Wind-driven trends in Antarctic sea-ice drift

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The sea-ice cover around Antarctica has experienced a slight expansion in area over the past decades^{1,2}. This small overall increase is the sum of much larger opposing trends in different sectors that have been proposed to result from changes in atmospheric temperature or wind stress³⁻⁵, precipitation^{6,7}, ocean temperature⁸, and atmosphere or ocean feedbacks^{9,10}. However, climate models have failed to reproduce the overall increase in sea ice¹¹. Here we present a data set of satellitetracked sea-ice motion for the period of 1992–2010 that reveals large and statistically significant trends in Antarctic ice drift, which, in most sectors, can be linked to local winds. We quantify dynamic and thermodynamic processes in the internal ice pack and show that wind-driven changes in ice advection are the dominant driver of ice-concentration trends around much of West Antarctica, whereas wind-driven thermodynamic changes dominate elsewhere. The ice-drift trends also imply large changes in the surface stress that drives the Antarctic ocean gyres, and in the fluxes of heat and salt responsible for the production of Antarctic bottom and intermediate waters.

Satellite studies of Antarctic sea-ice motion^{12–14} have greatly advanced our understanding of its large-scale dynamics, but their short length and combination of different sensors have precluded an investigation of decadal ice-motion trends. We present a new consistent data set for April–October 1992–2010 that is specifically designed to address this question (see Methods). The long-term mean of these ice-motion data is in good agreement with shorter data sets reported previously^{12–14}. Away from coastlines, the ice is close to a state of free drift, moving at a small (spatially variable) angle to the left of the geostrophic wind¹⁴, which follows contours of atmospheric pressure (Fig. 1a). This creates a tendency for the ice to circulate around the three climatological lows in the circumpolar pressure trough that surrounds Antarctica, leading to maximum ice export in the Weddell, Cooperation and Ross seas. A nearly continuous westward current dominates ice flow next to the coast.

The freely drifting areas have a strong correlation between ice motion and winds¹⁴. Figure 1b shows a map of the vector correlation between interannual time series of April–October mean ice motion and 10-m winds from the ERA-Interim atmospheric reanalysis (see Methods). The spatial mean of the correlations is $r^2 = 0.52$, but large areas in the Pacific and Atlantic sectors have $r^2 > 0.7$. This quantifies the effect of winds on ice motion through both direct wind stress and any portion of the ocean stress and sea-surface tilt forcing that is correlated to local winds. The remaining ice-motion variance can be attributed to error in the motion-tracking and atmosphere reanalysis model, ocean forcing decorrelated from local winds, and modification of ice motion by internal stresses. Low-correlation areas in Fig. 1b are generally associated with convergent ice motion or flow near coastlines, where internal stresses are large.

Our primary advance is the discovery of large and spatially variable decadal trends in ice motion (Fig. 2a), with statistically significant ice-speed changes (trend multiplied by period) of up to 30% occurring over 19 years. Changes in the meridional component of ice motion, which is largely responsible for the size and shape of the Antarctic ice cover, are even greater. Widespread increases of $\sim 2 \text{ cm s}^{-1}$ in northward export in the Ross and Amundsen seas equal the mean northward drift during this period ($\sim 2 \text{ cm s}^{-1}$), and similar northward changes ($\sim 2 \text{ cm s}^{-1}$) occur in the Kong Håkon VII Hav (mean $\sim 4 \text{ cm s}^{-1}$; King Håkon Sea hereafter). In contrast, northward ice export in the Weddell Sea decreased by \sim 1 cm s⁻¹ (mean \sim 4 cm s⁻¹), focused on a strong and significant decrease in export from the Ronne Polynya in the southwest. Bellingshausen Sea ice experienced a large but insignificant change of $\sim 3 \,\mathrm{cm}\,\mathrm{s}^{-1}$ southward, implying great variability around its mean of $\sim 1 \text{ cm s}^{-1}$ northward. Opposing ice-drift trends in the Ross and Bellingshausen seas have been inferred previously from atmospheric model winds^{4,15}, but are observed and quantified here for the first time. Changed ice motion in the southernmost Ross and Weddell seas has been shown to affect dense-water formation over limited regions^{16,17} but our data reveal widespread and coherent drift anomalies north of the near-shore polynyas.

