it is commonly output by climate models, whereas PV is not. However, in cases where PV is available (such as in reanalyses) its use is preferable because of its quasi-conservative properties and smaller-scale features. The above method can be easily adapted to be used with PV-based vortex moments.

Analysis of the stratosphere following events identified by this method demonstrates that it is able to accurately identify split and displaced vortex events. Most of the events identified coincide with those of M13, and about half with events identified by CP07. Composite analysis indicates that the position of the stratospheric polar vortex following these events is at least as extreme as that from the previous methods.

Having identified these events, their impact on the troposphere is investigated. Composites of the NAM indicate a more negative surface NAM over the month following split vortex events than following displaced vortex events. This supports the finding of M13, using a different event identification method and extended data set. However, using a bootstrap test the composite *difference* of the surface NAM is not found to be statistically significant.

Anomalies of tropopause height following split and displaced vortex events are found to be co-located with stratospheric PV anomalies. They are also of a

magnitude consistent with being induced by changes in the stratospheric polar vortex. Surface anomalies induced by changes in tropopause height may explain therefore explain the different surface anomalies following split and displaced vortex events. However, it is not possible to draw firm conclusions on this because of the relatively small number of events and the noise of the MSLP and tropopause height fields.

Overall, statistically significant results about the difference in the tropospheric response to split and displaced vortex events will require a larger number of events. This is achieved through the analysis of climate model simulations in the next chapter.

CHAPTER 3

Representation of vortex variability in climate models

3.1 Introduction

Over the past decade an increasing number of climate models have included a well-resolved stratosphere, with model lids above the stratopause. For example, the fifth Coupled Model Intercomparison Project (CMIP5) [Taylor *et al.*, 2012] includes 15 models with an uppermost level above the stratopause, whereas the previous intercomparison project, CMIP3, includes only five [Cordero and Forster, 2006]. The CMIP5 model simulations are significant in that they are motivated by, and evaluated in the the Intergovernmental Panel on Climate Change (IPCC) Fifth Assessment Report (AR5) [Stocker *et al.*, 2013]. This change in model stratospheric resolution has been largely motivated by an increased understanding of the stratosphere's influence on tropospheric climate (discussed in Gerber *et al.* [2012] and Chapters 1 and 2).

The effect of this greater stratospheric resolution was studied by Charlton-Perez *et al.* [2013], who compared stratospheric variability between high-top and low-top models within the CMIP5 ensemble (they defined “high-top” as a model lid above 1 hPa, and “low-top” below). They found that the low-top models have a weaker and less realistic representation of daily to interannual polar stratospheric variability than high-top models, and attributed this to the fact that the low-top models simulate fewer SSW events than high-top. This is combined with a slightly weaker tropospheric NAM response in the two months following SSW events in the low-top compared to high-top models.

These results are supported by similar studies which compared natural variability in high and low-top versions of the same model. *Cagnazzo and Manzini [2009]* found that a high-top model gave a more realistic representation of the influence of ENSO on the NH extratropical stratosphere. Similarly, *Hardiman et al. [2012]* showed the influence of the QBO on the extratropics as well as decadal trends in the NAO were more realistically simulated by the high-top than the low-top model. These differences have again been linked to the different simulation of SSW events in high- and low-top models [*Sassi et al., 2010*].

Other studies have compared simulations of climate change with high- and low-top models. *Huebener et al. [2007]* linked a increased weakening of the stratospheric polar vortex in high-top simulations to a more southward shift of the NH winter storm track, which in turn affects trends in North Atlantic temperatures and precipitation. *Manzini et al. [2014]* investigated climate change simulations of high- and low-top models in the CMIP5 ensemble. They found that the inter-model spread in the simulation of changes of stratospheric polar vortex winds accounts for a significant fraction of the inter-model spread of trends in the surface NAM under climate change. Interestingly, *Manzini et al. [2014]* also show that global surface temperature trends under climate change (and so climate sensitivity) are larger for high-top compared to low-top models. However, when comparing pairs of high- and low-top versions of the same (or similar) models, little in climate sensitivity difference is detected, and they conclude that this difference is unlikely to have a physical basis.

Despite these findings about the differences between high- and low-top models, it is important to note that a model lid above the stratopause is not a sufficient condition for the accurate representation of stratospheric processes or stratosphere-troposphere coupling. Indeed, *Charlton-Perez et al. [2013]* found that the frequency of SSWs in high-top CMIP5 models varies widely, from about 2.5 to 8 events per decade.

In this chapter we apply the methods developed in Chapter 2 to evaluate the representation of stratospheric polar vortex variability in contemporary climate models. Motivated by these results which demonstrate a more realistic representation of tropospheric and stratospheric climate in high-top models, we select only models with a lid height above the stratopause. In doing this we extend the work of *Charlton-Perez et al. [2013]* to consider the two-dimensional structure of the polar vortex using moment diagnostics, including the identification of split and displaced vortex events.

3.1. INTRODUCTION

The only previous study to apply vortex moment diagnostics to climate model simulations is that of *Mitchell et al.* [2012]. They studied models from the second Chemistry-Climate Model Validation (CCMVal-2) project, although their analysis was limited because only three models of the 18 in CCMVal-2 provided the daily PV which was necessary for the calculation of moment diagnostics. They also did not classify split and displaced vortex events in their analysis. Using the new methods developed in Chapter 2, we are now able to calculate moment diagnostics and classify split and displaced vortex events using geopotential height from a much larger number of models.

There are three main objectives to this investigation. First, we wish to evaluate the current state of models' representation of the stratospheric polar vortex and stratosphere-troposphere coupling, including whether there are any consistent biases among models. Second, we aim to determine if there is a relationship between model parameters (such as horizontal and vertical resolution) and biases in their representation of vortex variability. This may motivate future model improvements to reduce these biases. Third, we investigate whether the increased sample size of the CMIP5 ensemble can be used to better understand the mechanism behind the different tropospheric response to split and displaced vortex events, which was described in Chapter 2.

3.1.1 CMIP5 model simulations

For this analysis only climate models with a lid height above the stratopause are selected from the CMIP5 ensemble. In total, 13 such models were available from 8 different modelling centres. Although another two (CESM1-WACCM and MIROC-ESM) are listed in the CMIP5 ensemble, appropriate data was not found to be available for these models in the CMIP5 archive (<http://pcmdi3.llnl.gov/esgcet/home.htm>). These models are listed in Table 3.1. It can be seen that 12 of the 13 models have an uppermost level which is in the upper mesosphere (70-80 km), but CanESM2 has a significantly lower lid which is very close to the stratopause.

Historical simulations have been used throughout this analysis. These include observed climate forcings, such as from greenhouse gasses, ozone depletion, land-use change, tropospheric and stratospheric aerosols and solar variability. The simulation period considered is limited to 1958-2005, so that it coincides with the ERA-40/ERA-Interim reanalysis period (CMIP5 historical simulations end at 2005). Limiting the model simulation analysis to the same period as observations

may be important because several studies have suggested that external forcing, such as volcanic eruptions and solar variability, has a significant impact on stratospheric variability [e.g., *Kodera*, 1994; *Gray et al.*, 2010]. In order to achieve the largest possible ensemble size, all available ensemble members have been used for each model, which leads to different numbers of years entering the ensemble from different models.

Model	Ensemble size	Lid/ km	Levels	dh/km	dz ₁ /km	dz ₂ /km
CanESM2	5	48.1	35	268	1.48	2.30
CMCC-CESM	1	80.6	39	536	1.49	1.89
CMCC-CMS	1	80.6	95	268	0.65	0.68
GFDL-CM3	5	76.3	48	191	1.32	1.75
HadGEM2-CC	3	84.1	60	144	0.82	1.18
IPSL-CM5A-LR	5	70.4	39	254	1.21	1.75
IPSL-CM5A-MR	3	70.4	39	169	1.21	1.75
IPSL-CM5B-LR	1	70.4	39	254	1.21	1.75
MIROC-ESM-CHEM	1	87.8	80	399	0.77	0.73
MPI-ESM-LR	3	80.6	47	268	0.87	1.70
MPI-ESM-MR	3	80.6	95	268	0.65	0.68
MRI-CGCM3	1	80.6	48	107	0.88	1.87
MRI-ESM1	1	80.6	48	107	0.88	1.87

Table 3.1: Parameters of the CMIP5 models studied in this chapter. Where the model lid is defined in terms of a pressure, its height was estimated using $z = -H\ln(p/p_0)$ with $H = 7$ km and $p_0 = 1000$ hPa. Following *Anstey et al.* [2013], horizontal resolution, dh, is estimated at 45°N and vertical resolution is shown averaged over two regions; 5-15 km (dz₁) and 15-30 km (dz₂).

3.2 Vortex mean state and variability

3.2.1 Moment diagnostics

The centroid latitude and aspect ratio moment diagnostics are calculated for each of the CMIP5 models over DJFM from the 10 hPa geopotential height field, using the method described in Section 2.3.2. For each model the value of the DJFM mean geopotential height at 60°N and 10 hPa is used to define the appropriate contour for the calculation of the moment diagnostics. This accounts for biases in the mean geopotential height between different models.

The resulting joint distributions of daily centroid latitude and aspect ratio from each of the models are shown in Figure 3.1, along with that from the ERA-40/ERA-Interim reanalysis (hereafter ERA) calculated in Chapter 2. For each

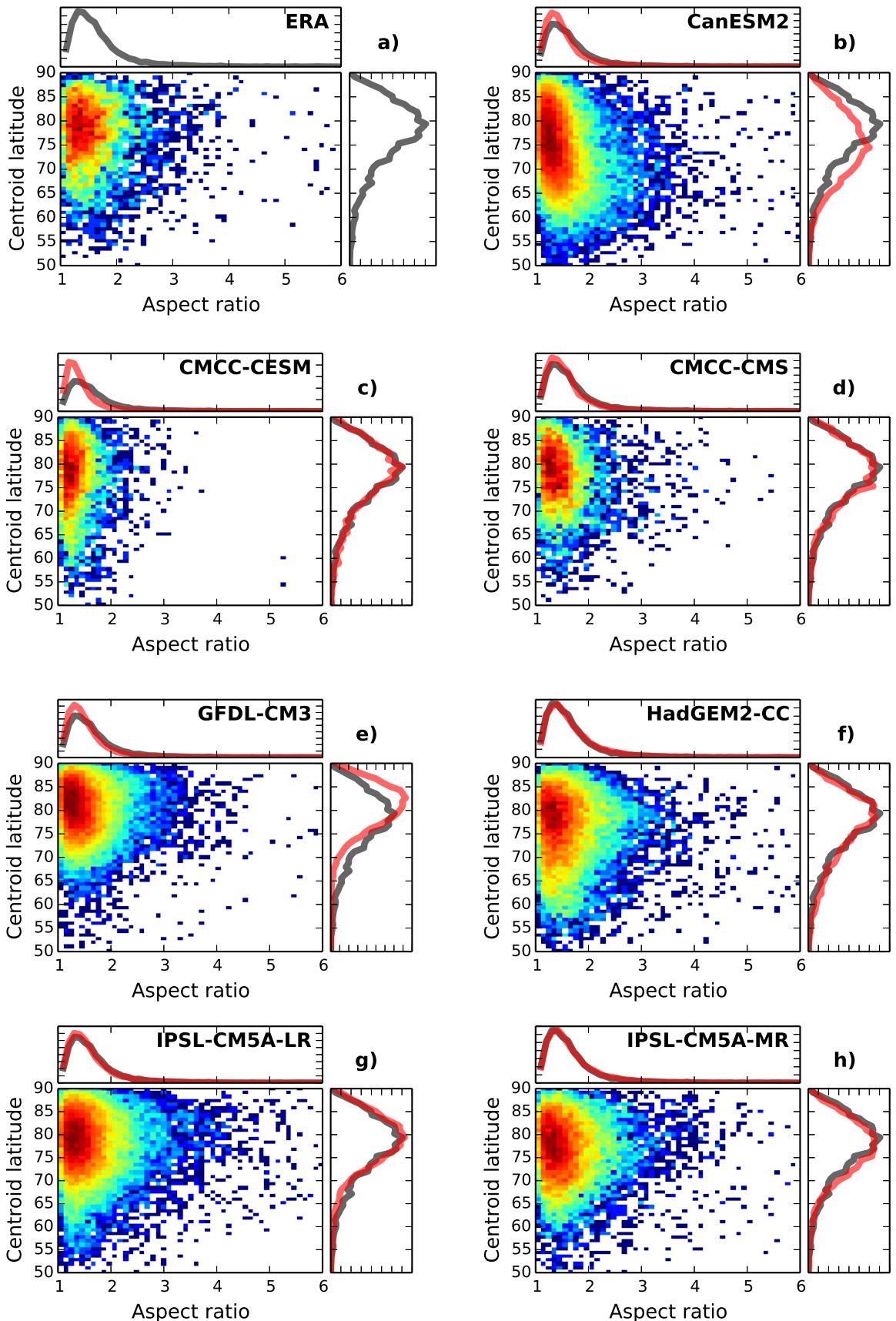


Figure 3.1: Distributions of centroid latitude and aspect ratio for the ERA (grey lines) (a) and the CMIP5 models (red lines). Joint distributions are shown with a logarithmic scale such that red squares represent the densest regions.

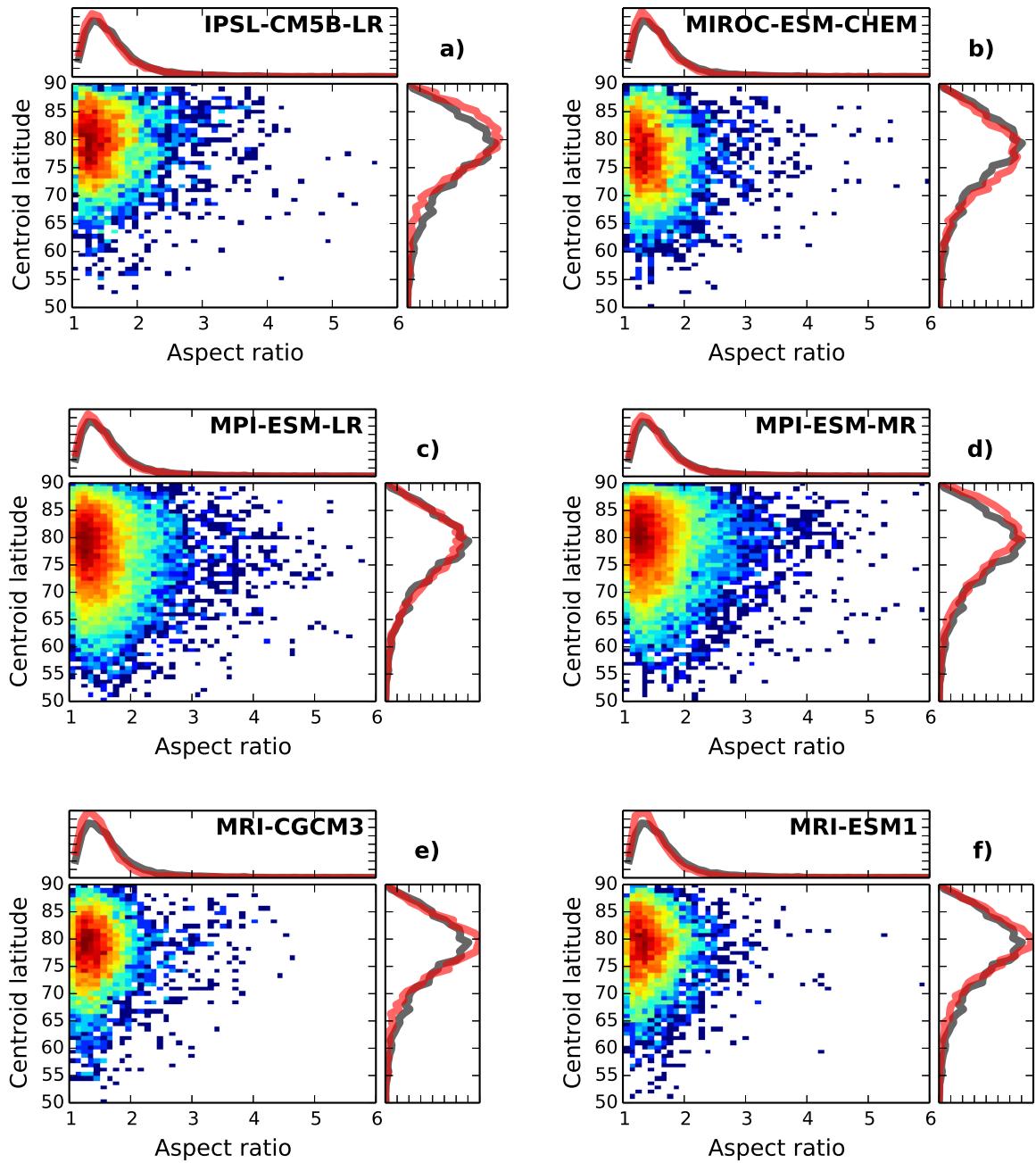


Figure 3.1: (Continued)

3.2. VORTEX MEAN STATE AND VARIABILITY

model the joint distribution histogram is plotted with a logarithmic colour scale which is normalised according to the number of days entering each box. As discussed in Chapter 2, it can be seen that the joint distribution for ERA has an approximately triangular distribution with high aspect ratio/poleward centroid latitude, and low aspect ratio/equatorward centroid latitude being relatively more common than high aspect ratio/equatorward centroid latitude. This shape of distribution is well replicated by most of the models, although CanESM2 has a significantly different shape, with the high aspect ratio/equatorward centroid latitude being more common.

No clear consistent biases among models emerge from this analysis. CanESM2 has a modal centroid latitude which is about 5° too far equatorward compared to reanalysis. Contrastingly, GFDL-CM3 has a modal centroid latitude about 2.5° more poleward than observed. CMCC-CESM displays a clear bias in the aspect ratio, with a distribution much less skewed towards high values than in reanalysis.

The winter seasonal cycle of aspect ratio and centroid a latitude in the CMIP5 models is shown in Figure 3.2. For the mean aspect ratio and centroid latitude, the majority of models agree well with reanalysis. CMCC-CESM has a consistently too low mean aspect ratio, while GFDL-CM3 has a consistently too poleward mean centroid latitude, indicating that these biases are not strongly seasonally dependent. On the other hand, the large equatorward bias in the CanESM2 mean centroid latitude is much larger in December and early January than later in winter. The 95th percentile of aspect ratio is lower than reanalysis for the majority of models throughout the season, indicating that models have, on average, too little variability in aspect ratio

3.2.2 Displaced and split vortex events

Displaced and split vortex events are identified within the CMIP5 ensemble using the threshold-based method described in Section 2.3.3. The same thresholds as used for ERA (66°N for centroid latitude and 2.4 for aspect ratio) are used for the models in order to identify, as much as possible, geometrically equivalent events. The same persistence of 7 days was also used. The frequency of displaced and split vortex events for each model is shown in Figure 3.3.

The total frequency of displaced and split vortex events for each of the CMIP5 models agrees well with the equivalent SSW frequency calculated by *Charlton-Perez et al. [2013]*, who identified events based on the reversal of zonal-mean zonal

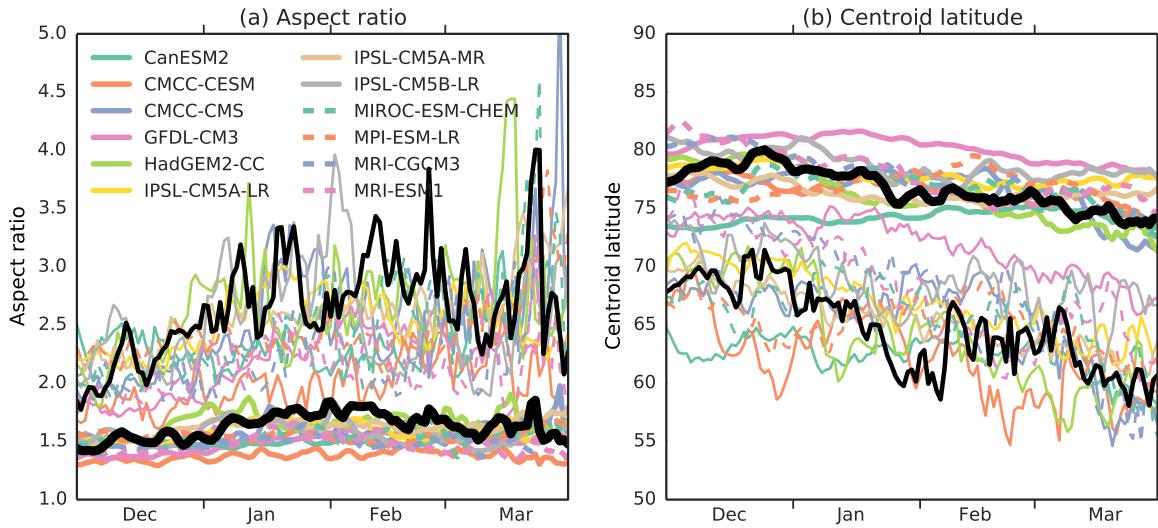


Figure 3.2: Seasonal cycle of aspect ratio and centroid latitude in ERA (black) and the CMIP5 models (colours). Thick lines represent the mean and thin lines the 95th or 5th percentile for aspect ratio and centroid latitude respectively.