The strong correlation between observed ice motion and reanalysis winds in most of the sea-ice zone implies that ice-motion trends are largely caused by wind trends (Fig. 2b). In fact, the correlations in Fig. 1b specifically quantify this linkage because they are calculated between the data sets used to calculate the trends shown in Fig. 2 (see Methods). Modelled surface pressure trends suggest that opposing changes in the Ross and Bellingshausen seas are responding to a large but statistically insignificant reduction in pressure centred on the Amundsen Sea, whereas changes in the Weddell and King Håkon seas are caused by a smaller but significant increase in pressure over the prime meridian. The high correlations cross-validate the ice motion tracking and reanalysis model in these regions. Agreement between the trends is poorer around East Antarctica, as expected given the proximity of the ice to the coast in this region. However, some disagreements, such as that in the Mawson Sea, are large enough to imply that the ice-motion data or reanalysis winds may be erroneous.

The ice-motion trends provide new insight into the well-known but poorly understood changes in Antarctic ice concentration. Concentration trends are largest in autumn^{1,2,4,9}, and geographical trend patterns persist largely unaltered until spring¹⁸. This suggests that most winter anomalies emanate from large changes in the autumn ice-edge advance, possibly as a result of summertime ice-ocean feedbacks^{9,19}. Autumn concentration trends for 1992-2010 (Fig. 3a) mimic those described previously for the full post-1978 satellite record^{4,18}, with large losses at the ice edge in the Bellingshausen and Mawson ($\sim 2\% \text{ yr}^{-1}$) and Weddell ($\sim 1\% \text{ yr}^{-1}$) seas outweighed by widespread gains in the Ross ($\sim 1\% \, yr^{-1}$) and King Håkon and Cosmonaut (~0.5% yr⁻¹) seas. Overlaying ice-motion trend vectors onto these changes suggests a link, with regions of significantly increased northward ice flow exhibiting significant increases in ice concentration and vice versa. This link seems strongest in the Atlantic and Pacific sectors, notably failing in the Mawson Sea. Figure 3b shows a strong and significant autumn

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Figure 1 | April-October 1992-2010 mean ice motion and its relation to wind forcing. Wind and ice motion are strongly coupled in Pacific and Atlantic sectors but weakly related around East Antarctica, where a coastal current of ice dominates. **a**, Mean ice-motion vectors overlaid on ERA-Interim reanalysis sea-level pressure. **b**, Vector correlation between ice-motion vectors and ERA-Interim 10-m wind vectors (white contours show $r^2 = 0.4$, significant at 99%). WS, Weddell Sea; KS, King Håkon Sea; CTS, Cosmonaut Sea; CNS, Cooperation Sea; MS, Mawson Sea; DS, Dumont D'Urville Sea; RS, Ross Sea; AS, Amundsen Sea; BS, Bellingshausen Sea.

deepening over the Amundsen Sea, thought to result from the increased intensity of the Southern Annular Mode^{4,5,15}. Autumn icemotion trends are again closely related to wind trends in the Atlantic and Pacific sectors and disagree elsewhere. A significant trend towards northerly winds occurs in the Mawson Sea, suggesting a wind-driven decrease in ice concentration that is not reflected in ice-motion trends.

The general link between trends in ice concentration and ice motion or winds seems strong. However, this cannot separate dynamic from thermodynamic causes, because more southerly winds could increase the ice concentration through either increased



Figure 2 | April-October 1992-2010 ice-motion trends and their relation to wind forcing. Large and statistically significant changes in ice motion are driven by changes in the winds. **a**, Ice-motion trend vectors overlaid on 19-year change in meridional ice speed (change is linear trend multiplied by period, positive northwards; black vectors have meridional ice-motion trends significant at >90%). **b**, ERA-Interim reanalysis 10-m wind trend vectors overlaid on trend in sea-level pressure (white and grey contours show pressure trends significant at 90% and 95%; black vectors have meridional wind trends significant at >90%; magenta contour shows extent of motion trends).

transport of ice from the south or through an atmospheric cooling from increased advection of cold polar air masses^{3–5}. Similarly, more northerly winds would decrease ice transport and cause atmospheric warming. Our new data present a unique opportunity to quantify these processes by decomposing the ice-concentration budget in the internal ice pack into dynamic and thermodynamic contributions. The ice concentration change and its dynamic contribution are calculated by combining concentration and motion data, and their residual is found to represent the thermodynamic contribution (see Supplementary Methods).