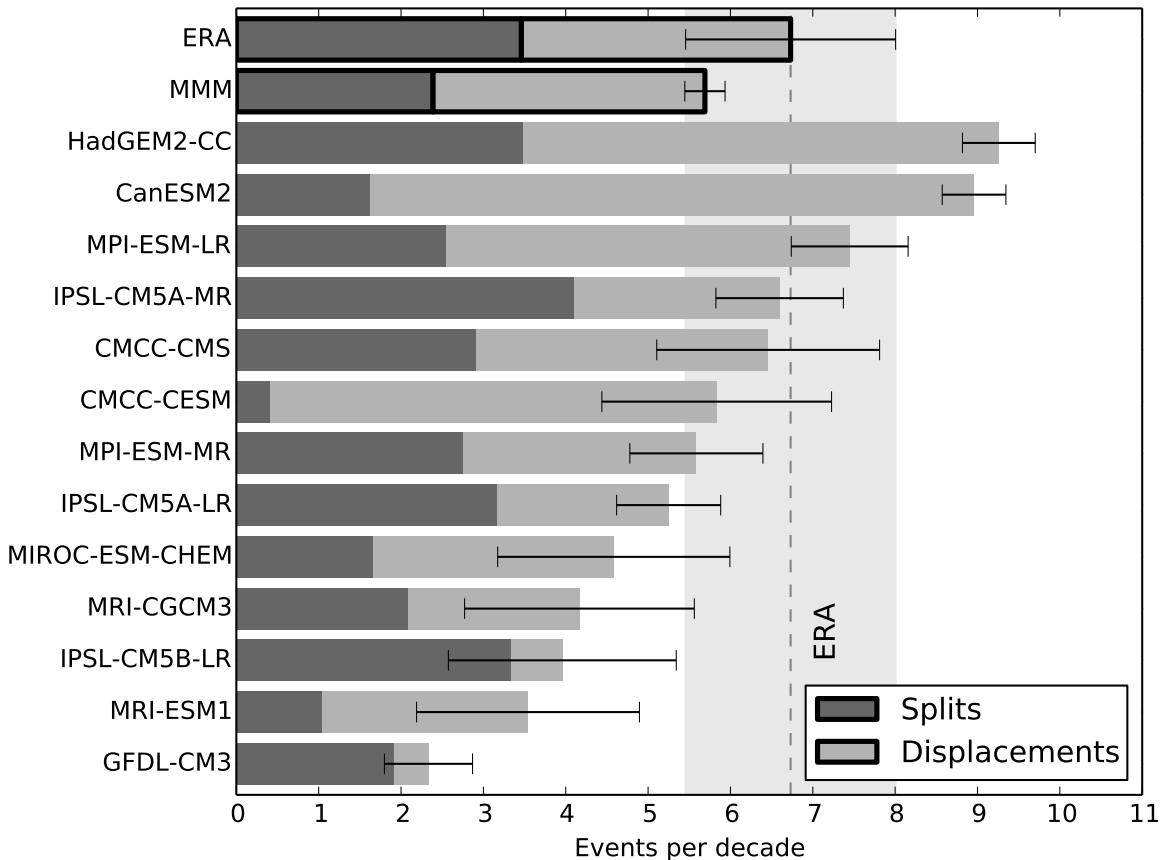


Figure 3.3: Frequency of split and displaced vortex events in the CMIP5 models, ERA, and the multi-model mean (MMM). Error bars are for the frequency of all events, and represent one σ range, assuming a binomial distribution of events. The grey shaded region represents the one σ range for ERA, along with the mean (dashed line.)

3.2. VORTEX MEAN STATE AND VARIABILITY

wind at 60°N and 10 hPa. They also found HadGEM2-CC to have the highest frequency of events within the CMIP5 ensemble, while MRI-CGCM3 is the model with the lowest frequency of SSWs in their study (excluding GFDL-CM3 and MRI-ESM1 which *Charlton-Perez et al.* [2013] did not analyse, MRI-CGCM3 is the second-lowest frequency in the present study). This similarity between *Charlton-Perez et al.* [2013] and the present study indicates that the close relationship between moment diagnostics-defined events and SSWs defined by zonal-mean zonal wind, as described in Chapter 2, also holds for climate models (although this is not explicitly studied here).

As well as the large differences in the total frequency of displaced and split vortex events, it can be seen in Figure 3.3 that the ratio of frequencies of these events varies significantly between models. For instance CanESM2 and CMCC-CESM simulate almost entirely displaced vortex events, while IPSL-CM5B-LR and GFDL-CM3 simulate almost entirely split vortex events. In the multi-model mean (MMM) these biases largely cancel, to give an approximately equal ratio of displaced to split vortex events, which is in agreement with reanalysis.

The seasonal distribution of these displaced and split vortex events is illustrated in Figure 3.4. Some models (CMCC-CMS, HadGEM2-CC and IPSL-CM5A-LR) replicate the observed distribution, with split vortex events being more likely in early winter, and displaced vortex events in late winter. Other models, however, have a very different distribution of events. CanESM2, CMCC-CESM and MPI-ESM-LR all show little seasonal variability in the frequency of events.

It is now considered how model biases in the climatology of the stratospheric polar vortex, discussed in Section 3.2.1, affect the frequency of split and displaced vortex events. The climatological average state of the vortex is defined by the mode – the peak of the probability distribution function – of the aspect ratio and centroid latitude. Unlike the mean, this quantity is not affected by extreme values and it represents the average undisturbed state of the vortex. The peak can be estimated by the maximum value of a histogram, however this introduces significant random errors and is sensitive to the selection of bin size. A more accurate estimation of the mode can be made by fitting the aspect ratio and centroid latitude with a theoretical distribution and then finding the peak of that distribution. Following *Mitchell et al.* [2011], we fit the aspect ratio with a generalised extreme value (GEV) distribution of the form

$$f(x; \mu, \sigma, \xi) = \frac{a^{(-1/\xi)-1}}{\sigma} e^{-a^{-1/\xi}} , \quad (3.1)$$

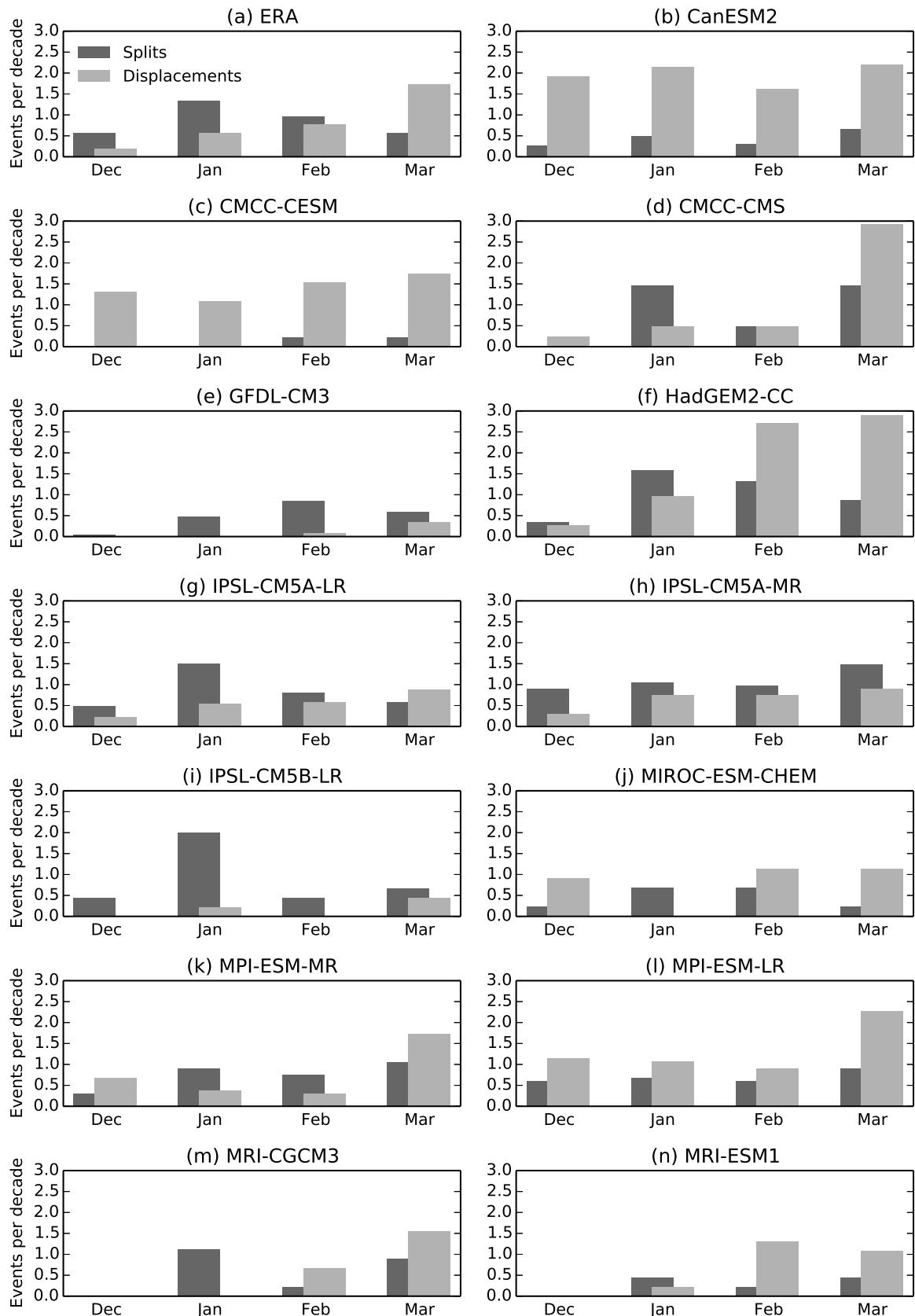


Figure 3.4: Seasonal distribution of the occurrence of split and displaced vortex events in ERA (a) and the CMIP5 models.

with

$$a = 1 + \xi \frac{x - \mu}{\sigma} , \quad (3.2)$$

where μ determines the position of the peak along the x -axis, σ determines the variance of the distribution and ξ the skewness. These parameters are determined using the method of maximum-likelihood estimation [Wilks, 2006]. This method is also used to fit a Gaussian distribution of the form

$$f(x; \mu, \sigma) = \frac{1}{\sigma \sqrt{2\pi}} \left(-\frac{(x - \mu)^2}{2\sigma^2} \right) , \quad (3.3)$$

where μ determines the position of the peak along the x -axis and σ is the standard deviation, to the cube of the centroid latitude, and then the cube root taken to return the original distribution. Mitchell *et al.* [2011] found that these distributions accurately fit the histograms of centroid latitude and aspect ratio in reanalysis data, apart from the extreme tails of the distribution. Qualitative inspection of the distribution for each model confirms that they also provide a similarly good fit to each of the model's histograms.

Figure 3.5 shows the relationship between the modal aspect ratio and centroid latitude and frequency of split and displaced vortex events. It can be seen that strong linear relationships exist; the modal aspect ratio accounts for 79% of the spread in the frequency of split vortex events and the modal centroid latitude accounts for 76% of the spread in the frequency of displaced vortex events. This demonstrates that biases in the average undisturbed state of the vortex account for the vast majority of inter-model spread in the representation of extremes. An implication of this is that the models consistently represent the variability of aspect ratio and centroid latitude, relative to the model climatology.

It can also be seen in Figure 3.5 that the values for ERA lie very close to the best fit lines of the CMIP5 models. This implies that the accuracy of a model's representation of the frequency of displaced and split vortex events can be significantly improved by a more accurate average undisturbed vortex state. Furthermore, while the ERA value for modal centroid latitude lies approximately in the middle of that for the CMIP5 models, only two models have a larger modal aspect ratio than ERA, indicating that a too circularly-symmetric vortex is a common bias among models.

The structure of the stratospheric polar vortex during split and displaced vortex events in the CMIP5 ensemble is shown in Figure 3.6. This displays composites of 10 hPa geopotential height at the onset date of the events for each

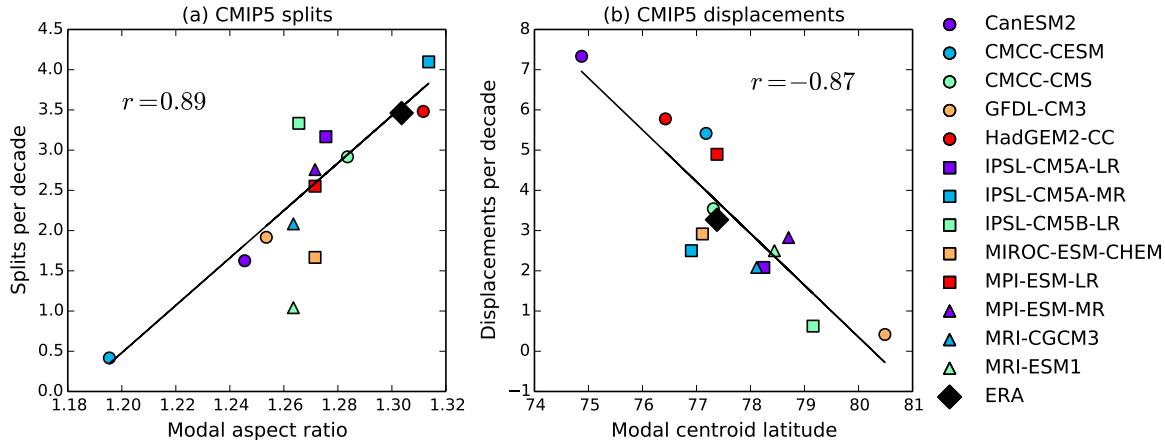


Figure 3.5: Comparison of the DJFM mean aspect ratio with frequency of split vortex events (a) and DJFM mean centroid latitude with frequency of displaced vortex events (b) in the CMIP5 ensemble and ERA. Linear best fits and the correlation coefficients for all the models are also shown.

model. It can be seen that the majority of models accurately reproduce splitting events as occurring along the 90°W - 90°E axis, and displacement events with a vortex shifted towards Scandinavia and Siberia. CanESM2 is an exception to this, with split vortex events which are elliptical but centred quite far from the pole. The IPSL-CM5B-LR model also has a very different appearance of displaced vortex events, although this composite only consists of three events so differences are unlikely to be statistically significant. There is also significant inter-model spread in the relative strengths of the Aleutian and Azores highs during split vortex events. Several models (GFDL-CM3, IPSL-CM5A-LR, IPSL-CM5B-LR, MRI-ESM1) show an approximately equal strength Aleutian and Azores highs, while others (CMCC-CMS, HadGEM2-CC, IPSL-CM5A-MR, MPI-ESM-LR, MPI-ESM-MR, MRI-CGCM2) show a weaker Azores high, which is in closer agreement with reanalysis. The more symmetrical Aleutian and Azores highs indicate a greater dominance of wave-2 activity in split vortex events than is found in observations, where not all split vortex events are dominated by wave-2 activity [Mitchell *et al.*, 2013].

3.3 Stratosphere-troposphere coupling

3.3.1 Zonal-mean response to displaced and split vortex events

The time-height evolution of the atmosphere around split and displaced vortex events in each of the CMIP5 models is displayed in Figure 3.7. This shows com-

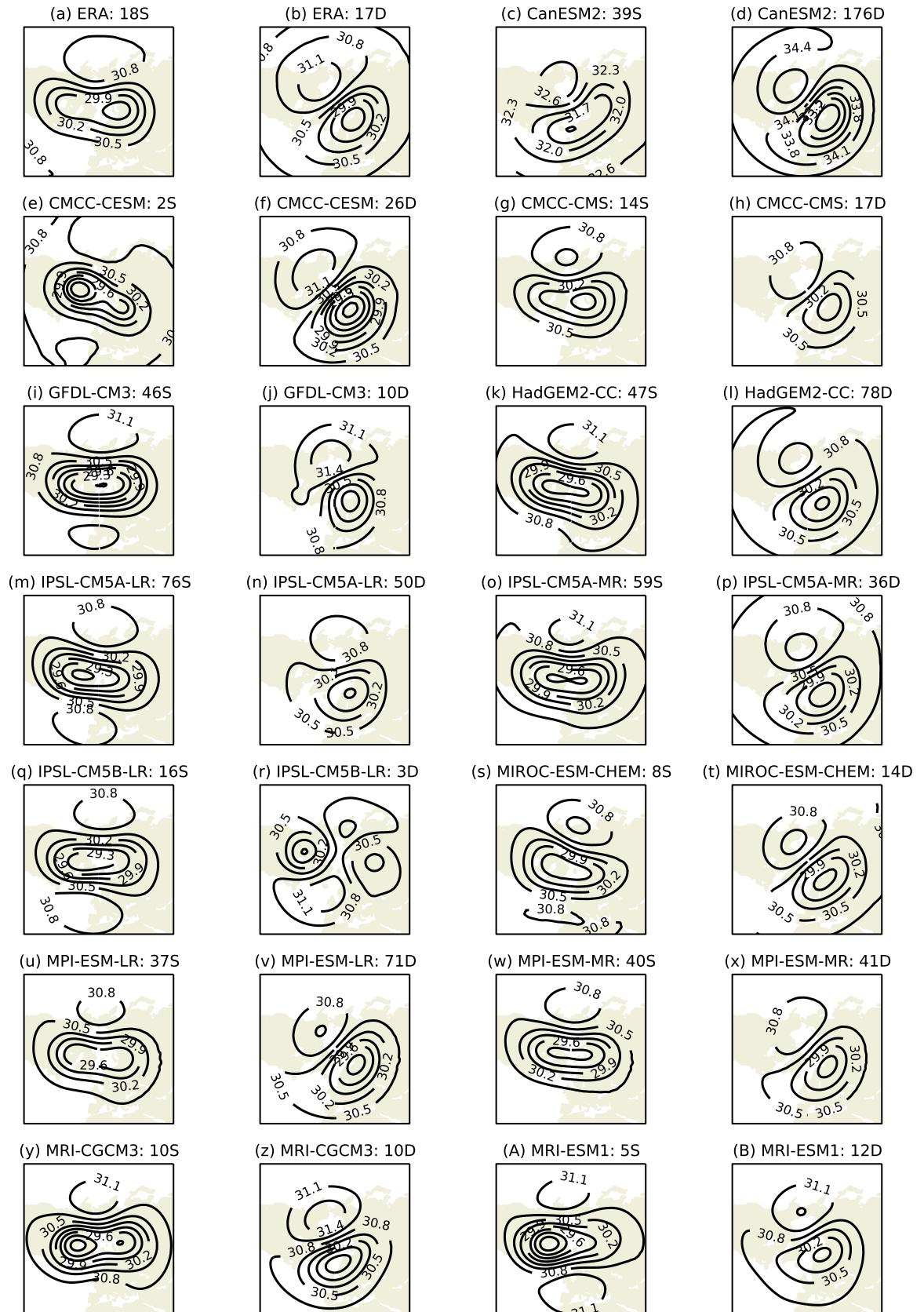


Figure 3.6: Composites of 10 hPa Z at the onset date of split (S) and displaced (D) vortex events in ERA (a,b) and the CMIP5 models. The number of events entering the composite and their type are shown in the title of each plot. The contour interval is 0.3 km.

posites of polar cap (60° - 90° N) geopotential height (Z) anomalies from 90 days before to 90 days following events. The anomalies are calculated from the climatology of each day for each model. The figures extend downwards only to 500 hPa (rather than 1000 hPa). This is because models differ in their representation of geopotential height which is below ground level; some allow negative values, while others set this as an undefined value. This introduces significant errors in the calculation of a climatology and anomalies at levels where the geopotential height is occasionally below ground level. Polar cap Z is highly correlated with the NAM (calculated from zonal mean Z according to the method of *Baldwin and Thompson* [2009]) over the levels shown in Figure 3.7. Indeed, comparing Figures 3.7 (a) and (b) with Figure 2.10 shows that the ERA composites for polar cap Z and the NAM are very similar. In Figure 3.7 the number of events entering each composite is shown in the upper right-hand corner, and it should be noted that composites of a small number of events are likely to be subject to significant statistical uncertainty.

It can be seen that there are large inter-model differences in the evolution of polar cap Z following split and displaced vortex events. For some models (e.g. CanESM2, CMCC-CMS) lower stratospheric anomalies persist for about 45 days, similar to reanalysis, while for others (e.g. IPSL-CM5A-LR, GFDL-CM3) these persist for much longer, beyond 60 days. There are also differences in the stratospheric precursors to events; while some models (e.g. CanESM2, GFDL-CM3, MRI-CGCM3) simulate a stronger negative anomaly prior to displacement events, similar to reanalysis, others (HadGEM2-CC, IPSL-CM5A-MR, MRI-ESM1), show more negative anomalies prior to split vortex events.

Most significantly, there is a large spread in the tropospheric anomalies over the 10-90 days following split and displaced vortex events. Several models (e.g. IPSL-CM5A-LR, IPSL-CM5A-MR, MPI-ESM-LR) show only very weak anomalies below approximately 200 hPa, while others (e.g., CMCC-CESM, GFDL-CM3, MRI-ESM1) show stronger anomalies. Among those models which do show stronger tropospheric anomalies, there are also differences in the relative magnitude following split and displaced vortex events. For instance, for GFDL-CM3, and MRI-ESM1 tropospheric anomalies following displaced vortex events are stronger, while for MIROC-ESM-CHEM and MPI-ESM-MR anomalies following split vortex events are stronger, in closer agreement with reanalysis.

As well as these large inter-model differences, there are also some consistent features among models. Almost all models show a barotropic onset to split vortex

3.3. STRATOSPHERE-TROPOSPHERE COUPLING

events, with anomalies occurring at the same time throughout the depth of the atmosphere. In contrast, displaced vortex events appear more baroclinic, with onset occurring first near 10 hPa. This is consistent with the difference found in reanalysis, indicating that this is likely to be a robust difference between the response to split and displaced vortex events. These features are apparent in the multi-model mean (MMM) (Figures 3.7 C and D). This mean is calculated so as to give each event an equal weight (rather than each model), and so does not give undue weight to models with only a small number of events. On the other hand this does mean that greater weight is given to models with more ensemble members and more events (almost one third of all displaced vortex events come from CanESM2), but the difference in baroclinicity of split and displaced vortex events is observed to be very consistent among models.

3.3.2 Spatial response to displaced and split vortex events

Mean sea-level pressure (MSLP) anomalies averaged over the 30 days following split and displaced vortex events for each of the CMIP5 models are displayed in Figure 3.8. Also shown are the anomalies for ERA (a,b) (the same as Figure 2.12) as well as the multi-model mean (c,d), again calculated so as to give each event an equal weight. The climatology from which anomalies are calculated is determined by a 10-day running mean of the average for each day of the year at each spatial location. The number of events entering each composite is shown, and again, care must be taken interpreting composites of a small number of events due to statistical uncertainty.

Following both split and displaced vortex events, all models show a positive MSLP anomaly near the North Pole, and a negative anomaly centred over Western Europe and the North Atlantic. This pattern is consistent with a negative projection onto the North Atlantic Oscillation. Less consistent among models are anomalies over the North Pacific; many models (e.g. MRI-CGCM3, IPSL-CM5A-LR) show positive anomalies, while MPI-ESM-LR and MPI-ESM-MR have negative anomalies following both split and displaced vortex events. MIROC-ESM-CHEM has different sign anomalies in the North Pacific following split (negative) and displaced (positive) vortex events. In the multi-model mean, a weakly positive North Pacific anomaly is seen.

Figure 3.9 illustrates that this difference in consistency of the Atlantic and Pacific MSLP anomalies also exists in the multi-model ensemble of all events. It

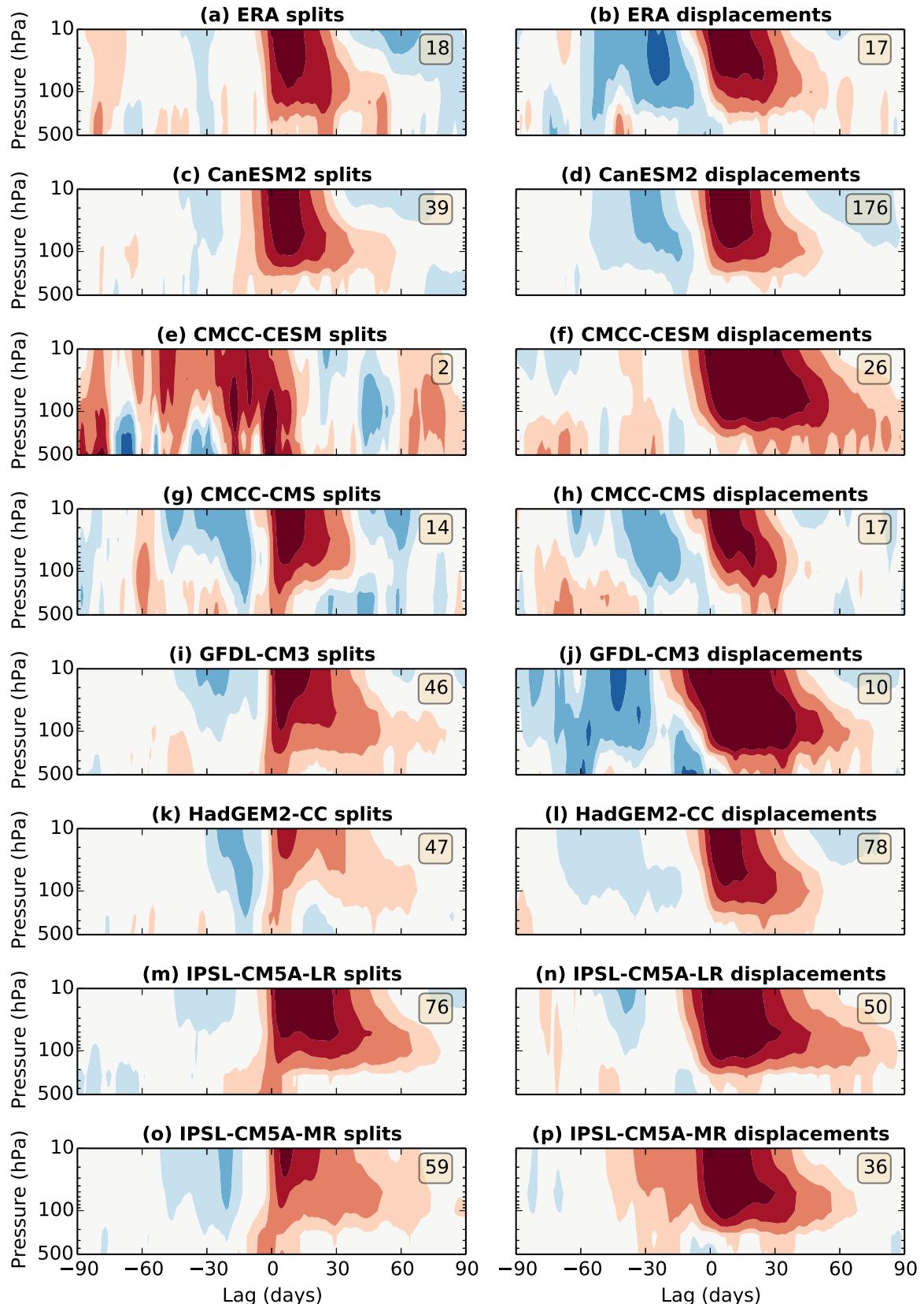


Figure 3.7: Composites of normalised polar cap averaged Z anomalies following split and displaced vortex events in ERA (a,b), the CMIP5 models, and the multi-model mean (C,D). Numbers in the upper right of each plot represent the number of events entering the composite.

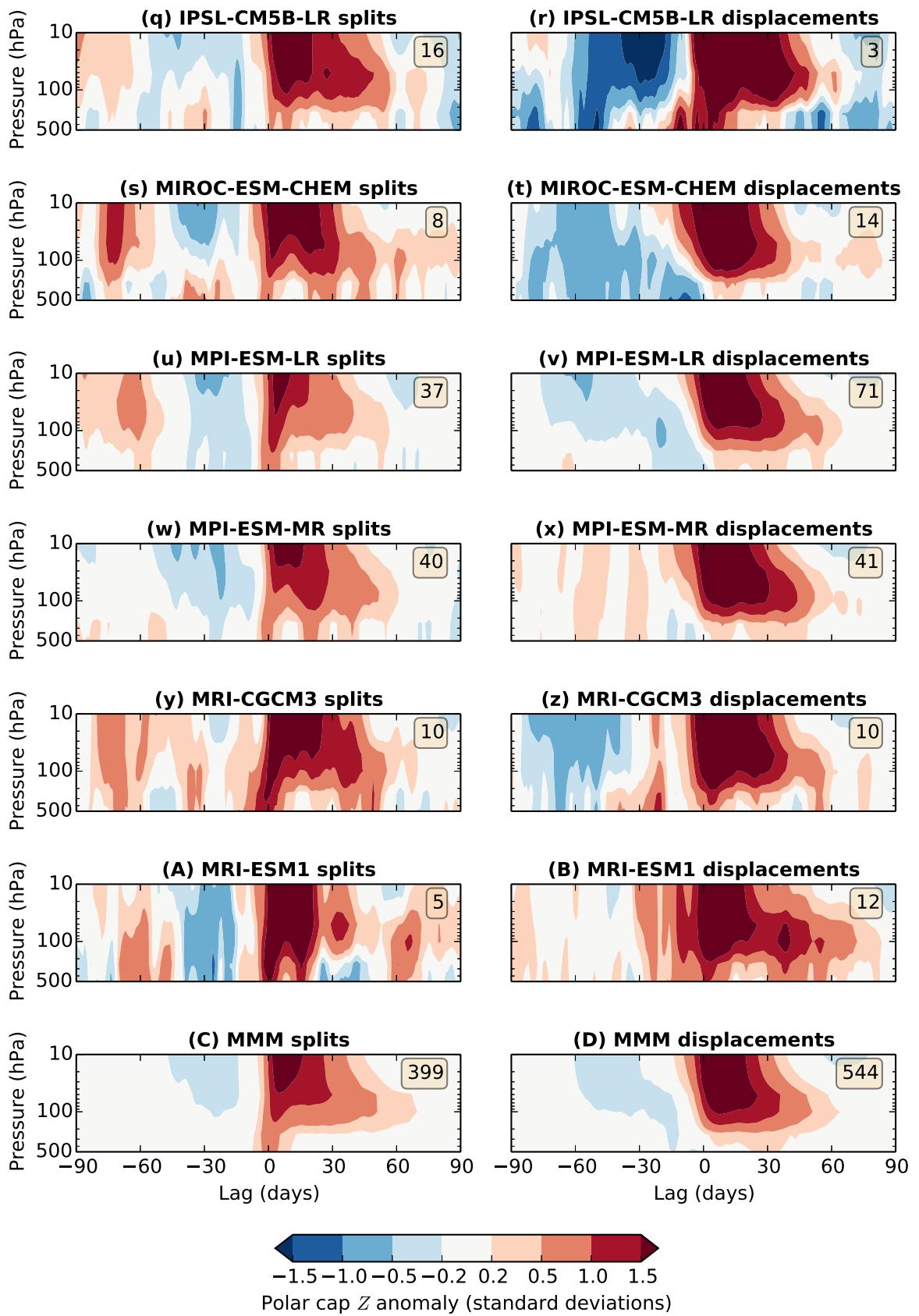


Figure 3.7: (Continued)

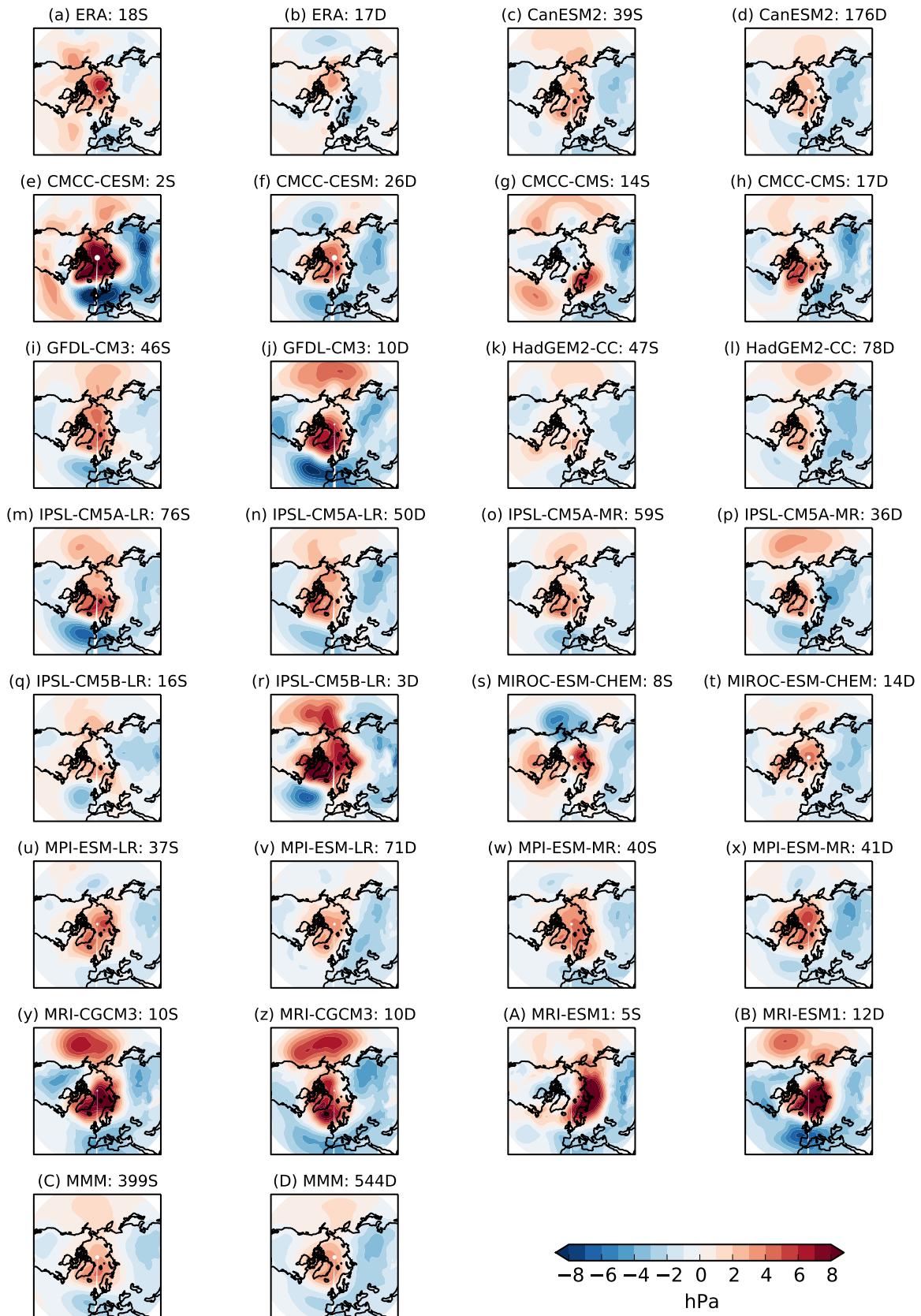


Figure 3.8: Composites of mean sea-level pressure anomalies averaged 0-30 days following split (S) and displaced (D) vortex events in the CMIP5 ensemble. Also shown are the ERA composite (a,b) and the multi-model mean (C,D). The multi-model mean is calculated as to give each event an equal weighting.

3.3. STRATOSPHERE-TROPOSPHERE COUPLING

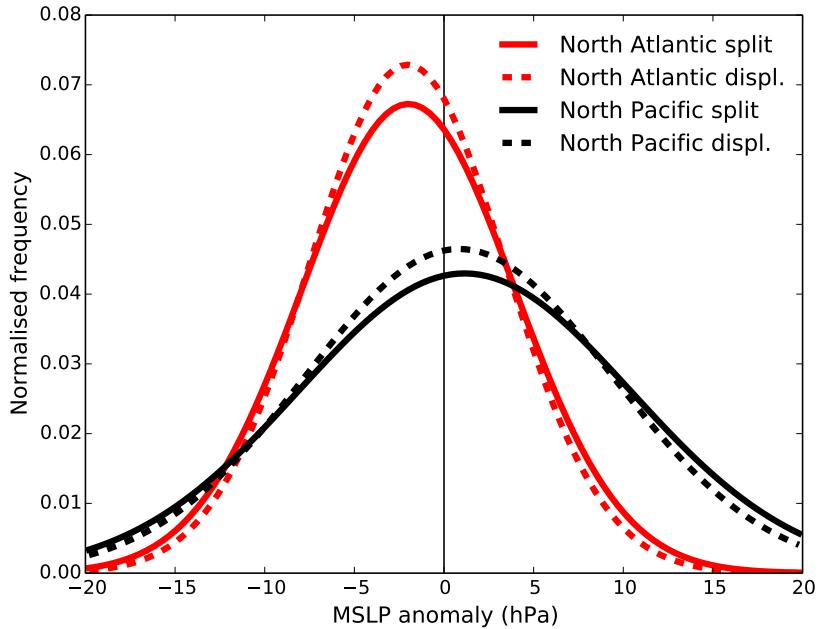


Figure 3.9: Distribution of mean sea-level pressure anomalies in the central North Atlantic ($38^{\circ}\text{N}, 26^{\circ}\text{W}$) and central North Pacific ($45^{\circ}\text{N}, 165^{\circ}\text{W}$) averaged over the 30 days following split and displacement events in all the CMIP5 models. These two locations correspond to centres of action of the NAO and PNA patterns respectively. Data are fitted with a Gaussian distribution.

shows the distribution of MSLP anomalies averaged 30 days following all modelled split and displaced vortex events at the approximate centres of action of the NAO (over the Azores at $38^{\circ}\text{N}, 26^{\circ}$) and the Pacific-North American (PNA) pattern (central North Pacific at $45^{\circ}\text{N}, 165^{\circ}\text{W}$). The North Atlantic distribution is centred further from zero and has a lower variance than the North Pacific distribution for both split and displaced vortex events. This is despite the fact that the standard deviation in monthly winter MSLP is approximately equal in the two regions [Allan and Ansell, 2006], and so again indicates the more consistent North Atlantic response.

This inconsistency in the Pacific anomalies has important consequences for the interpretation of zonal mean anomalies following split and displaced vortex events. For instance, the IPSL-CM5A-LR model shows weak tropospheric anomalies (relative to other models) of polar cap averaged Z following split and displaced vortex events (Figure 3.7 (m,n)), but a relatively strong NAO signal (Figure 3.8 (m,n)), particularly following split vortex events. The reason for this difference is that the model also shows relatively strong positive North Pacific anomalies, that to some extent cancel the North Atlantic anomalies in the polar

cap average. Such an effect would also be seen in the NAM, even if calculated from non zonally-averaged Z , since the surface NAM pattern (the leading EOF of MSLP) has centres of action of the same sign in the North Atlantic and North Pacific [e.g., *Ambaum et al.*, 2001].

A robust difference found between MSLP anomalies following split and displaced vortex events in almost all models and the multi-model mean is that anomalies over Russia and Eastern Europe are more strongly negative following displaced vortex events. In the multi-model mean, this difference has a magnitude of about 2-3 hPa across most of Russia. In order to understand the possible stratospheric influence on this difference, lower stratospheric anomalies are studied. Figure 3.10 shows composites of 100 hPa Z averaged over the 10 days following the onset of split and displaced vortex events. This shorter time period (rather than the 30 days used for the MSLP composites) is chosen to represent the typical time scale of a split or displacement of the vortex, which is shorter than the time scale taken for the re-formation of the vortex and return towards the climatological mean. However, it should be noted that composites taken over the 30 days show similar structure, but with reduced magnitude (not shown).

As well as the composite for each model, and the split minus displaced vortex difference, a multi-model mean is also shown in Figure 3.10 (Q,R,S). Because this is a mean of model absolute values, and models have different climatologies, the MMMs for split and displaced vortices are scaled to have the same hemispheric mean magnitude. This avoids introducing a bias in the climatology of any particular model into the MMM difference.

For all models with the exception of CanESM2, the 100 hPa Z split vortex composite shows an elliptical vortex with the major axis aligned along the 90°W-90°E line which is similar to the composite at 10 hPa (Figure 3.6). For the displaced vortex composite the 100 hPa vortex is centred over Siberia for almost all models, eastward of the 10 hPa composite which is centred over Scandinavia. This again highlights the more barotropic nature of split vortex events compared to baroclinic displaced vortex events, in which the vortex shows a westward tilt with height (as also demonstrated by *Matthewman et al.* [2009]).

In the split minus displaced vortex difference, the majority of models show a large positive region over Russia and Eastern Europe and a negative region centred over northern Canada. The positive region over Siberia has a minimum, which is negative in some cases, located near 90°E, which is consistent with the

3.3. STRATOSPHERE-TROPOSPHERE COUPLING

position of minimum in the split vortex composite. It can be seen that the multi-model mean difference (Figure 3.10 (S)) is remarkably similar to the reanalysis difference (Figure 3.10), both in terms of the location and magnitude of anomalies. This suggests that the CMIP5 models, on average, realistically represent the evolution of split and displaced vortex events through the depth of the stratosphere. Again, this result is consistent among the majority of models, and so not highly sensitive to the exclusion or inclusion of any particular model.

Figure 3.11 shows the split minus displaced vortex composite difference for MSLP averaged 0-30 days following onset and the 100 hPa Z composite difference averaged 0-10 days following onset, for both ERA and the CMIP5 MMM. Statistical significance in the MSLP difference is calculated by a two-tailed bootstrap test with the null hypothesis that the anomalies following split and displaced vortex events are populations from the same probability distribution. The following procedure is used:

1. All events are grouped together and select from them, with replacement, are two random subsets which are equal in size to the total number of split and displaced vortex events respectively.
2. The difference of the averages of these two subsets is taken.
3. The above is repeated 5000 times to form a distribution of random composite differences.
4. If the actual composite difference lies lower than the 2.5% or higher than the 97.5% levels of this distribution then it can be said there is a less than 95% chance that an anomaly at least this large would arise if anomalies following split and displaced vortex events are populations from the same distribution. Hence the null hypothesis can be rejected.

For the case of ERA, very little statistical significance in the composite difference is seen, while in the CMIP5 MMM there are large statistically significant regions. This is due to the greatly increased sample size in CMIP5; a total of 943 events compared to just 35 in ERA.