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Figure 3 | Autumn (April-June) 1992-2010 ice motion and concentration trends and their relation to wind forcing. Wind-driven changes in ice motion are clearly linked to changes in ice concentration. **a**, Ice-motion trend vectors overlaid on ice-concentration trends. **b**, ERA-Interim 10-m wind trend vectors overlaid on trend in sea-level pressure. White, grey and black contours show underlay field trends significant at 90%, 95% and 99% respectively; black vectors have meridional trends significant at >90%; magenta contour in **b** shows extent of concentration trends.

Before examining trends, it is instructive to first decompose the mean April–October ice-concentration budget²⁰ (Supplementary Fig. S1). Freezing in the inner pack is maintained by divergence, which supports greater ocean–atmosphere heat exchange than is otherwise possible in consolidated ice. In the main export regions, ice is advected to the margins and then melted, because it is thermodynamically unsustainable there even in winter; the ice cover in these regions extends hundreds of kilometres further equatorward than it would in the absence of northward advection. This illustrates the Antarctic Sea-ice freshwater pump, which contributes brine to Antarctic Intermediate Water and mode

waters in the ice-melting zone. In areas of mean northerly winds (Bellingshausen, Cosmonaut and Dumont D'Urville seas; Fig. 1a) southward advection opposes thermodynamic growth of the ice cover, and freezing extends closer to the ice edge.

The mean concentration difference over autumn is dominated by freezing, with advection and divergence being minor contributors during this period (Supplementary Fig. S2). However, in the Pacific sector and Weddell Sea, trends in the autumn concentration difference seem to be strongly influenced by dynamics (Supplementary Fig. S3). In contrast, trends in the King Håkon Sea are controlled by thermodynamics. Supplementary Fig. S4 shows the proportion of the autumn concentration difference trend that is explained by trends in dynamical processes. The ratio is noisy, but after heavy smoothing, it confirms that dynamic trends dominate in the Pacific sector. Trends in freezing in this sector can actually oppose the ice-concentration changes, because dynamical processes are progressively replacing thermodynamics. Ice-concentration losses in the Weddell Sea also seem to be caused by decreased northward advection, but the concentration increase in King Håkon Sea and other changes around East Antarctica contain a strong thermodynamic component. The wind trends in these regions suggest that changes in cold- and warm-air advection explain the thermodynamic trends.

The ultimate cause of the wind and ice changes lies in the largescale climate variability of the Southern Hemisphere. Antarctic sea ice can contain 3-5-year cyclic anomalies that might be partly aliased into our calculations^{1,16,21}, but our trends cover several such cycles and are consistent with longer-term studies¹⁸. Aspects of the wind trends (and therefore ice-motion trends) can be attributed to large-scale modes such as the Southern Annular Mode and El Niño/Southern Oscillation^{3,19,22}. Modern trends in these modes could arise through natural variability, but some evidence suggests that they are forced by the Southern Hemisphere ozone hole and increased greenhouse gases^{4,23}. Our conclusions that ice-motion trends are dominated by winds, and that winds contribute significantly to ice concentration trends through both dynamic and thermodynamic effects, reinforce the need for a better understanding of both the wind changes and the anthropogenic forcing of relevant climate modes.

Our conclusions are of fundamental importance in rectifying the failure of present climate models to hindcast the recent increase in Antarctic sea ice¹¹. In particular, they suggest that surface winds and ice dynamics and thermodynamics must be accurately represented. Our data set provides an observational map of changes against which models can be compared, and any faults can be diagnosed using our decomposition of the ice-concentration budget into dynamic and thermodynamic components. When climate models can hindcast ice-concentration increases we will have good reason to believe their forecasted ice loss under the effects of climate change.