In the CMIP5 MMM difference the largest feature is the large positive anomaly (a result of a more negative anomaly following displaced vortex events) over Scandinavia, Eastern Europe and Russia. There is also a significant negative anomaly

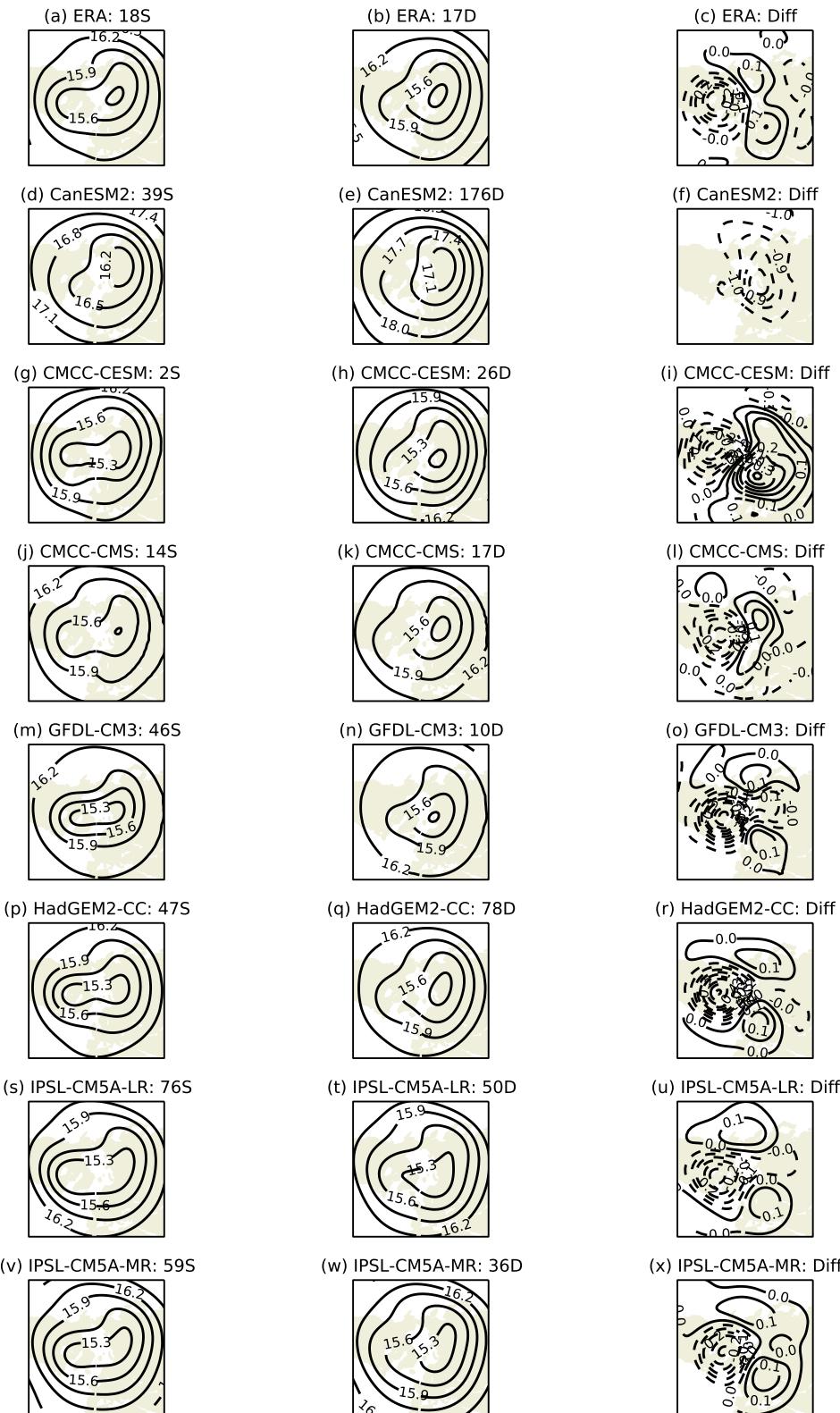


Figure 3.10: Composites of 100 hPa geopotential height (km) averaged in the 10 days following the onset of split (S) and displaced (D) vortex events in ERA, each of the CMIP5 models, and the multi-model mean (MMM). The right hand column displays the difference of splits minus displacements. The multi-model mean is calculated so as to give each event an equal weighting.

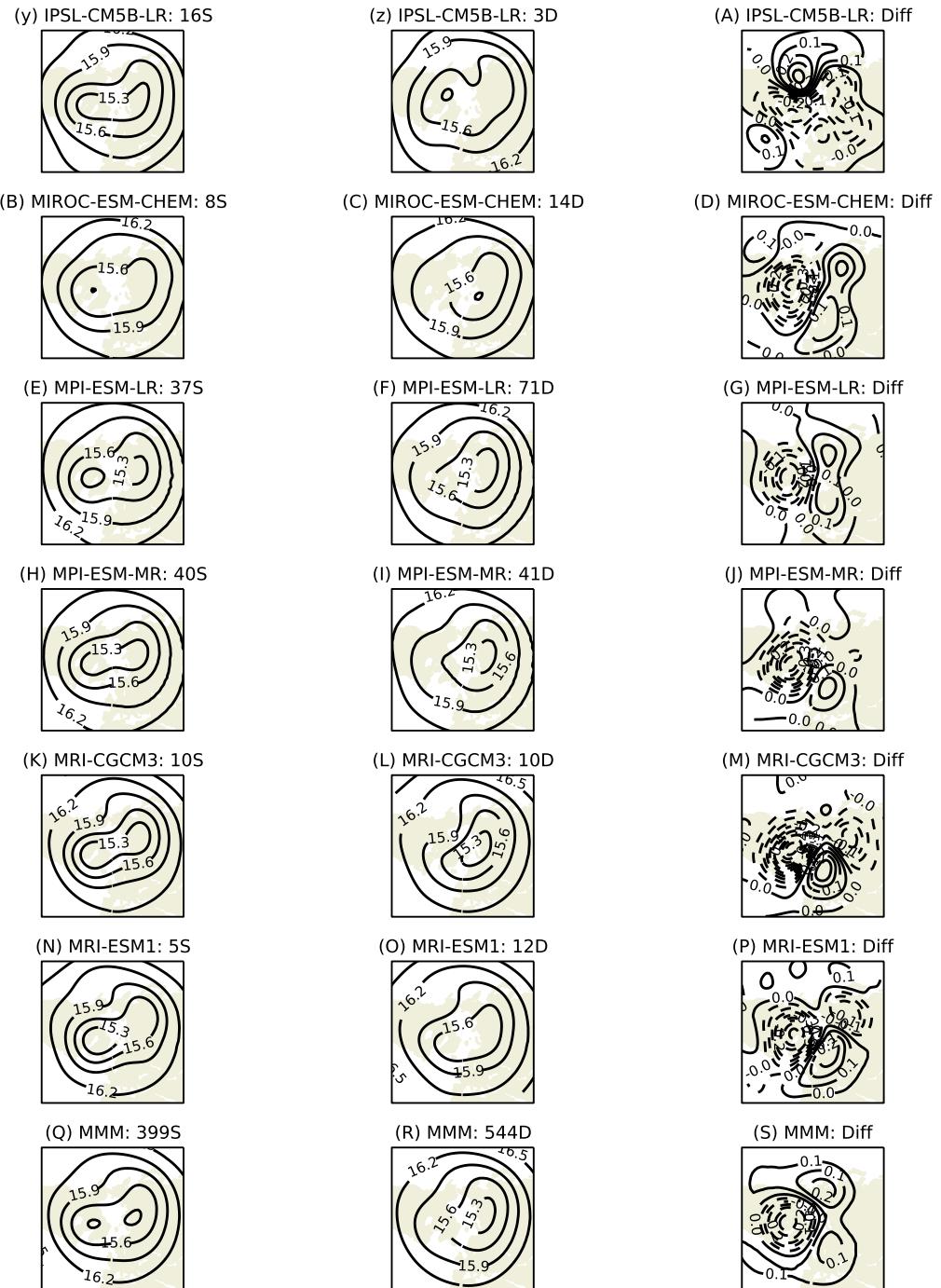


Figure 3.10: (Continued)

over northern Canada and a positive anomaly in the western Atlantic. This pattern is zonally asymmetric and so does not project strongly onto the polar cap average, therefore explaining the small difference in polar cap averaged Z (Figure 3.7 (C,D)). The CMIP5 difference pattern also does not strongly project onto the NAO as there is a similarly negative NAO following both split and displaced vortex events (Figure 3.8 (C,D)). For the ERA MSLP difference there are stronger negative anomalies over Europe (although not statistically significant) and positive anomalies over the North Pole, which does project more strongly onto the NAO, as discussed in Section 2.4.

The CMIP5 difference of Figure 3.11 shows the positive 100 hPa Z anomalies over Siberia over-lie the positive MSLP anomalies, while the negative 100 hPa Z over northern Canada over-lies negative MSLP anomalies. A somewhat similar, but not statistically significant pattern is seen in ERA, although the Siberian anomaly is more polewards and the negative anomaly over Canada is much weaker. Importantly, the 100 hPa pressure surface lies close to the tropopause, and 100 hPa Z can therefore give an indication of tropopause height. Indeed, comparing the 100 hPa Z and tropopause height anomalies for ERA (Figures 3.10 (a,b) and 2.13 (c,d)) shows that anomalous negative Z is approximately co-located with an anomalously high tropopause, although the tropopause height field is much noisier.

3.4 Discussion

3.4.1 Effect of model resolution

We have demonstrated that there are large differences in the representation of the average undisturbed state of the stratospheric polar vortex among high-top CMIP5 models. This amounts to an inter-model range in the modal centroid latitude of more than 5° and in the aspect ratio of 0.12, which corresponds to (77% and 22% of the ERA standard deviation respectively). Because a similar number of models have a poleward as an equatorward centroid latitude bias, the multi-model mean is approximately accurate. In contrast, only two of 14 models have higher modal aspect ratio than reanalysis.

Importantly, we have shown that these biases in the undisturbed state of the vortex are closely related to biases in the frequency of split and displaced vortex events. As a corollary, models therefore have a realistic representation of variability relative to the average state. In order to understand the origin of these

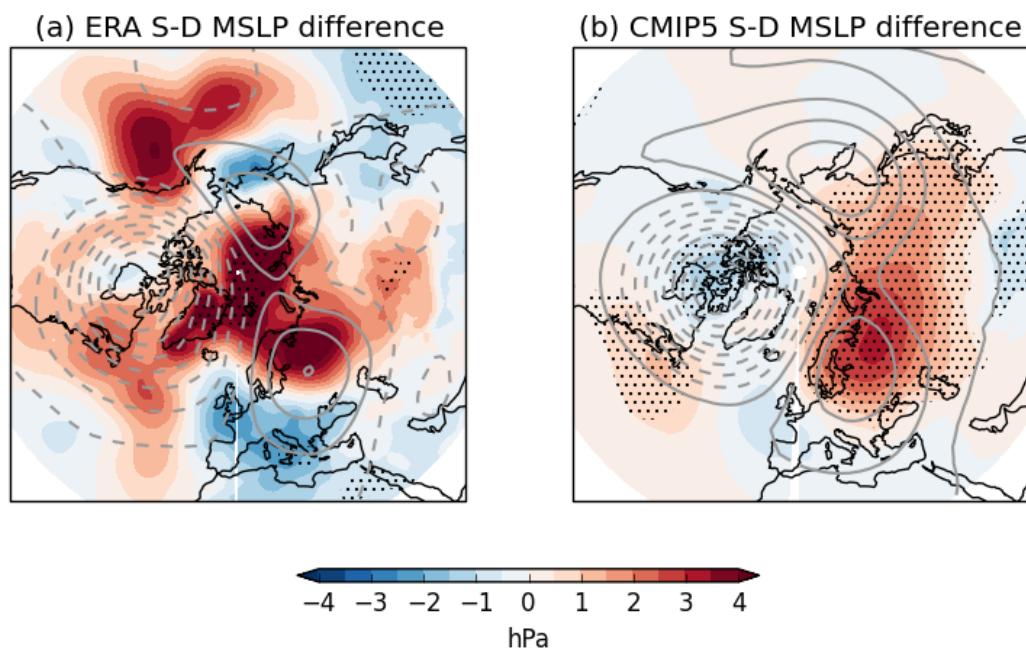


Figure 3.11: Difference (S-D) of composites of mean sea-level pressure averaged 0-30 days following split (S) and displaced (D) vortex events in ERA and the CMIP5 ensemble. Stippling indicates regions that are $>95\%$ significant according to a two-tailed bootstrap test. Grey contours represent the difference in 100 hPa geopotential height averaged 0-10 days following events the contour interval is 40 m, dashed contours represent negative values and the lowest magnitude contours are ± 20 m.

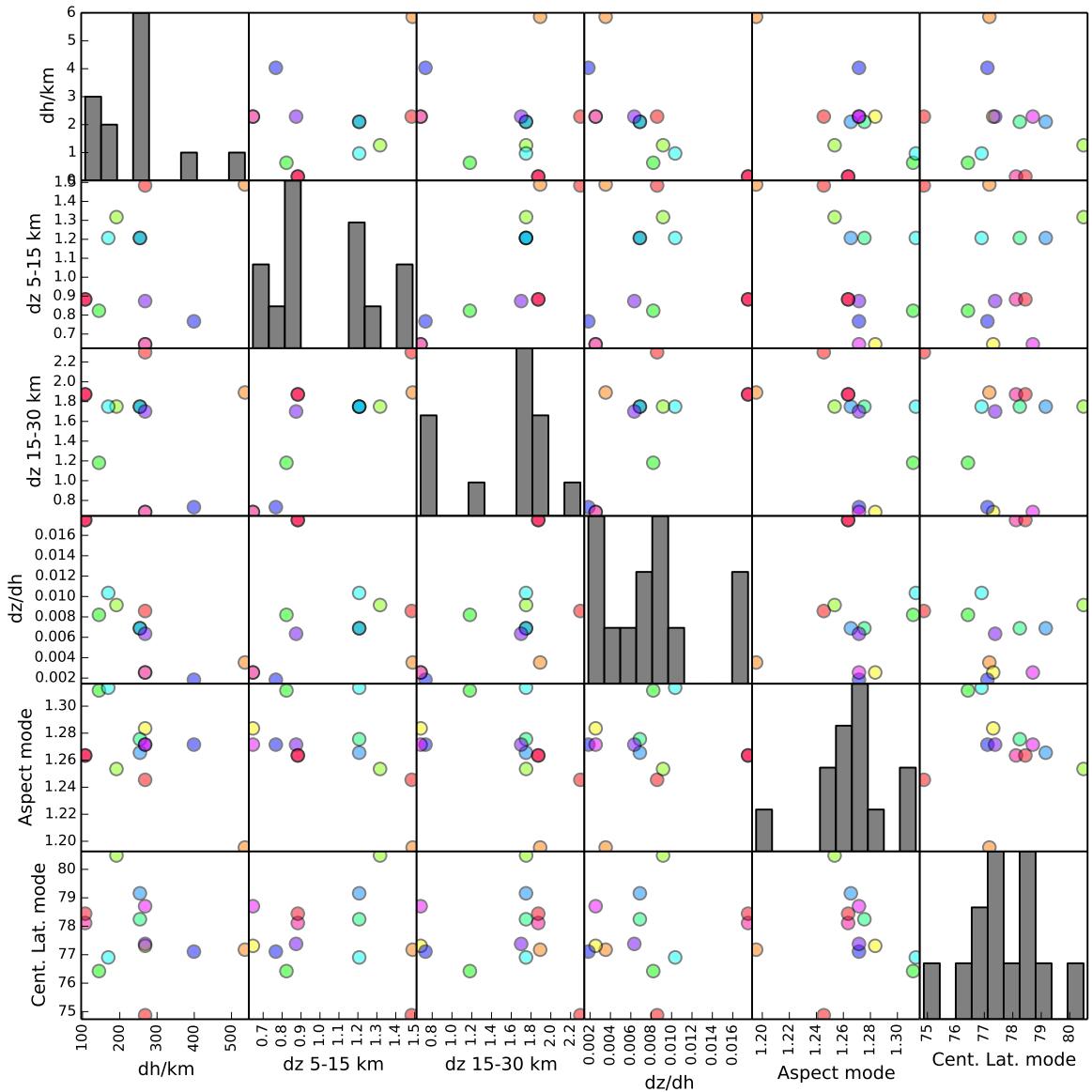


Figure 3.12: Relationship between model resolution, moment diagnostics, and stratosphere-troposphere coupling in the CMIP5 models. Model resolution is shown as horizontal resolution (dh), vertical resolution (dz) over 5-15 km and 15-30 km, and aspect ratio ($dz(5-15 \text{ km})/dh$). Histograms for the relevant quantities are shown along the leading diagonal.

3.4. DISCUSSION

biases we now consider whether any of the model horizontal and vertical resolution properties listed in Table 3.1 are related to models' polar vortex climatology. Figure 3.12 shows the correlations between model resolution and modal aspect ratio and centroid latitude.

There are no statistically significant correlations between the modal aspect ratio or centroid latitude and horizontal resolution or between the centroid latitude and vertical resolution. However, a stronger relationship is found between vertical resolution and the modal aspect ratio and this is shown in more detail in Figure 3.13. The relatively wide scatter of points as well as the small correlation coefficient values indicate that vertical resolution fails to account for a substantial fraction of inter-model variability in the modal aspect ratio. However, the p -values shown indicate a relatively high level of statistical significance for both correlations. It should be noted that these correlations are not highly influenced by outliers. This can be seen by the bootstrap test p -values, as well as the rank correlations which are -0.60 (96.9%) and -0.75 (99.7%) for vertical resolutions over 5-15 km and 15-30 km respectively.

The two measures of vertical resolution, dz (5-15 km) and dz (15-30 km), are themselves correlated (see Figure 3.12), so it is difficult to interpret which region (if any) has the largest impact on the modal aspect ratio. It is interesting to note, however, that *Anstey et al.* [2013] found vertical resolution among CMIP5 models to correlate with increased NH winter blocking frequency. They found the strongest relationship to be with upper-troposphere/lower-stratosphere (UTLS) vertical resolution, which is where we find the strongest correlation with modal aspect ratio (although slightly lower statistical significance; see Figure 3.13). Blocking events are known to be closely linked to stratospheric variability; they influence upwards wave propagation into the stratosphere [*Polvani and Waugh, 2004*; *Woollings et al., 2010*], and may also be affected by downwards the propagation of stratospheric anomalies [*Tomassini et al., 2012*; *Mitchell et al., 2013*; *Vial et al., 2013*]. Hence, the combination of the present study with *Anstey et al.* [2013] may suggest that UTLS vertical resolution is an important factor in the representation of stratosphere-troposphere coupling.

Two important caveats should be noted in interpreting these correlations. First, comparing pairs of models from the same family but with different resolutions does not show a correlation between vertical resolution and modal aspect ratio. In the present ensemble this comparison is limited to IPSL-CM5A-LR/IPSL-CM5A-MR and MPI-ESM-LR/MPI-ESM-MR. It can be seen from Figure 3.13(a) that the

IPSL models have the same vertical resolution but different modal aspect ratios and the MPI models have different vertical resolutions but very similar modal aspect ratios. A similar effect is also seen in comparing vertical resolution and blocking frequency [Anstey *et al.*, 2013]. While this is a very limited comparison of only two pairs of models, it may suggest that it is in fact other model differences which may give rise to the correlations shown in Figure 3.13.

A second caveat is that interpreting this significance, it should be noted that six different relationships between model resolution parameters and moment diagnostics have been tested in Figure 3.12 (treating the measures of vertical resolution as a single parameter since they are highly correlated). Assuming these parameters to be independent (i.e. a binomial distribution), there is an approximately 26% chance of finding at least one 95% significant correlation among those tested if the data are sampled from an uncorrelated distribution.

On the other hand, there is some physical motivation for the importance of UTLS vertical resolution in the representation of stratosphere-troposphere coupling because of the sensitivity of planetary wave propagation to vertical gradients in this region. This sensitivity can be measured by the quasi-geostrophic refractive index, n_s [Matsuno, 1970], with planetary waves tending to propagate towards regions of high n_s and becoming evanescent in regions where $n_s < 0$. It is given by

$$n_s^2 = \frac{\bar{q}_\phi}{a\bar{u}} - \frac{s^2}{a^2 \cos^2 \phi} - \frac{f^2}{4N^2 H^2}, \quad (3.4)$$

where N^2 is the static stability, H scale height, s wavenumber, and

$$\bar{q}_\phi = 2\Omega \cos \phi - \left[\frac{(\bar{u} \cos \phi)_\phi}{a \cos \phi} \right]_\phi - \frac{a}{\rho_0} \left(\frac{\rho_0 f^2}{N^2} \bar{u}_z \right)_z. \quad (3.5)$$

It is therefore apparent that n_s is sensitive both to the vertical gradient in static stability and the vertical shear of zonal wind. Using a linear primitive equation numerical model, Chen and Robinson [1992] found a large vertical gradient in static stability near the tropopause as well as a strong vertical shear of the zonal flow. They found that small changes in these quantities have a large effect on n_s , and therefore that the tropopause acts as a “valve” for the propagation of planetary waves between the troposphere and stratosphere. In a more recent observational study, Grise *et al.* [2010] have confirmed the existence of fine-scale structure in static stability near the tropopause. It therefore may be the case that a higher model vertical resolution near the tropopause is necessary to capture this

3.4. DISCUSSION

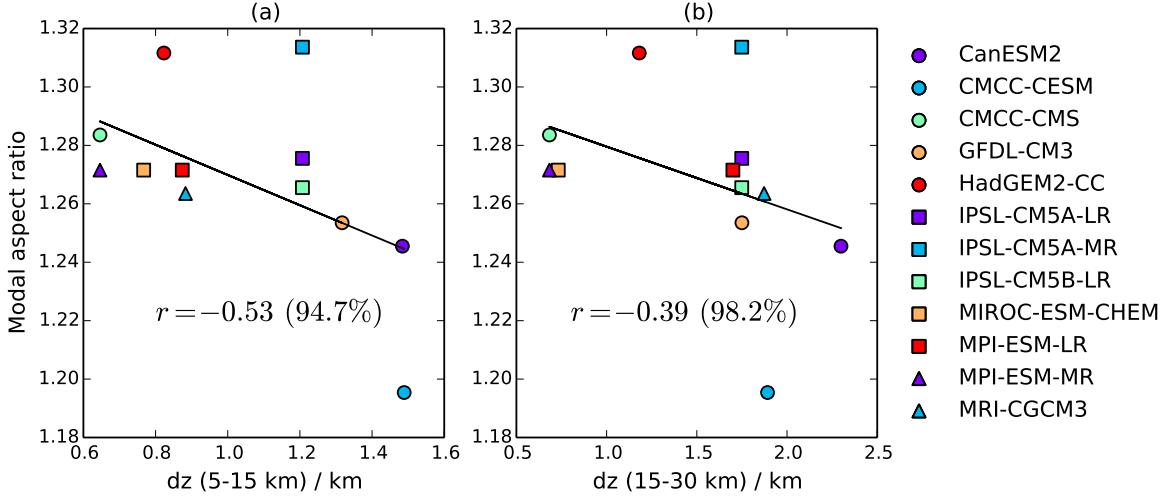


Figure 3.13: Expansion from Figure 3.12 of the correlation between modal aspect ratio and model vertical resolution over two regions (5-15 km and 15-30 km). Correlations, r , are shown along with the p -value calculated by a bootstrap test with null hypothesis $r = 0$.

structure and hence more accurately represent planetary wave propagation from troposphere to stratosphere.

The fact that there is not a significant relationship between the modal centroid latitude and vertical resolution may suggest that wave-2 propagation is more sensitive to vertical resolution than wave-1. This is because aspect ratio is highly correlated with wave-2 activity and centroid latitude with wave-1 [Waugh and Randel, 1999]. It might be expected that wave-2 propagation is more sensitive to near-tropopause resolution because the ‘window’ for permissible wave-2 propagation is narrower (Charney and Drazin [1961]; Equation ??). Hence smaller differences in vertical gradients are required to exclude wave-2 propagation than wave-1 propagation.

Overall, a more systematic study is necessary to understand the importance of UTLS vertical resolution in the representation of stratosphere-troposphere coupling by climate models. This should consist of a ‘clean comparison’ of models in which only vertical resolution is varied, and which therefore avoids the difficulty of interpreting results when many parameters are varied at once as in the CMIP5 ensemble.

3.4.2 Measures of stratosphere-troposphere coupling

We have shown that zonally-averaged quantities such as polar cap Z (which is highly correlated with the NAM) following split and displaced vortex events are

much less consistent among models than the NAO. This inconsistency is dominated by differences in the North Pacific, with some models showing positive MSLP anomalies and others negative.

Following *Baldwin and Dunkerton* [2001], many studies of stratosphere-troposphere coupling have focused on the lag-height behaviour the NAM. For instance the comparison of stratosphere-troposphere coupling in high-top and low-top CMIP5 models by *Charlton-Perez et al.* [2013]. This and several other studies make further approximations as to the zonal nature of the coupling by calculating the NAM based on zonal-mean geopotential height, according to the method of *Baldwin and Thompson* [2009]. Our results suggest that because of the difference in model consistency over the two ocean basins, zonal-mean diagnostics or the NAM alone are not a good descriptors of inter-model variability. Therefore, we suggest that the NAO index or the full two-dimensional surface fields should be shown alongside the NAM when making inter-model comparisons.

This difference between the NAM and NAO signals in CMIP5 models may also give some insight into the physical relevance of these two modes of variability. Some studies have suggested that the NAO is in fact a regional manifestation of the planetary-scale annular structure of the NAM [e.g., *Thompson and Wallace*, 1998; *Wallace and Thompson*, 2002]. Furthermore, many observational studies have asserted that tropospheric anomalies following SSWs represent the NAM [e.g., *Baldwin and Dunkerton*, 1999, 2001; *Thompson et al.*, 2000].

On the other hand, *Ambaum et al.* [2001] suggested that the NAO paradigm is a more physically relevant measure of NH variability than the NAM. They found that MSLP anomalies over the North Atlantic and Pacific are not significantly correlated and argued that the annular NAM pattern is a statistical artifact. *Huth* [2006] also showed that principal component analysis favours the NAO as the more physically relevant mode of variability. Furthermore, *Ambaum and Hoskins* [2002] found that changes in North Pacific tropospheric subtropical and polar jets are much less correlated with the strength of the stratospheric polar vortex than are the North Atlantic jets.

Under the significant assumption that the CMIP5 models can accurately represent the physics underlying these modes of variability, our results tend to favour the NAO rather than the NAM as the more physically relevant mode, at least in terms of stratosphere-troposphere coupling.

3.4.3 Difference between split and displaced vortex events

As well as the consistent NAO signal following split and displaced vortex events, we have found that there are also some consistent differences in anomalies following the two types of event. In particular, MSLP anomalies following displaced vortex events are more negative over Scandinavia and Siberia than following split vortex events. From the fact that these MSLP differences are co-located with 100 hPa Z (Figure 3.11), which is in turn related to tropopause height, it may be possible to gain some understanding of the mechanism behind the difference in the surface response to split and displaced vortex events.

This co-location of surface anomalies and tropopause height is consistent a localised spinup/spindown caused by stretching/compression of the tropospheric column. Changes in tropopause height are, in turn, caused by the bending of isentropic surfaces towards PV anomalies resulting from the movement of the stratospheric polar vortex. Such a mechanism was discussed by *Hartley et al. [1998]*, *Amбаум and Hoskins [2002]*, *Black [2002]*, and in Section 1.3.2.3.

Other mechanisms that have been proposed for stratosphere-troposphere coupling fail to account for these regional differences. For instance, the amplification of intrinsic modes of variability [*Robinson, 1991*] can only explain differences which project onto these modes such as the NAO or NAM, unlike observed difference. Stratosphere-troposphere coupling by the reflection of planetary waves [*Perlitz and Harnick, 2003; Shaw et al., 2010*] also cannot explain the observed difference since it does not project onto the dominant tropospheric planetary wave modes.

This argument relates only to the mechanism underlying the *difference* between the surface responses to split and displaced vortex events, and not to the overall responses. It is important to note that there are many similarities in the responses, especially in the NAO region. All the mechanisms discussed in Section ?? can be used to explain a stratospheric influence on the NAO, and since they are not physically inconsistent with one another, it is possible that a number may operate at the same time.

Unfortunately, the small number of observed split and displaced vortex events combined with large tropospheric noise means there is very little statistical significance in the observed difference of MSLP anomalies (see Figure 3.11(a)). Hence it is not possible to compare our model and observational results for this difference, and there remains the possibility that CMIP5 models do not realistically represent

the surface responses to split and displaced vortex events. Therefore, it is possible that stratosphere-troposphere coupling mechanisms in models are different to those in the real world.

3.5 Conclusions

Applying the method developed in Chapter 2, the climatology of the stratospheric polar vortex and its coupling with the troposphere has been analysed in stratosphere-resolving CMIP5 simulations. Returning to the three main objectives of this chapter (Section 3.1), the following conclusions have been reached:

- 1. How do models represent the stratospheric polar vortex and stratosphere-troposphere coupling?**

A wide range of biases among CMIP5 models has been found in the average state of the stratospheric polar vortex. Some models have a vortex which is too equatorward, while others too poleward. The majority of models have a vortex which is too circularly symmetric. These biases have been shown to relate closely to biases in the frequency of split and displaced vortex events. In the multi-model mean, however, the frequency of these events is in agreement with observations.

Almost all models accurately simulate the more barotropic nature of split vortex events compared to displaced vortex events. MSLP anomalies following these events consistently show a negative NAO in line with observations, but are much less consistent in the North Pacific, leading to a large spread when zonal mean quantities are investigated.

- 2. Is model resolution related to vortex variability?**

There is a statistically significant correlation between near-tropopause vertical resolution and modal aspect ratio among models. However, this relationship is not seen among the two pairs of models from the same family. On the other hand, the tropopause region is known to be important for the propagation of planetary waves due to high vertical gradients of zonal wind shear and static stability. This may be suggestive of the need for high vertical resolution to accurately simulate stratospheric planetary wave activity and hence vortex aspect ratio. No relationships have been found between horizontal resolution and vortex variability.

3.5. CONCLUSIONS

3. Can models be used to understand mechanisms behind stratosphere-troposphere coupling?

Consistent differences in the MSLP anomalies following split and displaced vortex events in the CMIP5 models have been found to be co-located with the difference in near-tropopause Z anomalies. This is consistent with a localised tropospheric response to stretching or compression of the tropospheric column being the mechanism behind the different responses to the two events. It also excludes mechanisms which rely on projections onto major modes of variability such as the NAO or NAM. This result only applies to the difference between responses to split and displaced vortex events, not the individual responses, which share many similarities.

CHAPTER 3. REPRESENTATION OF VORTEX VARIABILITY IN CLIMATE MODELS

CHAPTER 4

The role of the stratosphere in seasonal prediction

Most of work in this chapter which relates to the Southern Hemisphere was published in *Journal of Climate* [?].

4.1 Introduction

Accurate prediction of the atmospheric circulation several months in advance relies on the presence of low-frequency predictable signals in the climate system. It has now been demonstrated that the stratosphere is an important pathway for the communication of predictable tropical signals across the globe; in particular, the El Niño-Southern Oscillation (ENSO) [Bell *et al.*, 2009; Ineson and Scaife, 2009; Hurwitz *et al.*, 2011], Quasi-Biennial Oscillation (QBO) [Marshall and Scaife, 2009; Garfinkel and Hartmann, 2011], and 11-year solar cycle [Haigh, 2003; Gray *et al.*, 2013]. These teleconnections allow for the possibility of significant predictability in regions remote from the direct effect of the signal. Despite this, many operational seasonal forecast models include only a poor representation of the stratosphere [Maycock *et al.*, 2011], and it has been suggested that this contributes to their lack of seasonal forecast skill in the extratropics [Smith *et al.*, 2012].

Furthermore, because stratospheric anomalies persist for longer than those in the troposphere and can influence surface weather patterns [e.g., Baldwin and Dunkerton, 2001], the initial conditions of the stratosphere itself can act as a source of enhanced predictability [Baldwin *et al.*, 2003; Charlton *et al.*, 2003; Hardiman *et al.*, 2011]. The effect of the stratosphere on the troposphere is especially pronounced

following SSW events, and past work has focused on the influence of these events on forecast skill. For instance, both *Kuroda* [2008] and *Sigmond et al.* [2013] found that enhanced tropospheric predictability can be obtained if forecasts are initialised at the onset of SSW events. However, SSWs are highly nonlinear events which are not predictable beyond about two weeks in advance in current forecast systems [*Marshall and Scaife*, 2010], limiting their usefulness in seasonal prediction. SSWs also occur almost exclusively in the Northern Hemisphere (NH), with only one event in the approximately 60 year record having been observed in the Southern Hemisphere (SH), in September 2002 [*Roscoe et al.*, 2005].

The rarity of SSWs in the SH is a result of less dynamical forcing from vertically propagating planetary waves in the SH relative to the NH stratosphere. This, in turn, comes about because of lesser SH orography and land-sea temperature contrasts which can excite planetary waves. This reduced variability also means that anomalies in the Antarctic stratosphere persist for longer than those in the Arctic [*Simpson et al.*, 2011]. Hence, the SH stratospheric circulation may be predictable on longer time scales, and thus more useful for seasonal forecasts despite the lack of SSWs. Indeed, *Thompson et al.* [2005] and *Son et al.* [2013] have found that smaller-amplitude variations in the Antarctic stratospheric polar vortex are followed by coherent temperature and pressure anomalies at the Earth's surface which resemble the Southern Annular Mode (SAM) pattern. These observations led *Roff et al.* [2011] to find that improved forecasts of the SAM up to 30 days ahead may be achieved with a stratosphere-resolving model. The SAM is the dominant mode of variability of the extratropical Southern Hemisphere sea-level pressure and affects the position of storm tracks, rainfall, surface air temperature, and ocean temperatures across the extratropics [e.g., *Silvestri and Vera*, 2003; *Reason and Rouault*, 2005; *Hendon et al.*, 2007]. As such, there are considerable societal benefits, and interests in its prediction [*Lim et al.*, 2013].

Another reason for interest in the prediction of the Antarctic stratosphere is the interannual variability in springtime ozone depletion, which can significantly affect the amount of harmful ultraviolet radiation reaching the Earth's surface over the Southern Hemisphere. The magnitude of this interannual variability is a significant fraction of the magnitude of long-term depletion caused by emission of chlorofluorocarbons (CFCs) and other ozone-depleting substances. While ozone-depleted air is confined over the polar region by the stratospheric polar vortex during winter and spring (resulting in the ozone hole), this air is released to mid-latitudes following the ultimate breakdown of the vortex (final warming) in late

4.1. INTRODUCTION

spring/early summer. The extent of the resulting summertime ozone depletion is largely determined by the total deficit in ozone over the Antarctic during spring [*Bodeker et al., 2005*].

Salby et al. [2012] have shown that interannual variations in Antarctic ozone depletion are highly correlated with changes in planetary wave forcing of the stratosphere. They found that the anomalous vertical Eliassen-Palm (EP) flux (a measure of meridional eddy heat flux) at 70 hPa poleward of 40°S during August–September explains almost all the interannual variance of anomalous ozone depletion during September–November. Using this relationship, they postulate that accurate prediction of planetary wave forcing could allow skillful seasonal forecasts of ozone depletion.

The influence of planetary wave forcing on ozone depletion comes about through both chemical and dynamical mechanisms. Planetary wave breaking causes an increase of the strength of the stratospheric residual mean meridional circulation [*Haynes et al., 1991*], with a resultant increase in large-scale descent and adiabatic warming over the pole. This warming inhibits the formation of polar stratospheric clouds which have a vital role in the activation of halogen species that cause the chemical depletion of ozone. The increased meridional circulation as well as an enhancement of horizontal two-way mixing caused by planetary wave breaking, also causes an increase in the dynamical transport of tropical ozone-rich air to the polar regions, further increasing ozone concentrations. Breaking planetary waves can also modify the geometry of the stratospheric polar vortex, stripping away elements of ozone-depleted air [*Waugh et al., 1994*], or in the extreme case of the 2002 SSW causing the ozone hole to split in two [*Charlton et al., 2005*].

Here, we address directly the predictability of the stratospheric polar vortices using a set of historical hindcasts (or historical re-forecasts) from a new operational seasonal forecast system with a fully stratosphere-resolving general circulation model. The system accurately simulates the climatology of the NH stratospheric polar vortex including the aspect ratio and centroid latitude. However, we find it does not skilfully predict the winter mean vortex strength, the occurrence of SSWs, or split and displaced vortex events. On the other hand, we find significant skill in the prediction of the Antarctic stratospheric polar vortex up to four months in advance, including for the 2002 SSW. Using the observed relationship between column ozone quantities and the stratospheric circulation, we are then able to infer skillful predictions of springtime ozone depletion, confirming the

hypothesis of *Salby et al.* [2012]. This exceeds the lead-time of other contemporary ozone forecasts, which are typically no more than two weeks [*Eskes*, 2005]. The forecast system also shows significant levels of skill in the prediction of the surface SAM at seasonal lead times. By studying the variation of hindcast skill with time and height, we demonstrate that this skill is significantly influenced by the descent of predictable stratospheric circulation anomalies.

4.2 Seasonal forecast system

The analysis in this paper is based on results from a set of hindcast predictions produced by the Met Office Global Seasonal Forecast System 5 (GloSea5) [*MacLachlan et al.*, 2014]. This system is based upon the HadGEM3 coupled general circulation model [*Hewitt et al.*, 2011], with an atmospheric resolution of 0.83° longitude by 0.56° latitude, 85 quasi-horizontal atmospheric levels and an upper boundary at 85 km. The ocean resolution is 0.25° in longitude and latitude, with 75 quasi-horizontal levels. For the SON season used for the SH analysis, a 15-member ensemble of hindcasts was run for each year in the period 1996–2009. For the DJF season used for the NH analysis a longer 24-member ensemble is available for the winters 1992/1993–2011/2012. The hindcast length is approximately four months from three separate start dates spaced two weeks apart and centered on 1st August (SON) or 1st November (DJF), with an equal number of members initialized on each start date. Members initialized on the same start date differ only by stochastic parameterization of model physics [*Tennant et al.*, 2011]. Details of the hindcast runs for these two seasons are summarised in Table 4.1.

Season	Hindcast period	Initialisation dates	Ensemble size
DJF	92/93–11/12 (20 years)	25/10, 01/11, 09/11	24 (8 on each date)
SON	1996–2009 (14 years)	25/07, 01/08, 09/08	15 (5 on each date)

Table 4.1: Summary table of the two sets of hindcast simulations analysed.

Initial conditions for the atmosphere and land surface were taken from the ERA-Interim reanalysis [*Dee et al.*, 2011], and initial ocean and sea-ice concentrations from the GloSea5 Ocean and Sea Ice Analysis, based on the FOAM data assimilation system [*Blockley et al.*, 2013]. The ERA-Interim data are linearly interpolated onto model levels between the surface and 64.56 km (near 0.1 hPa), and the 64.56 km values are then replicated onto the four subsequent levels up to 85 km. FOAM data are on the same grid as the ocean model. Beyond initialization

4.3. NORTHERN HEMISPHERE RESULTS

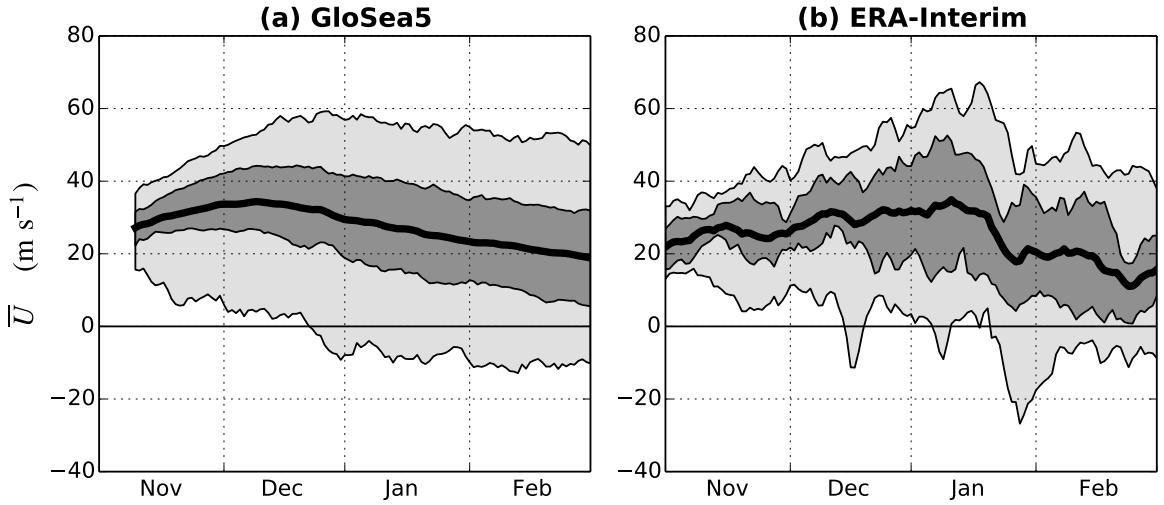


Figure 4.1: Time series of daily 10 hPa zonal-mean zonal wind (\bar{U}) at 60°N for all GloSea5 ensemble members (a) and ERA-Interim (b) from 1992–2011. The thick black line indicates the mean, dark grey shading the interquartile range and light grey the 95th percentile range.

the model takes no further observational data, and contains no flux corrections or relaxations to climatology. The model lacks interactive chemistry, and ozone concentrations are fixed to observed climatological values averaged over 1994–2005, including a seasonal cycle [Cionni *et al.*, 2011].

Scaife et al. [2014] have shown that this seasonal forecast system produces highly skillful forecasts of the North Atlantic Oscillation during the Northern Hemisphere winter. The combined effects of ENSO, QBO and sea-ice teleconnections, as well as the increased ocean resolution which has improved the representation of Northern Hemisphere blocking events [*Scaife et al.*, 2011], contribute to this skill.

Hindcast accuracy is verified by comparison to the ERA-Interim reanalysis [*Dee et al.*, 2011]. The ERA-Interim data set has been demonstrated to have realistic representation of the stratospheric meridional circulation [*Seviour et al.*, 2012; *Monge-Sanz et al.*, 2013]. It also assimilates observations of ozone concentrations, and this assimilation has been demonstrated to be in close agreement with independent satellite data [*Dragani*, 2011].

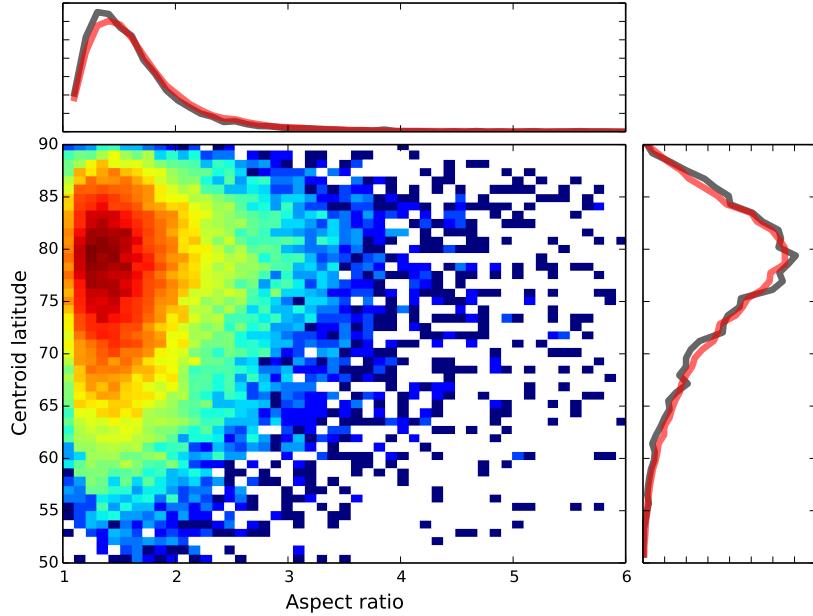


Figure 4.2: Distribution (see Figure 3.1) of the centroid latitude and aspect ratio diagnostics derived from geopotential height for all GloSea5 ensemble members (red lines) and ERA-Interim (grey lines) over 1992–2011. The joint distribution is plotted with a logarithmic colour scale such that red represents the densest regions.