Our data offer a new view of surface change relevant to all components of the Antarctic climate. The good fit between ice motion and reanalysis wind trends, in an area of extremely sparse in situ data, is testament to the power of satellite sounder data assimilation into ERA-Interim. It also implies confidence that these winds can be used to force models of Antarctic ice and ocean trends over recent decades. The large and widespread changes in ice motion imply considerable changes in sea-surface forcing, both directly through observed changes in ice stress and indirectly by validating trends in reanalysis wind stress. The ice-motion trends suggest that increased cyclonic forcing has accelerated the Ross Gyre, supporting its possible involvement in ice-sheet melting and Ross Sea freshening²⁴. The decrease in Weddell Sea ice cyclonicity suggests a Weddell Gyre deceleration, implying that gyre changes alone cannot explain the warming of Antarctic Bottom Water exported to the abyssal Atlantic²⁵. Changes in meridional ice



export also affect freshwater budgets, implying greater brine release in the southern Ross^{16,17} and King Håkon seas and increased meltwater input to their north, which may have contributed to the freshening of Antarctic Intermediate Water²⁶. The data presented here thus offer a new observational insight into many facets of the Antarctic climate system.

Methods

We produced a data set of over 5 million individual ice-motion vectors on a 100-km polar stereographic grid by tracking brightness-temperature patterns in successive daily images from Special Sensing Microwave/Imager (SSMI) instruments^{16,27}. Specifically, we used the 85 GHz vertically polarized channels of the SSMI instruments aboard satellites F8, F11, F13 and F17 of the Defense Meteorological Satellites Program. Supporting analyses used NASA (National Aeronautics and Space Administration) Team SSMI-derived ice concentrations²⁸ (http://nsidc.org/data/nsidc-0051.html) and the ERA-Interim atmospheric reanalysis (http://data-portal.ecmwf.int/data/d/interim_daily/) for the same period. Differences between the ice-motion data and analyses from higher-resolution satellite data and *in situ* buoys have mean 0–0.5 cm s⁻¹ and standard deviation 4–8 cm s⁻¹ (refs 27,29), levels of accuracy consistent with similar data sets¹³. SSMI ice-concentration data are accurate to approximately 5% for the winter measurements presented here²⁸.

We restrict our analyses to only the period of continuous daily sampled 85 GHz data, 1992–2010, producing a consistently sampled and high-quality record that allows the unambiguous identification of long-term trends. The motion-tracking procedure is less accurate when the ice is experiencing surface melt, causing more ice-motion data to be rejected during summer months, so to ensure a consistent coverage we use only data from April–October. Data are also often missing near the ice edge, because fast day-to-day changes in ice features are not resolvable by the tracking procedure. These seasonal and spatial limitations imply that our conclusions are limited to the behaviour of only the internal ice pack, away from the ice edge, and only in non-summer months. This is an important limitation because advance and retreat of the ice edge by summertime interaction with the ocean⁹.

Interannual trends at each grid point are calculated from yearly averages that are taken over either the whole observation period in each year (April–October) or only from autumn data, defined here as April–June to maximize the use of our data. A fraction of the annual ice advance (and its trends) occurs earlier in the year in some regions⁹, for which we have insufficient data. Trends are calculated separately for each component of a vector, and these vector trends are then plotted. The significance of a vector trend is itself a vector, which complicates its illustration in figures. We choose to highlight the significance of trends only in the meridional direction, because trends in northward ice export generally have the most important impacts.

The field of vector correlations presented in Fig. 1b is designed to quantify the linkage between interannual trends in winds and ice motion, so April-October daily vectors in each quantity are first averaged into yearly means, and then the 19-year time series of ice motion and wind vectors are correlated at each grid point. The relationship between time series of wind and ice-drift vectors is examined using a vector correlation measure that can be viewed as a generalization of the simple correlation coefficient between two scalar time series³⁰. According to the method, the two vector time series at each grid point would be perfectly correlated if the magnitude of the vectors were related by a constant factor and their direction subject to a constant offset. The resulting r^2 is scaled to lie between 0 and 1 here for ease of comparison with scalar correlation values. If the two vector series are independent, nr^2 is asymptotically distributed as χ^2 with four degrees of freedom, but for smaller samples ($n \ll 64$) its distribution can be calculated empirically³⁰ This can be used to assess the significance of correlations; for n = 19 and using r^2 scaled to lie between 0 and 1 we estimate that a correlation of $r^2 = 0.4$ provides a significance level of 99% (ref. 30).

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Author contributions

P.R.H. designed and performed the research and wrote the manuscript. R.K. provided the data and contributed to the manuscript.

Additional information

Supplementary information is available in the online version of the paper. Reprints and permissions information is available online at www.nature.com/reprints. Correspondence and requests for materials should be addressed to P.R.H.

Competing financial interests

The authors declare no competing financial interests.