4.3 Northern Hemisphere results

4.4 Southern Hemisphere results

4.4.1 Stratospheric polar vortex

The climatology of Antarctic stratospheric polar vortex winds in the GloSea5 hindcasts is compared to the ERA-Interim reanalysis climatology in Figure 4.7. The strength of the stratospheric polar vortex is measured by the zonal-mean zonal wind (\bar{U}) at 60°S and 10 hPa, which is approximately the center of the mean position of the vortex in the mid-stratosphere. The composite for the GloSea5 hindcasts is formed from all the individual ensemble members over 1996–2009 (a total of 210), while that from ERA-Interim is a composite of all years from 1979–2010 (a total of 32 years). It can be seen that the mean of the GloSea5 hindcasts agrees very closely with ERA-Interim throughout the spring, with only a slight bias towards weaker winds in August and September. The interquartile and 95th percentile ranges of GloSea5 and ERA-Interim also agree well, although the ERA-Interim values are noisier as would be expected from a sample size consisting of fewer years.

4.4. SOUTHERN HEMISPHERE RESULTS

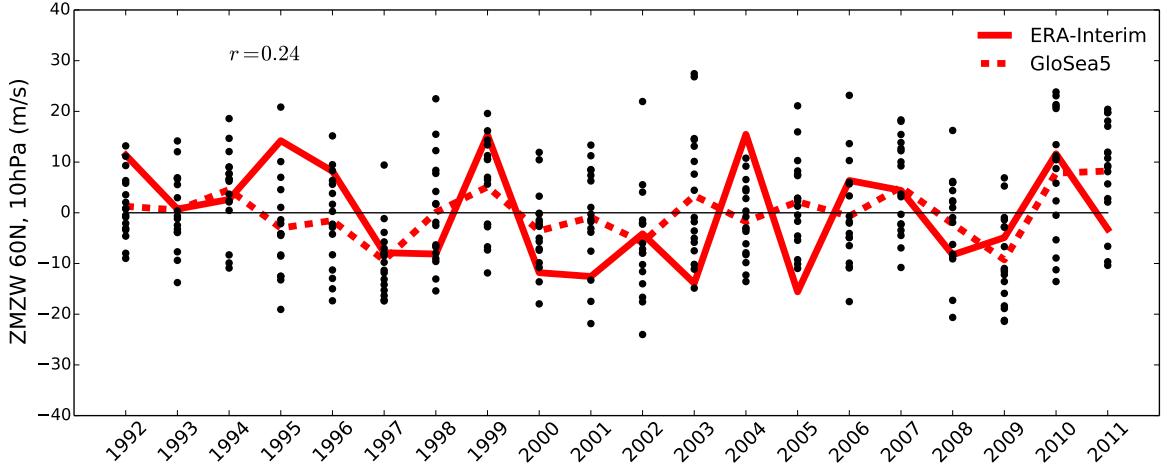


Figure 4.3: DJF mean anomalies of \bar{U} at 60°N and 10 hPa for the GloSea5 ensemble mean and ERA-Interim. Black dots represent individual ensemble members. The correlation between the GloSea5 ensemble mean and ERA-Interim is $r = 0.24$, which is not statistically significant from zero.

The GloSea5 hindcast predictions of interannual variability of the Antarctic stratospheric polar vortex winds are shown in Figure 4.8(a). Anomalies are defined from the relevant climatology of either GloSea5 or ERA-Interim. For GloSea5, this climatology is calculated from the mean of each day across all ensemble members in all years, while for ERA-Interim the climatology is the mean of each day, smoothed with a 30-day running mean (in order to account for its increased noise due to the reduced sample size). Results are shown for September–November (SON) averages, corresponding to a 1 month average lead time. The correlation between the GloSea5 ensemble mean and ERA-Interim is 0.73, which is statistically significant from zero at the 99% confidence level, and has a 95% confidence interval of (0.37,0.90). This correlation does not depend strongly on particular years; the correlation remains significant at the 95% level ($r = 0.57$) if the year 2002 (which has the greatest anomaly) is excluded. Significance is calculated using a two-tailed bootstrap test, whereby the percentile of the observed correlation is calculated from the distribution of correlations of a large number ($\sim 10,000$) of pairs of time series formed by re-sampling with replacement from the original time series. These significance tests make fewer assumptions about the underlying structure of the data than parametric tests [Wilks, 2006], and are used throughout this study.

The skill shown in Figure 4.8(a) cannot be accounted for by persistence of initial anomalies. In fact, there is a negative correlation between \bar{U} on 9th August,

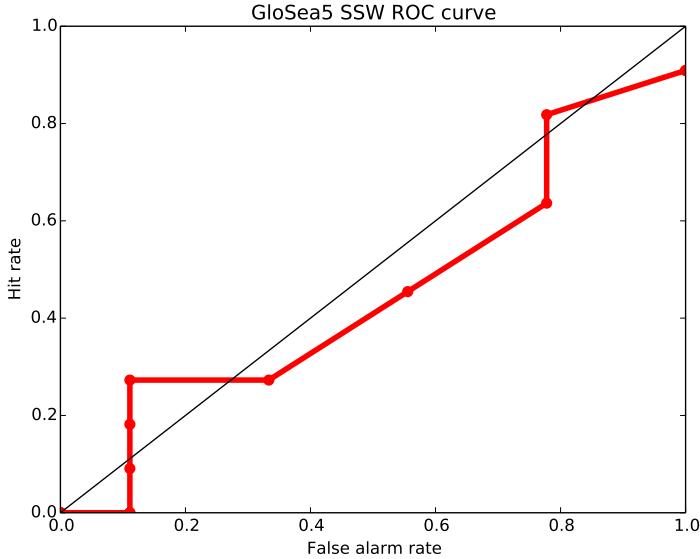


Figure 4.4: Receiver operating characteristic (ROC) curve for the prediction of SSW events during DJF for 1992–2011. SSWs are defined as a reversal to easterly \bar{U} at 60°N 10 hPa, and must be separated by at least 30 days.

when the last ensemble member is initialised, and the SON mean ($r = -0.54$). Hence, a persistence forecast would be negatively correlated with observed values. This relationship may be consistent with ideas of a pre-conditioning of the polar vortex [e.g., *McIntyre and Palmer, 1983*]. The standard deviation of all GloSea5 ensemble members is 7.5 m s^{-1} and that of ERA-Interim is 9.7 m s^{-1} indicating that the GloSea5 ensemble spread may be too small. However, there are large uncertainties in these values due to the short hindcast period and the large 2002 anomaly.

Following *Charlton and Polvani [2007a]*, SSWs are defined as a temporary reversal of \bar{U} at 60°S and 10 hPa, occurring before the final transition to summer easterlies (final warming). Under this definition, one SSW event was simulated in the GloSea5 hindcasts, in 2002. A similar magnitude event (in terms of departure from climatology) occurred in a 1997 ensemble member, although \bar{U} did not quite become easterly. Time series of stratospheric polar vortex winds for these two events are shown in Figure 4.7(a) along with the observed 2002 SSW in Figure 4.7(b). It can also be seen in Figure 4.7(a) that 2002 has the most anomalous stratospheric polar vortex in the GloSea5 hindcasts, with 14 of 15 ensemble members simulating negative anomalies, and the most negative ensemble mean. It is therefore possible that an increased likelihood the 2002 event was to some

4.4. SOUTHERN HEMISPHERE RESULTS

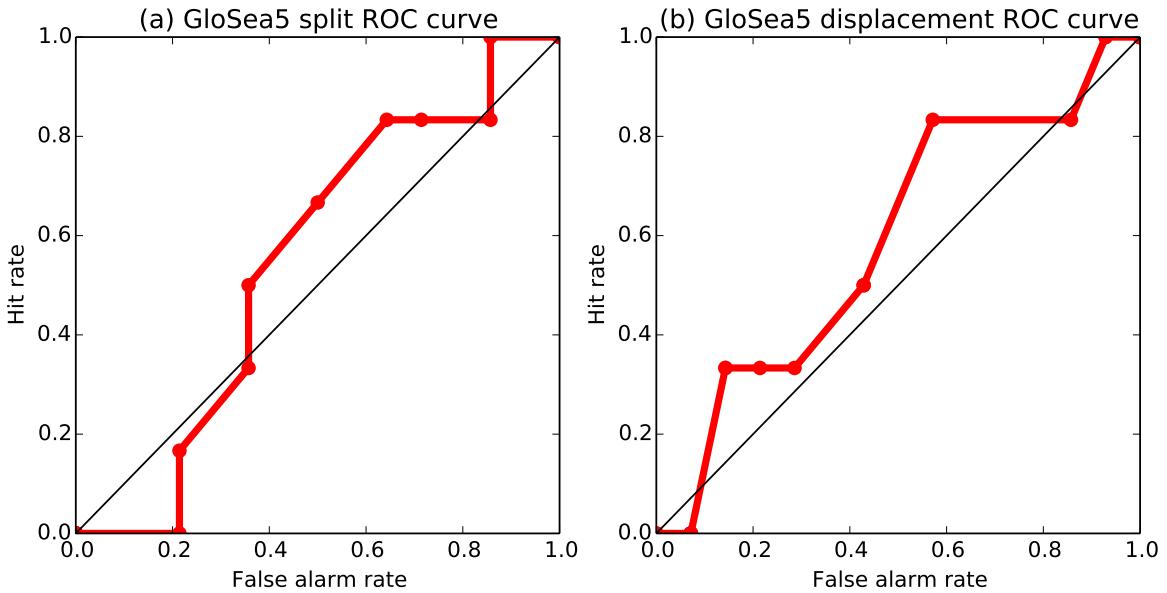


Figure 4.5: Receiver operating characteristic (ROC) curves for the prediction of split (a) and displaced (b) vortex events in all GloSea5 ensemble members over 1992–2011. Split and displaced vortex events are identified from geopotential height-derived moment diagnostics using the method described in Chapter 2.

degree detectable about two months in advance, although it has not been determined whether this predictability comes from a preconditioning of the vortex, as suggested by *Scaife et al.* [2005], or the result of external forcing.

Both the SSW events simulated by GloSea5 were vortex displacement events, in contrast to the vortex splitting event which occurred in 2002 [*Charlton et al.*, 2005]. This is demonstrated in Figure 4.9, which shows geopotential height in the mid-stratosphere at the date of minimum \bar{U} at 60°S and 10 hPa, for the two simulated events in GloSea5 and the observed event in ERA-Interim. The distinction between splitting and displacement SSW events is important because it has been observed that tropospheric anomalies are greater following vortex splitting events, at least in the Northern Hemisphere [*Nakagawa and Yamazaki*, 2006; *Mitchell et al.*, 2013].

The timing of the final warming of the stratospheric polar vortex also has a significant effect on stratospheric temperature and ozone concentrations [*Yamazaki*, 1987], as well as on the coupling of the stratosphere to the troposphere [*Black and McDaniel*, 2007]. The predictability of these events was investigated in GloSea5, but not found to be highly significant. This is probably because the mean timing of the final warming is towards the end of the four month hindcast simulation (around 20th November at 10 hPa), and the final warming does not occur before

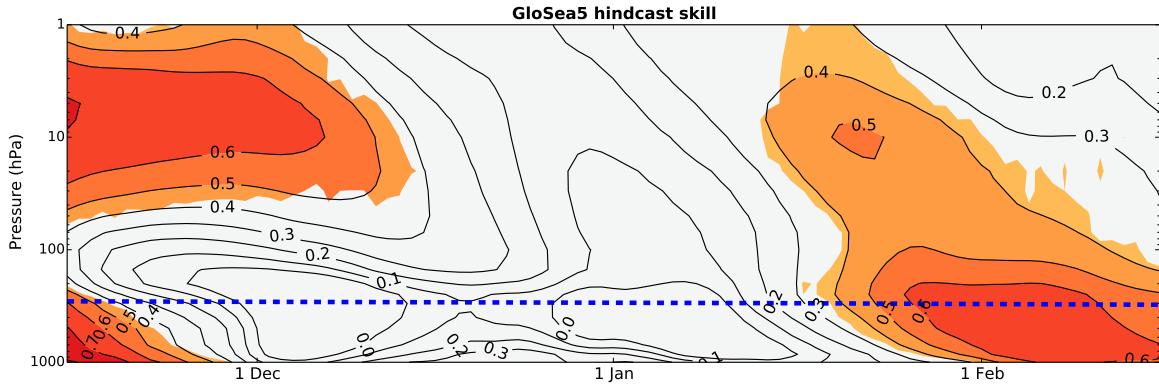


Figure 4.6: Correlation of GloSea5 ensemble mean polar cap ($60\text{--}90^{\circ}\text{N}$) geopotential height anomalies (Z') with ERA-Interim values from 1996–2009, as a function of time and height. All values are smoothed with a 30-day running mean before correlations are calculated. The contour interval is 0.1 and all colored regions are greater than zero at the 95% confidence interval, using a bootstrap test at each time at height. The blue dashed line indicates the approximate polar cap mean tropopause level [Wilcox *et al.*, 2012b].

the end of the hindcast for some ensemble members, thereby introducing a bias in the mean.

4.4.2 Ozone depletion

GloSea5 does not include interactive ozone chemistry, so in order to make ozone forecasts concentrations must be inferred from other meteorological variables. Total ozone quantities over the Antarctic polar cap have been found to be highly correlated with vertical EP flux poleward of 40°S [Weber *et al.*, 2011; Salby *et al.*, 2012]. EP flux diagnostics are not routinely produced directly by operational seasonal forecast systems and requires high frequency output at high spatial resolution to calculate. However, vertical EP flux dominates variability of the stratospheric polar vortex, so it may be possible to use the strength of the vortex to infer ozone quantities.

SON mean total column ozone quantities area-weighted averaged over the polar cap ($60\text{--}90^{\circ}\text{S}$) are shown in Figure 4.10(a) for ERA-Interim and the Total Ozone Mapping Spectrometer (TOMS) satellite instrument [Kroon *et al.*, 2008]. ERA-Interim data are highly correlated with TOMS, verifying the accuracy of ERA-Interim against direct satellite measurements (TOMS values are slightly higher than ERA-Interim; this is probably because TOMS cannot make observations during the polar night). The long-term trend in polar cap total column ozone is calculated by fitting a second-order polynomial to the data. This long-term trend is due

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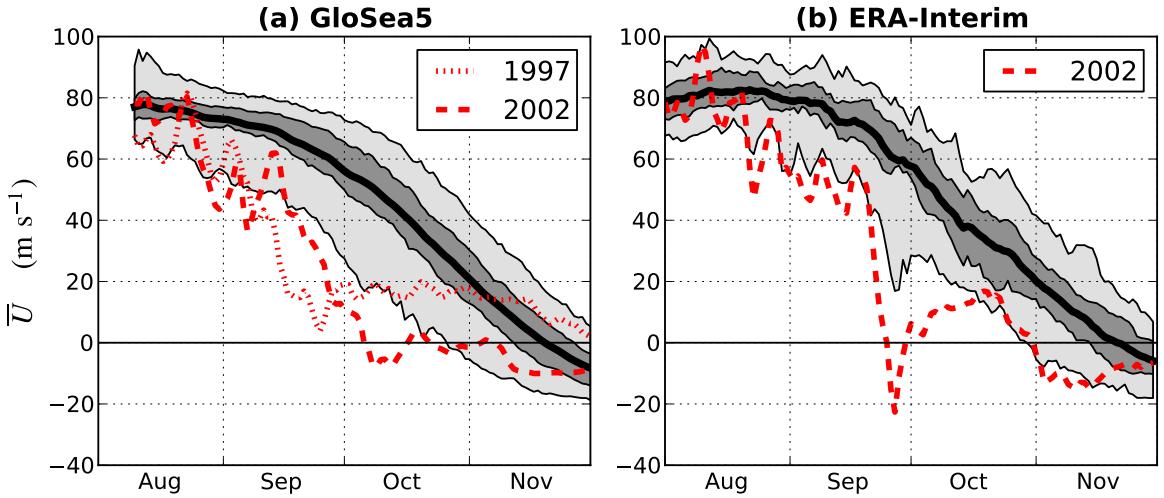


Figure 4.7: Time series of daily 10 hPa zonal-mean zonal wind (\bar{U}) at 60°S for all GloSea5 ensemble members from 1996–2009 (a) and ERA-Interim from 1979–2010 (b). The thick black line indicates the mean, dark gray shading the interquartile range and light gray the 95th percentile range. Individual time series of the ensemble member of GloSea5 for 2002 which simulated an SSW, and 1997 which simulated a near-SSW, and the year with an observed SSW (2002) are shown in red.

to changes in concentrations of CFCs and other ozone-depleting substances, and largely unrelated to dynamical variability. On the other hand, shorter-term interannual changes are strongly related to dynamical variability. In Figure 4.10(b) anomalies of polar cap total column ozone from the long-term trend are plotted against anomalies of the SON mean \bar{U} at 60°S and 10 hPa. It can be seen that these two quantities are highly correlated ($r = -0.92$), meaning polar vortex variability explains approximately 85% of the variance of polar cap total column ozone anomalies.

This strong correlation makes it possible to use GloSea5 forecasts of polar vortex winds to produce inferred predictions of polar cap total column ozone quantities. This is carried out by a leave-one-out cross-validation procedure [Wilks, 2006]; the linear regression of ERA-Interim ozone and \bar{U} anomalies for all years 1979–2009 except the hindcast year is used to produce the hindcast for each ensemble member. Thus no information from the hindcast year enters the hindcast itself. Figure ??(b) shows the GloSea5 ozone hindcasts along with the assimilated values from ERA-Interim. The correlation between the GloSea5 ensemble mean and ERA-Interim is 0.73, which is statistically significant at the 99% level, and has a 95% confidence interval of (0.38, 0.91). Errors from the regression in Fig. ??(b) for the inferred ozone quantities for each ensemble member are small compared

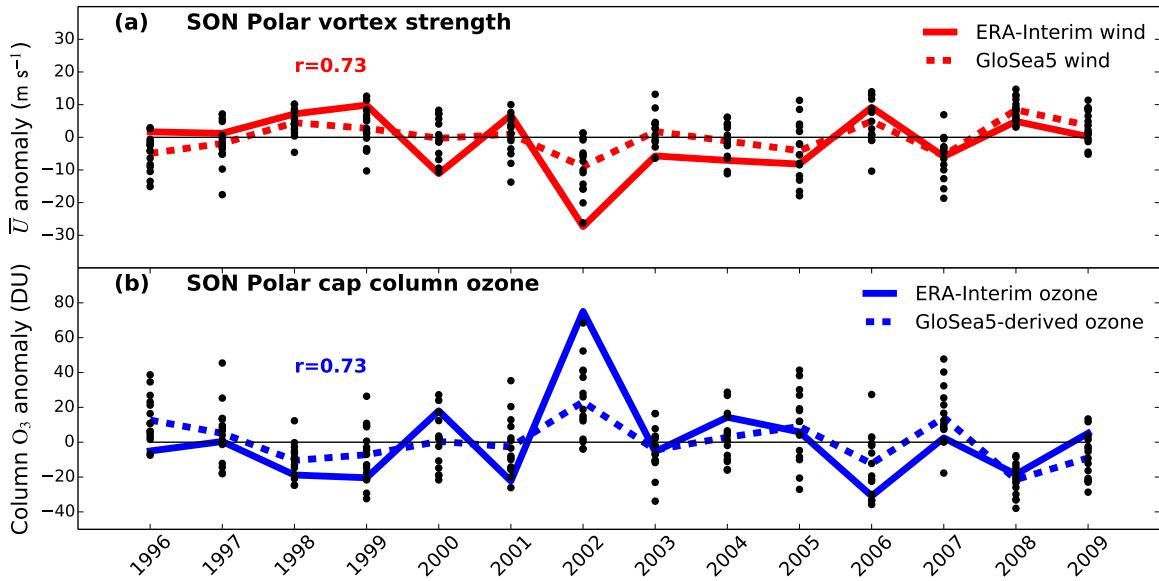


Figure 4.8: (a) SON mean anomalies at 10 hPa and 60°S in ERA-Interim and the GloSea5 hindcast ensemble mean. (b) SON mean polar cap averaged (60–90°S) total column ozone anomalies from ERA-Interim and those derived from the GloSea5 anomalies as described in the text. Individual ensemble members are shown as black dots. Hindcasts are initialized near 1st August.

to the spread between ensemble members, and so are not plotted in this figure.

4.4.3 Southern Annular Mode

The SAM index in both GloSea5 and ERA-Interim is depicted as the difference between the normalized anomalies of zonally averaged mean sea-level pressure at 40°S and 65°S [Gong and Wang, 1999]. These anomalies are calculated from the respective climatologies of GloSea5 and ERA-Interim. The ERA-Interim SAM index calculated in this way is also highly correlated with other measures of the SAM, such as the station-based index of Marshall [2003]. The GloSea5 hindcast skill for the prediction of the seasonal (SON) mean SAM index is shown in Figure 4.11 . The correlation of the GloSea5 ensemble mean and ERA-Interim is 0.64, which is statistically significant at the 95% level, and has a 95% confidence interval of (0.18,0.92) confirming skillful prediction of the SAM at 1 month average lead times. This is similar to the value for the December–February (DJF) NAO correlation skill of 0.62 found by Scaife *et al.* [2014] in the same seasonal forecast system. The 1-year lag autocorrelation of the SON mean SAM is negative ($r = -0.36$), and accounting for this by sampling pairs of consecutive years in the bootstrap

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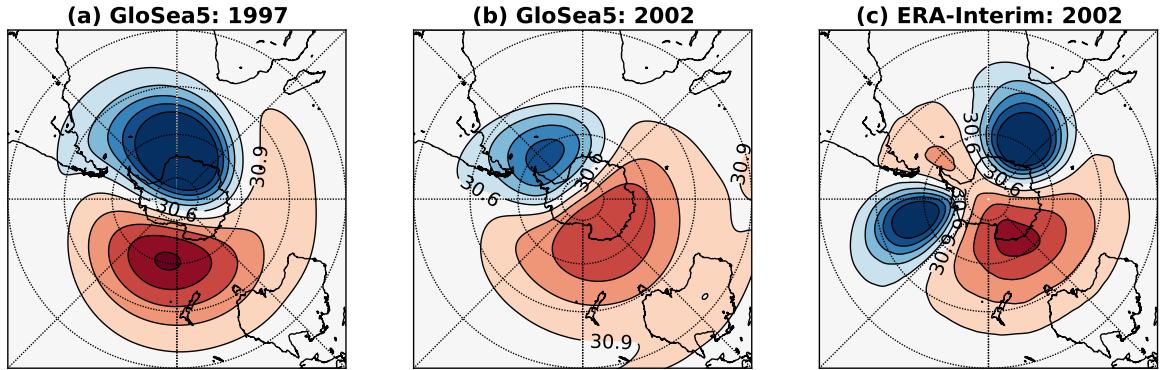


Figure 4.9: Geopotential height at 10 hPa on the date at which \bar{U} at 60°S and 10 hPa is at its minimum value, for the two GloSea5 ensemble members which simulate a SSW (a,b), and for ERA-Interim at the central date of the 2002 SSW (c). Units are km and the contour interval is 0.3 km.

test leads to a narrower confidence interval than presented above. The variability of the SAM simulated by GloSea5 is broadly realistic with a standard deviation of all ensemble members of 0.98 compared to 0.90 in ERA-Interim over the same period.

The SAM is strongly related to surface temperatures over much of the SH extratropics. Figure 4.12(a) shows the correlation of the SON mean SAM from ERA-Interim over 1996–2009 with SON mean gridded station-based surface temperature data from the HadCRUT4 data set [Morice *et al.*, 2012]. The HadCRUT4 data set has been chosen to demonstrate the relationship between the SAM and surface temperature because of the scarcity of temperature observations in the Southern Hemisphere, meaning reanalysis data is poorly constrained in many regions. The same relationship between surface temperatures and the SAM is shown for the GloSea5 ensemble mean in Figure 4.12(b). Many of the observed correlations are reproduced in the hindcasts, such as the opposite signed correlations over east Antarctica and the Antarctic Peninsula/Patagonia, as well as between eastern Australia and New Zealand. These results are in agreement with Gillett *et al.* [2006] who analysed the temperature patterns associated with the SAM over the longer observational record of 1957–2005.

The GloSea5 ensemble mean SON surface temperature correlation with HadCRUT4 is shown in Figure 4.12(c). Also highlighted (black circles) are the points with the strongest observed correlations with the SAM ($|r| > 0.5$). Regions of significant positive correlations are found over east Antarctica, Patagonia, New Zealand, and eastern Australia. These are regions which also have a strong cor-

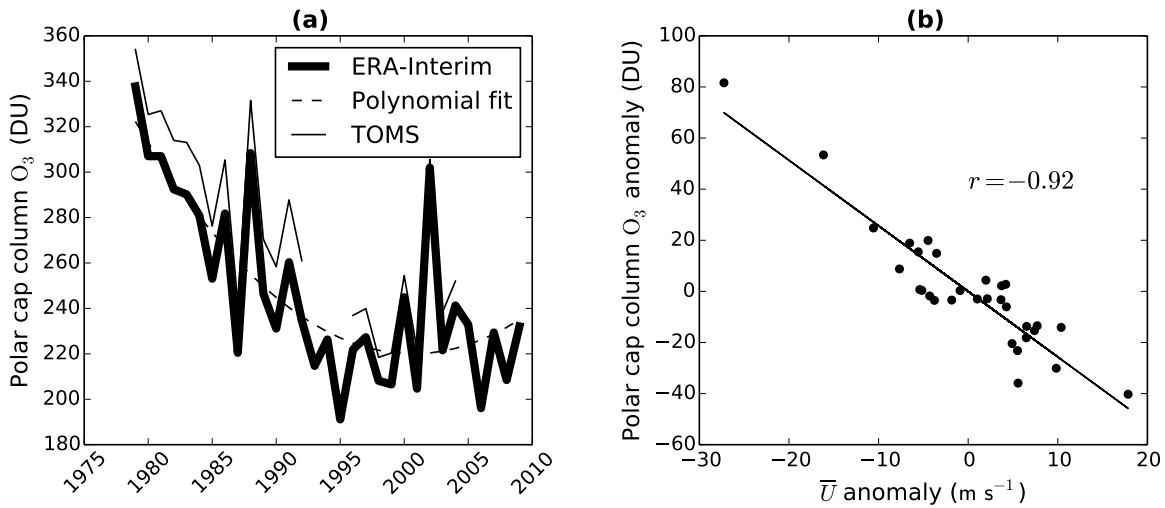


Figure 4.10: (a) Time series of SON mean polar cap averaged ($60\text{--}90^\circ\text{S}$) total column ozone in ERA-Interim and the TOMS satellite instrument. The ERA-Interim data are fitted with a 2nd-order polynomial. (b) Anomalies of ERA-Interim column ozone from the polynomial fit plotted against SON mean anomalies at 10 hPa and 60°S for each year from 1979–2009.

relation with the SAM, indicating that the significant surface temperature skill is related to skill in prediction of the SAM. On the other hand, there are also some significant negative correlations in subtropical regions, which may indicate a model bias in the temperature pattern associated with the SAM in these regions.

4.4.4 Stratosphere-troposphere coupling

It is now investigated whether the statistically significant skill in hindcasts of the stratospheric polar vortex affects that of the surface SAM. Forecast skill as a function of lead-time and height is studied for polar cap ($60\text{--}90^\circ\text{S}$) mean geopotential height anomalies (Z')¹. Figure 4.13(a) shows the correlation of Z' in ERA-Interim with the GloSea5 ensemble mean hindcast values. Values are smoothed with a 30-day running mean before correlations are calculated, and plotted such that values for 15th September represent the correlation of the ERA-Interim and GloSea5 ensemble mean September mean values (without this smoothing, there are noisier but still significant correlations in a similar pattern). Between 1st–9th August the ensemble mean is taken as the average of the 10 initialized ensemble members, and the average of all 15 ensemble members is used after this date.

¹At 1000 hPa monthly mean Z' is highly correlated ($r = 0.98$) with the SAM index

4.4. SOUTHERN HEMISPHERE RESULTS

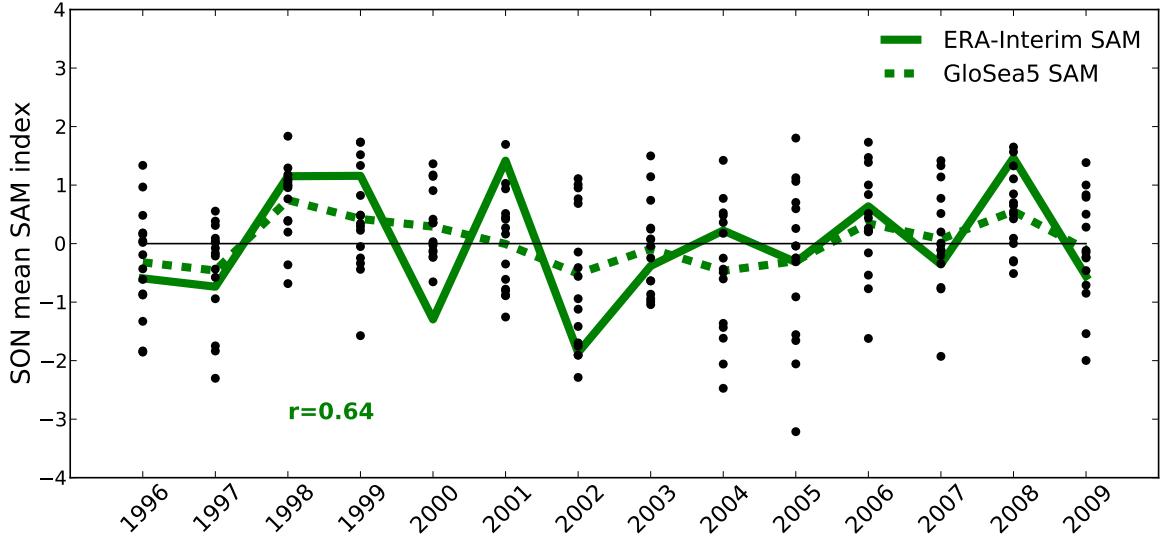


Figure 4.11: SON mean Southern Annular Mode (SAM) index in individual GloSea5 hindcast ensemble members (dots), ensemble mean (dashed green curve) and ERA-Interim (solid green curve). The SAM is calculated from mean sea-level pressure data, and hindcasts initialized near 1st August. The correlation of the ensemble mean and ERA-Interim values is 0.64, which is statistically significant at the 99% level.

As would be expected from the initialization of GloSea5 from ERA-Interim data, correlations are high in both the troposphere and the stratosphere for the August mean, due to predictability on weather timescales. However, tropospheric and lower-stratospheric skill rapidly decays and becomes statistically insignificant throughout September. In contrast, stratospheric correlations remain statistically significant throughout the hindcast simulation, and as high as 0.8 through to mid-October (corresponding to a 2 month lead time).

Importantly, the region of high levels of stratospheric skill descends with time and is present at the tropopause at the same time as a re-emergence of significant tropospheric skill in mid-October. This re-emergence cannot be accounted for by the persistence of tropospheric anomalies, so must be the result of the effect of another predictable signal on the extratropical tropospheric circulation. An obvious candidate for such a signal is the polar stratosphere, since this remains predictable throughout the hindcast period. The re-emergence of tropospheric skill also occurs at the same time as the strongest observed coupling between the stratosphere and troposphere found in other studies [e.g., *Thompson et al., 2005; Simpson et al., 2011*].

In order to determine the stratospheric influence on tropospheric skill, a simple statistical forecast model is formed, which has as its only input the initial

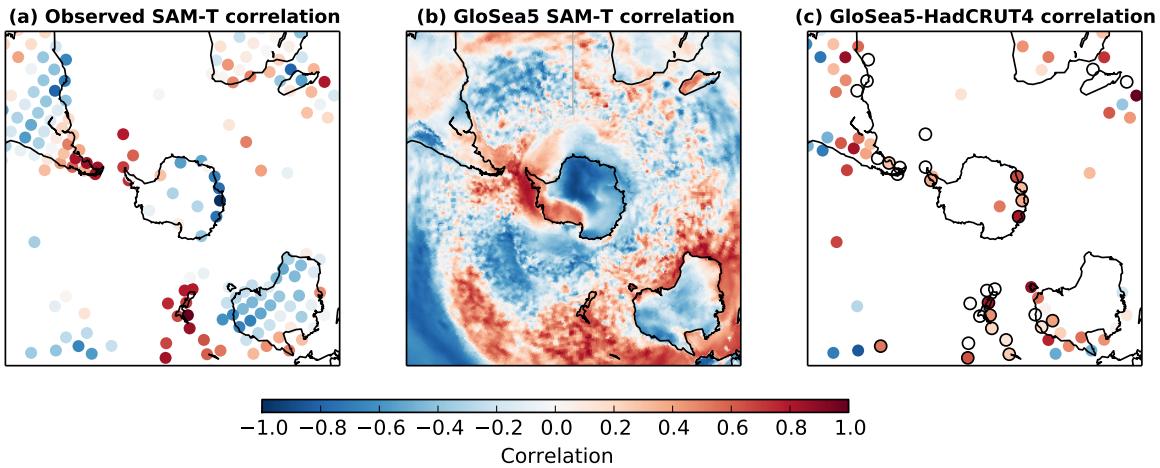


Figure 4.12: (a) Correlation of the ERA-Interim SON mean SAM with SON mean HadCRUT4 gridded station-based temperature observations over 1996–2009. (b) Correlation of the SON GloSea5 ensemble mean hindcast SAM with the SON hindcast ensemble mean near-surface temperature. (c) Correlation of observed SON mean HadCRUT4 and hindcast GloSea5 ensemble mean temperature. In (c) only correlations which are significant from zero at the 95% level according to a bootstrap test at each gridpoint are shown. Black circles represent points which have an observed correlation with the SAM with magnitude greater than 0.5.

conditions of the Antarctic stratosphere. A leave-one-out cross validation procedure is employed; ERA-Interim values are used to calculate the linear regression of Z' at 10 hPa on 1st August with Z' at all other times and heights from 31 of the 32 years from 1979–2009. This regression is then used to produce a hindcast of the 32nd year based on its Z' at 10 hPa on 1st August. The method ensures that no information from the hindcast year enters the model. The process is then repeated to make hindcasts of all 32 years.

Figure 4.13(b) shows the correlation of 30-day running means of these statistical hindcasts with ERA-Interim values. As might be expected, skill is initially high in the mid-stratosphere but not the troposphere. As with the GloSea5 hindcasts, the region of high skill descends with time, and statistically significant correlations re-emerge in the troposphere throughout October. This demonstrates that skillful forecasts of the Antarctic troposphere during October can be produced based only on knowledge of Z' in the mid-stratosphere on 1st August. It also suggests that the re-emergence of tropospheric skill in the GloSea5 hindcasts in October is likely to be caused by predictable stratospheric anomalies which descend with time.

However, it is also possible that a third factor both influences the 1st August

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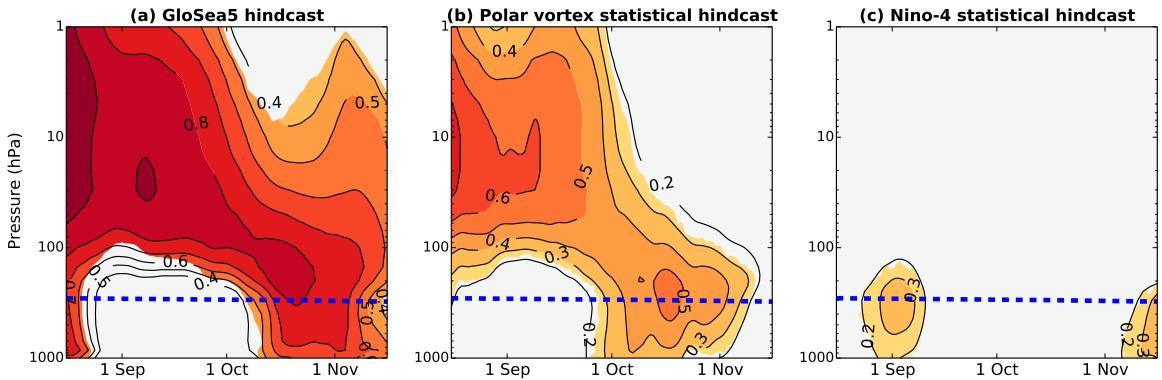


Figure 4.13: (a) Correlation of GloSea5 ensemble mean polar cap ($60\text{--}90^{\circ}\text{S}$) geopotential height anomalies (Z') with ERA-Interim values from 1996–2009, as a function of time and height. (b) Correlation of ERA-Interim from 1979–2010 values with those predicted by a linear statistical model based on Z' at 10 hPa on 1st August. (c) As (b) but based on the July-mean Niño-4 index. All values are smoothed with a 30-day running mean before correlations are calculated. The contour interval is 0.1 and all colored regions are greater than zero at the 95% confidence interval, using a bootstrap test at each time at height. The blue dashed line indicates the approximate polar cap mean tropopause level [Wilcox *et al.*, 2012b].

stratosphere and the October and November troposphere. ENSO may be such a factor, since it has been shown to influence both the surface SAM [Lim *et al.*, 2013] and the polar stratosphere [Hurwitz *et al.*, 2011]. The influence of ENSO is therefore assessed using the same leave-one-out cross-validation procedure, and shown in Figure 4.13(c). The input to the statistical model is the July mean Niño-4 index (sea-surface temperatures averaged over $5^{\circ}\text{S}\text{--}5^{\circ}\text{N}$, $160^{\circ}\text{--}150^{\circ}\text{W}$) from the HadISST1 data set [?]. Similar results are obtained using the July mean Niño-3.4 index or Southern Oscillation Index. The Niño-4 index-based statistical hindcasts show some significant tropospheric correlations around 1st September and in November, but not during October. Hence, ENSO cannot account for the October re-emergence of tropospheric skill in the GloSea5 hindcasts, at least in this statistical model.

Importantly, the longer 32-year (1979–2010) period of the ERA-Interim reanalysis (rather than the 14-year (1996–2009) period of the GloSea5 hindcasts) is used for the statistical analysis presented in Figures 4.13(b) and (c). The correlation between both the 1st August Z' at 10 hPa and the July mean Niño-4 index with the SON SAM is not statistically significantly different during 1996–2009 compared with 1979–2010. This was tested using a bootstrap test, which correlates subsets of 14 years from the (detrended) 32 years. Hence correlations found for the shorter

period are deemed to be a marginal distribution of those over the longer period, so a more robust measure of sources of predictability can be obtained by studying the longer observational record.

Similar features are seen if the statistical hindcasts are repeated using the shorter period, although tropospheric skill from the polar vortex emerges later (in November), and that from Niño-4 earlier in (in October; not shown). These statistical hindcasts also show lower skill than the GloSea5 hindcasts at almost all times in both the troposphere and stratosphere, which may indicate the importance of non-linearities or the influence of other external factors which can be captured by the full dynamical model.

4.5 Discussion

We have demonstrated that Antarctic total column ozone amounts are predictable up to four months in advance during the austral spring, even with a model which lacks interactive chemistry. While using such a model has the advantage of being less computationally expensive than a chemistry-climate model, there are also some drawbacks. Primarily, the model will not be able to simulate zonal asymmetries in ozone concentrations and their influence on the stratospheric circulation or the feedback between ozone concentrations and stratospheric temperatures. Both these factors have been shown to be important in driving long-term trends in the SAM as a result of ozone depletion [Thompson and Solomon, 2002; Crook *et al.*, 2008; Waugh *et al.*, 2009].

Perhaps more relevant for seasonal forecasts is the fact that we have not been able to determine whether the observed strong correlation between the stratospheric circulation and Antarctic ozone concentrations is dominated by a chemical or dynamical mechanism. If the relationship is dominated by a chemical mechanism, whereby enhanced descent over the pole inhibits the activation of ozone-depleting substances, we would expect the correlation to weaken as concentrations of these substances return to pre-industrial levels. Accurate forecasts of ozone with models lacking interactive chemistry would then not be possible. On the other hand, if the mechanism is largely dynamical, whereby transport of ozone-rich air from the tropics is the important factor, we would not expect the relationship to change in time. Although a study to distinguish these mechanisms has been carried out for chemistry-climate models [Garny *et al.*, 2011], it has not

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been possible to do so in observations. In either case, we do not expect the relationship to break down soon, as concentrations of ozone-depleting substances are not projected to return to 1980 levels until the late 21st century [WMO, 2011].

The correlation skill of 0.64 (95% confidence interval: [0.18,0.92]) for the SON mean SAM in the GloSea5 hindcasts is greater but not inconsistent with that found by *Lim et al.* [2013]. They report a correlation of 0.40 for the SON mean SAM from 1st August initialized forecasts over 1981–2010 using the Predictive Ocean and Atmosphere Model for Australia, version 2 (POAMA2). Over the comparable period of 1996–2009, they find a correlation of 0.54 (Harry Hendon, personal communication). Significantly, POAMA2 has only two model levels in the stratosphere, and so may be unable to simulate the stratosphere-troposphere coupling described here. *Lim et al.* [2013] attribute their results to the influence of ENSO through a tropospheric teleconnection. This is not inconsistent with our result shown in Figure 4.13(c), since we find significant tropospheric predictability from ENSO during November, the same time that *Lim et al.* [2013] find the strongest correlation between ENSO and the SAM. The lack of discrepancy between these two systems despite their different stratospheric resolutions may be a result of the ENSO/SAM connection being too weak in GloSea5, or simply that the relatively short hindcast period used here prevents a statistically significant difference being detected.

Despite this significant correlation skill in hindcasts of the SAM, it is clear from Figure 4.11 that the standard deviation of the GloSea5 ensemble mean SAM is much less than that of observations. The signal-to-noise ratio (ratio of the standard deviation of the ensemble mean to that of all ensemble members) is just 0.4. For a ‘perfect’ forecast system (one in which observations are indistinguishable from an ensemble member), the signal-to-noise ratio and correlation are directly related [*Kumar*, 2009], so that the expected correlation would be just 0.3. The fact that it is greater than this is because the average correlation between ensemble members and observations is much greater than that between pairs of ensemble members. A similar but smaller difference is also found for the stratospheric polar vortex forecasts, and this is also observed by *Scaife et al.* [2014] for the NAO in the same system. These results mean that individual ensemble members have a smaller predictable signal than observations.

Given this result, it might be expected that more skillful predictions could be obtained with a larger ensemble size. To illustrate the variation of hindcast skill with ensemble size we systematically sample smaller sets of forecasts from the

full 15 members for each year, following the method of *Scaife et al.* [2014]. This is repeated many times and an average value for a given sample size calculated. This variation of correlation skill with ensemble size for both the SON mean SAM and stratospheric polar vortex winds is shown in Figure 4.14. These curves closely follow the theoretical relationship of *Murphy* [1990], which relies only on the mean correlation between pairs of ensemble members, $\langle r_{mm} \rangle$, and the mean correlation between individual ensemble members and observations, $\langle r_{mo} \rangle$, given by

$$r = \frac{\langle r_{mo} \rangle \sqrt{n}}{\sqrt{1 + (n - 1) \langle r_{mm} \rangle}} \quad (4.1)$$

where r is the ensemble mean correlation, and n is the ensemble size. These curves are shown in Figure 4.14, along with their asymptote for an infinite sized ensemble. Although the stratospheric forecasts cannot be greatly improved with a larger ensemble size in the current system, greater correlation scores of the SAM could be achieved with an ensemble size near 30. Although the large uncertainty range does not allow a strong statement about potential predictability, the asymptote near 0.8 is similar to that found by *Scaife et al.* [2014] using a longer hindcast and greater ensemble size for the DJF NAO.

The dynamics of other seasons are different to those of the austral spring, so results presented here do not imply significant skill in prediction of the SAM at other times. For instance, *Shaw et al.* [2010] find that a favourable state for downward wave coupling between the stratosphere and troposphere is present only during September to December in the SH. Indeed, the 1-month lead time ensemble mean correlation of the DJF SAM with ERA-Interim is lower than that for SON at $r = 0.39$ (95% confidence interval: [0.15,0.63]).

4.6 Conclusions

Using a set of seasonal hindcasts initialized at the start of the austral spring, we have demonstrated skillful prediction of the interannual variability of the Antarctic stratospheric polar vortex at seasonal lead times. This includes capturing an increased likelihood of the 2002 SSW which is the most extreme year in the ensemble mean and has the only ensemble member in 14 years which simulates a SSW (although another is close to simulating a SSW in 1997). Because this variability is observed to be closely correlated with Antarctic column ozone amounts, we are able to perform skillful predictions of interannual variability in Antarctic ozone depletion.

4.A. CHOICE OF TIME PERIOD FOR STATISTICAL FORECAST

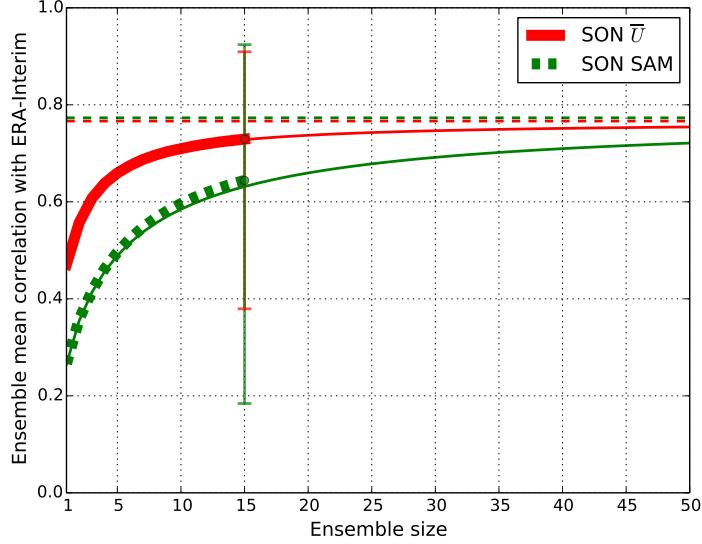


Figure 4.14: GloSea5 ensemble mean correlation with ERA-Interim as a function of ensemble size for the SON mean \bar{U} at 10 hPa and 60°S and SON mean SAM (thick lines). A theoretical estimate of the variation of correlation with ensemble size is shown in each case (thin solid lines), along with its asymptote for an infinite sized ensemble (dashed lines). Error bars represent the 95% uncertainty range for the correlation of the full 15-member ensemble, calculated using a bootstrap test.

We also find significant skill in hindcasts of the spring mean SAM index. By studying the variation of this skill with time and height, we suggest that this skill is influenced by stratospheric anomalies which descend with time and are coupled with the troposphere in October and November. In fact, the influence of the stratosphere is such that skillful statistical predictions of the October SAM can be made using only information from 1st August in the mid-stratosphere.

Assuming that the 14 year period studied here is representative of future years, these results suggest that it may now be possible to make skillful seasonal forecasts of interannual variations in springtime ozone depletion and large scale weather patterns across the Southern Hemisphere.

4.A Choice of time period for statistical forecast

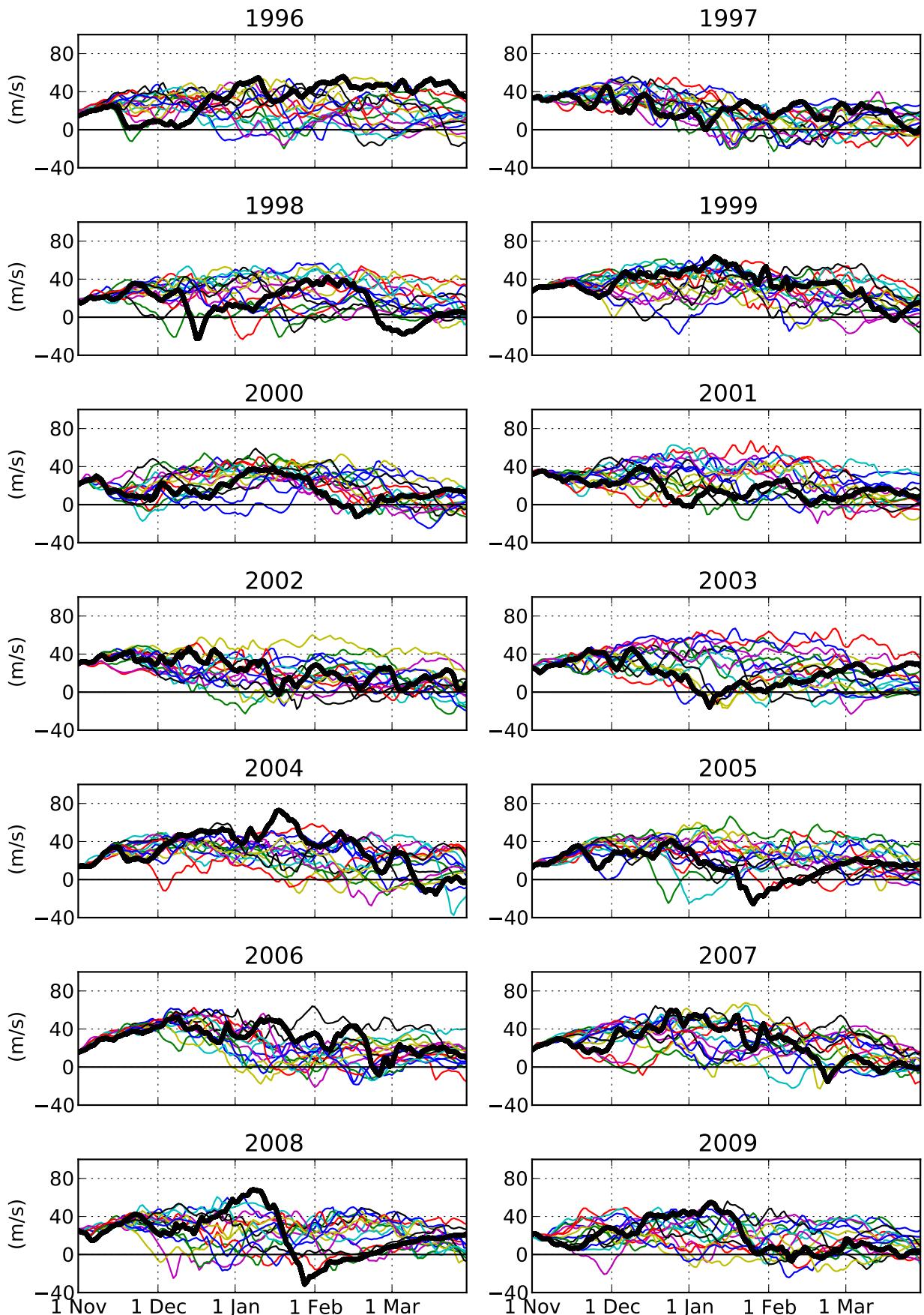


Figure 4.15: Timeseries of zonal-mean zonal wind in the Arctic polar vortex (60°N , 10 hPa) in the ERA-Interim reanalysis (thick black lines) and the GloSea5 ensemble hindcasts (thin coloured lines). Individual ensemble members are initialised from dates centred on November 1st.

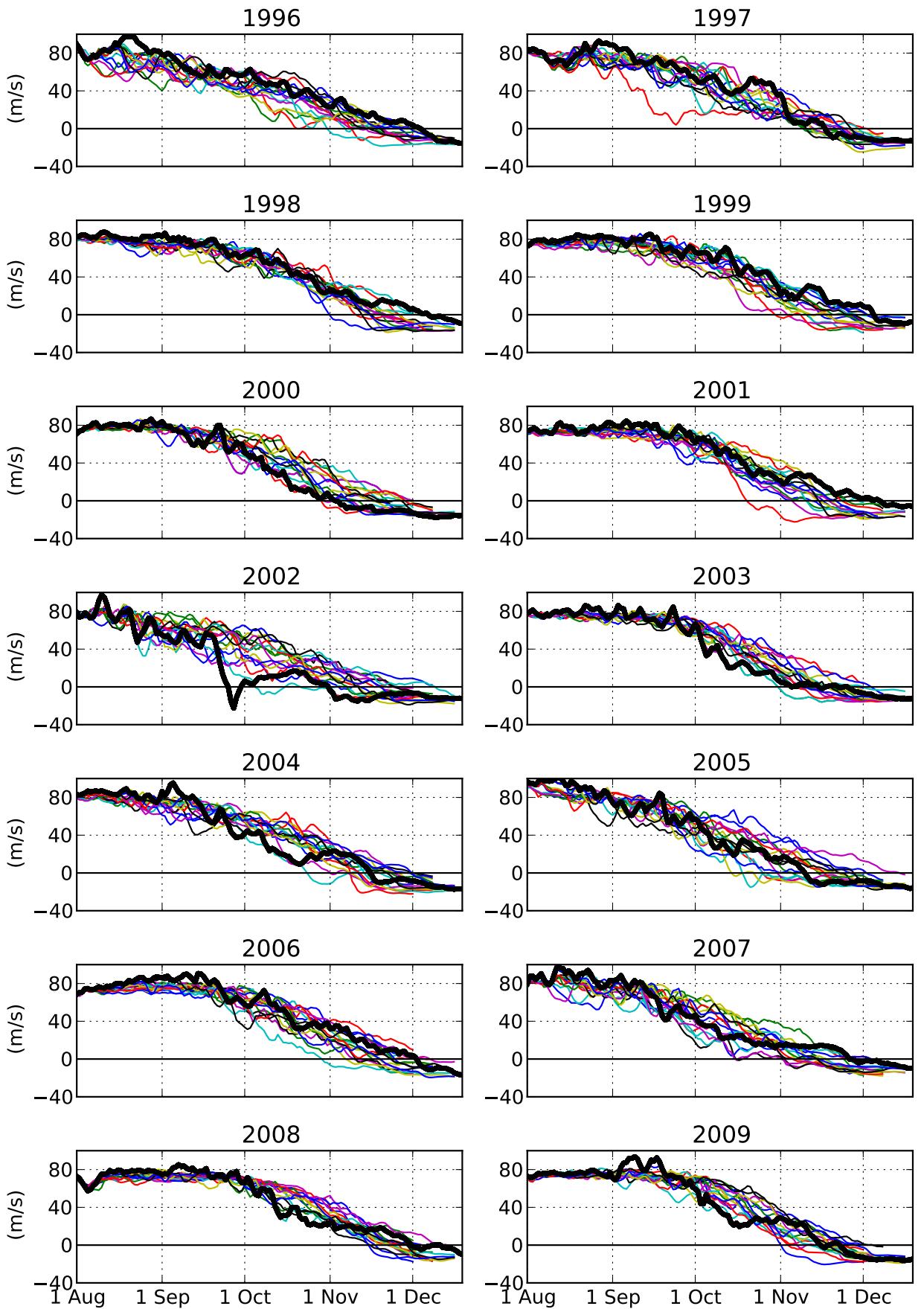


Figure 4.16: As figure 4.15 but for the zonal-mean zonal wind in the Antarctic polar vortex (60°S , 10 hPa), and ensemble members initialised from dates centred on August 1st.

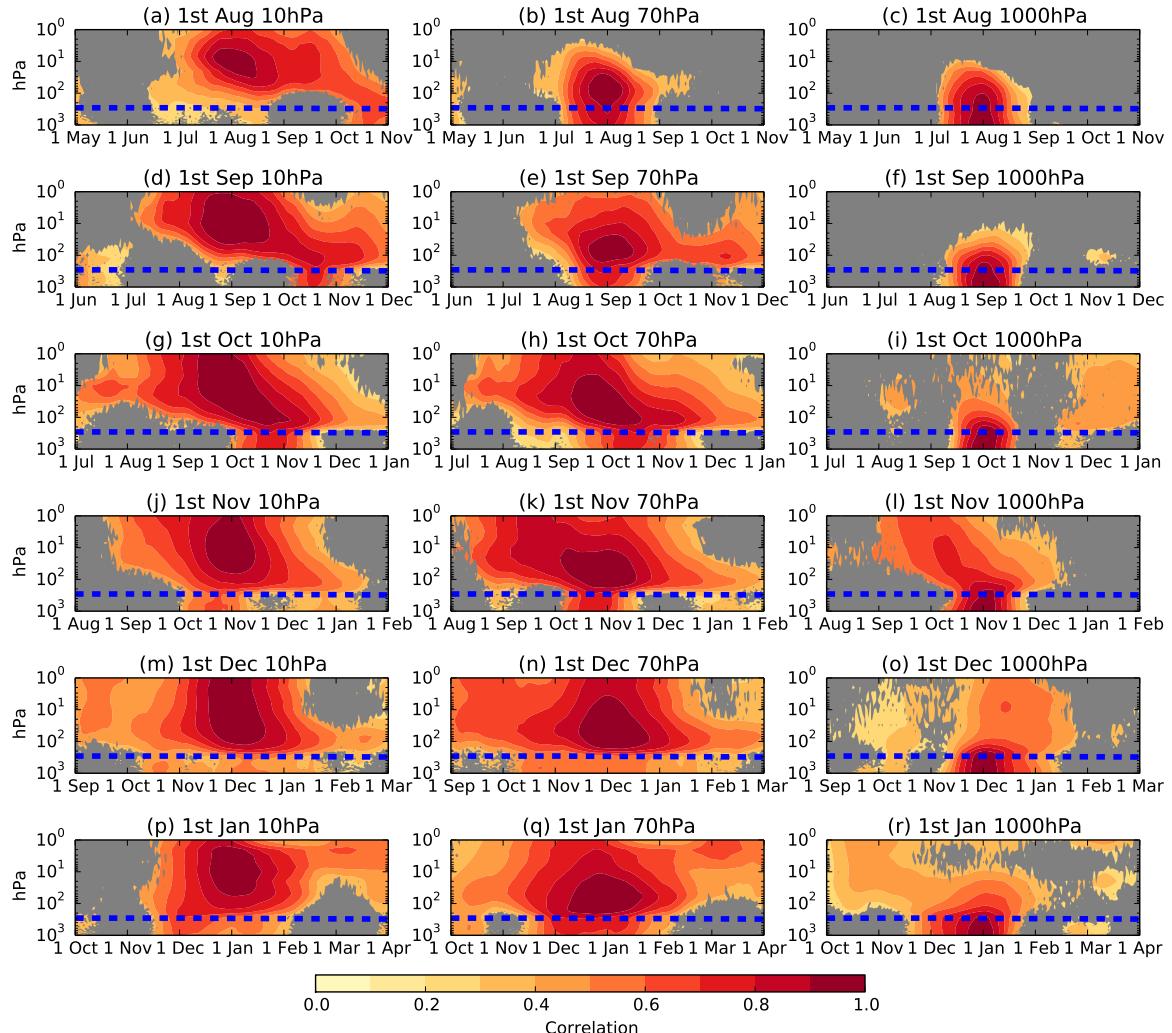


Figure 4.17: Correlation of ERA-Interim (1979–2010) Z' at 10 hPa, 70 hPa, and 1000 hPa with Z' at other times and lags. Values are smoothed with a 30-day running mean before correlations are calculated, and colours represent correlations that are 95% significant from zero according to a bootstrap test.

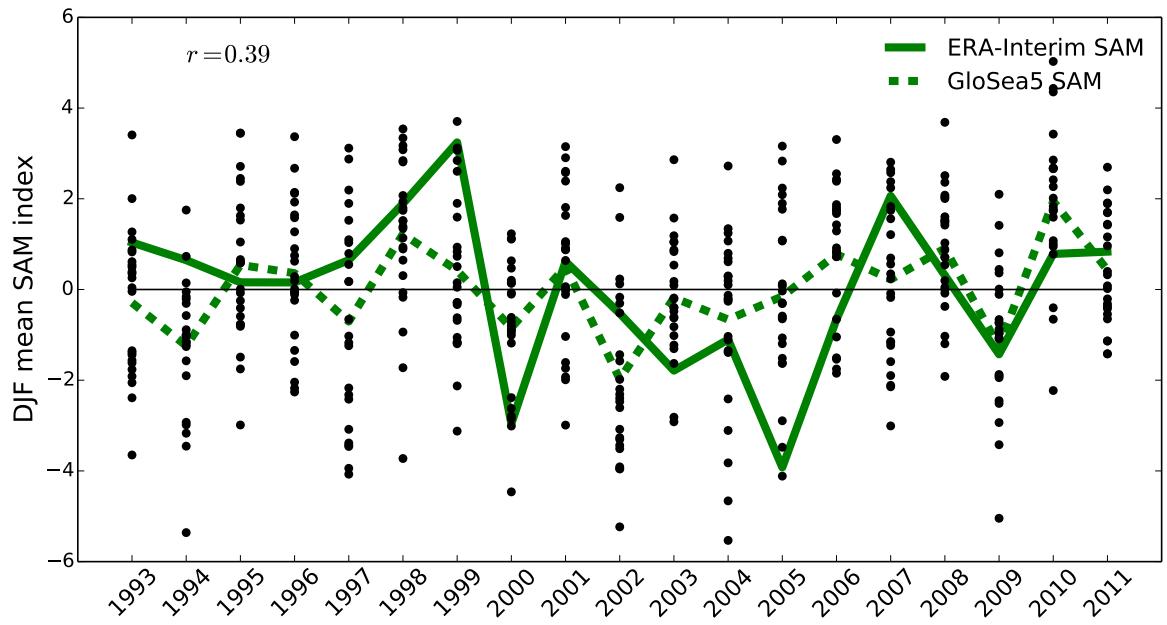


Figure 4.18: DJF mean Southern Annular Mode (SAM) index in individual GloSea5 hindcast ensemble members (dots), ensemble mean (dashed green curve) and ERA-Interim (solid green curve). The SAM is calculated from mean sea-level pressure data, and hindcasts initialised near 1st November. The correlation of the ensemble mean and ERA-Interim values is 0.39

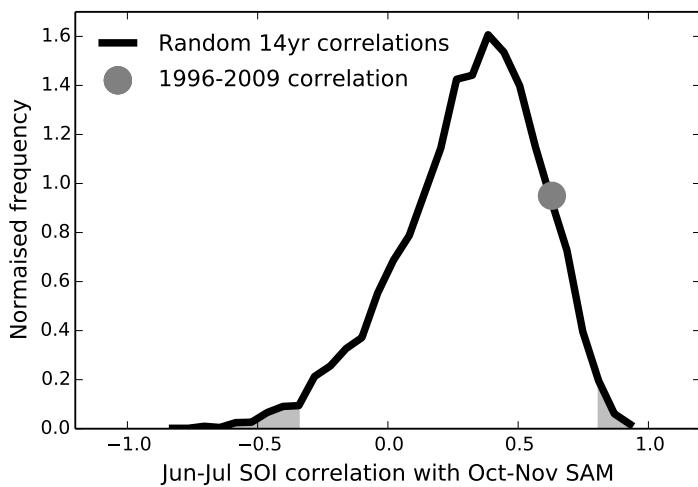


Figure 4.19: Histogram of correlations of random 14-year samples of detrended June-July SOI with October-November SAM. Also shown is the correlation over the 1996–2009 hindcast period. Grey shading indicates the < 2.5% and > 97.5% ranges.

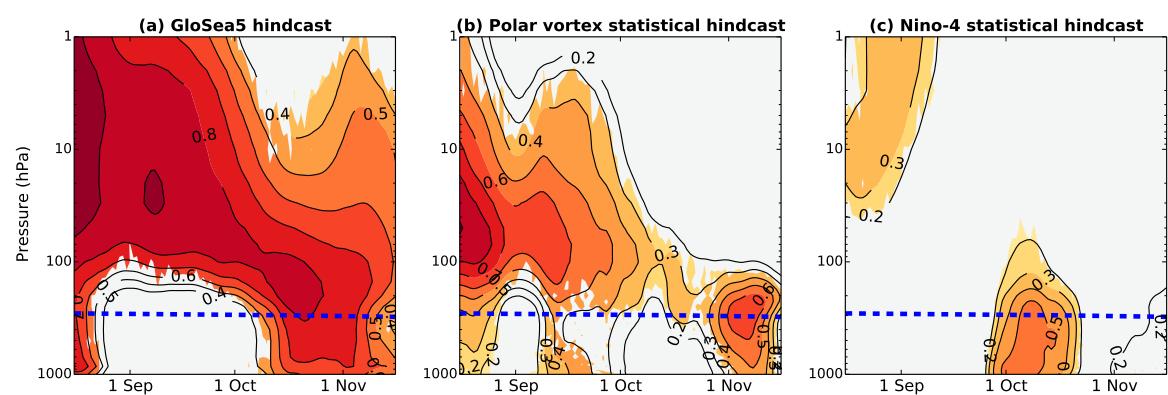


Figure 4.20: As Figure 4.13 but all analysis restricted to the 1996–2009 period.

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