

Divergent consensus on Arctic amplification influence on midlatitude severe winter weather

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The Arctic has warmed more than twice as fast as the global average since the late twentieth century, a phenomenon known as Arctic amplification (AA). Recently, there have been considerable advances in understanding the physical contributions to AA, and progress has been made in understanding the mechanisms that link it to midlatitude weather variability. Observational studies overwhelmingly support that AA is contributing to winter continental cooling. Although some model experiments support the observational evidence, most modelling results show little connection between AA and severe midlatitude weather or suggest the export of excess heating from the Arctic to lower latitudes. Divergent conclusions between model and observational studies, and even intramodel studies, continue to obfuscate a clear understanding of how AA is influencing midlatitude weather.

Since the 1990s, Arctic winter temperatures have shown an almost monotonic warming trend, at an accelerated rate relative to the rest of the globe. The period from the 1990s to the present is identified as the modern period of AA (Supplementary Fig. 1a). AA is strongest over the Arctic Ocean in autumn and winter, whereas during the summer it is weaker and shifted over land and the Greenland ice sheet^{1,2}. The most notable sign of climate change in the Arctic is the rapidly declining sea ice extent in summer and early autumn³ in response to various reinforcing feedbacks^{4–6}.

Over the same period, land temperatures for eastern North America, and especially eastern Eurasia, in winter have exhibited almost no warming, and indeed cooled from 2000–2013, followed by more variable winters. The recent midlatitude winter cooling period has coincided with an increase in severe winter weather events^{2,7–9}.

The rapid warming of the Arctic coupled with cooling or lack of warming in the midlatitudes has resulted in the diverging of Arctic and midlatitude temperature trends (Supplementary Fig. 1b). The pattern of a warm Arctic and cold continents/Eurasia (WACC/E) is the strongest observational evidence that some unaccounted-for mechanism has been offsetting greenhouse-gas-forced warming over the Northern Hemisphere (NH) midlatitudes^{10–13}.

Theories proposed for the midlatitude winter cooling include internal variability and tropical forcing but also a new idea—AA. Over a decade ago, it was proposed that Arctic warming (1988/89

to 2007/08) and associated changes in boundary forcing, including Arctic sea ice melt and increasing extent of autumn snow cover, influence midlatitude weather through a stratospheric pathway that favours cold temperatures across the midlatitudes^{14,15}. A composite of the temperature anomalies of the 11 subsequent winters (2009–2019; winter defined here as the months January–March) shows a similar pattern of variability, suggesting that the same physical mechanism is responsible for the WACC pattern observed in 1989–2008 and 2009–2019 (Supplementary Fig. 2). However, some differences between the two periods are noted and discussed in the Supplementary Information and in Supplementary Fig. 3. The WACC pattern was also detected during the previous AA period in the 1930s–1940s, which provides further observational support that winter continental cooling may be a forced response to AA¹⁶.

The resiliency of midlatitude winter weather was not projected by climate models¹⁷, fanning climate change scepticism, which can impede the implementation of mitigation and adaptation policies. Therefore, linking accelerated Arctic warming or AA to increased midlatitude severe winter weather is societally relevant and important, as it would assist the public and private sectors to prepare for adverse weather both in the short and long term.

Yet the challenge of demonstrating a linkage between AA and severe winter weather is daunting, given differing observational analysis methods and the large spread in modelled responses (see Supplementary Information and Supplementary Fig. 4 for a

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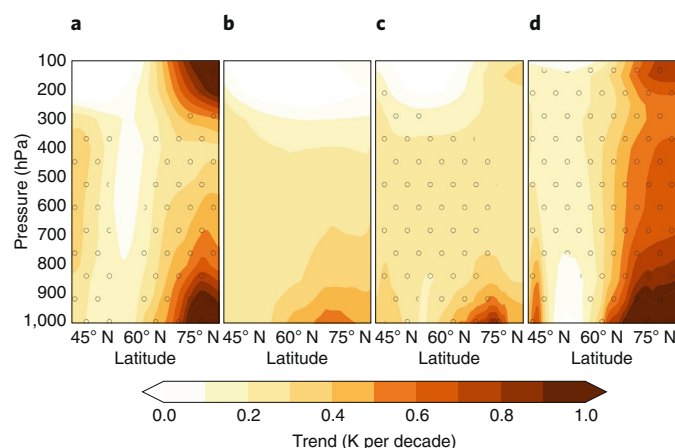


Fig. 1 | Observed and ensemble mean temperature trends show large discrepancies in winter. **a**, Winter (December, January, February: DJF) and zonal-mean air-temperature trends from December 1980 to February 2019 for the average of MERRA-2, ERA5, JRA-55 and CFSR reanalysis products for DJF. **b**, Same as **a** but for the CMIP5 multimodel ensemble mean historical simulation through 2004 and RCP8.5 simulation thereafter. **c**, Same as **a**, but for the AMIP multimodel mean. **d**, Same as **c** but for the AMIP ensemble member that best matches the reanalysis mean based on pattern correlation. Stippling indicates significant trends with $P < 0.05$ after the correction for false discovery rate was applied¹³⁵.

tabulation of observational and modelling studies). Simple causality statements for a general audience are not yet defensible. And despite a flurry of research and advances in the mechanisms linking AA to midlatitude weather, the topic remains contentious.

In this Review, we focus on winter weather. For a brief discussion on AA and extreme weather, see Supplementary Information. A separate review on summer mechanisms has recently been published¹⁸.

The character of Arctic amplification

AA is evident in the zonal-mean winter air-temperature trends for the NH and Arctic between 1980–2019, from the surface to the upper atmosphere (Fig. 1; averaged in four reanalysis datasets, henceforth known as ‘observations’ in this Review). Statistically significant warming extends throughout the troposphere but is strongest near the surface, with a second maximum in the upper troposphere and stratosphere (Fig. 1a). This winter polar stratosphere warming trend is also evident in radiosonde data¹⁹. The Arctic warming ensemble-mean simulated in the Coupled Model Intercomparison Project-5 (CMIP5) is shifted south, and lacks the magnitude and vertical extent of the observations. Also, the second warming maximum in the upper troposphere and stratosphere is absent in CMIP5 compared with the observations (Fig. 1b). The shallower simulated warming could be related to coarse vertical resolution²⁰ or an Arctic temperature inversion that is too strong²¹, which would inhibit the vertical distribution of surface warming.

Besides coupled models, we also analysed the vertical distribution of temperature trends in the Atmospheric Model Intercomparison Project (AMIP) forced with observed sea surface temperatures (SSTs) and sea ice. The results are similar to those of CMIP5, with relatively shallow and southward-shifted Arctic warming and a mostly absent secondary maximum in the lower stratosphere (Fig. 1c and Supplementary Fig. 5). Further analysis of individual ensemble members reveals that several members closely match the distribution of observed temperature trends, with deeper Arctic warming in the lower- to mid-troposphere and a secondary maximum in the stratosphere (Supplementary Fig. 6); the individual ensemble member that best matches the observations is shown in Fig. 1d.

The large ensemble spread suggests that simulated and observed differences could be due to natural variability and therefore the observed temperature trends do not necessarily represent a forced response to AA.

Arctic amplification mechanisms

Understanding of contributors to AA has evolved considerably in the past decade, emphasizing that a suite of mechanisms is responsible for the enhanced sensitivity of the Arctic^{6,22,23}. These mechanisms can be divided into local and remote forcings (summarized in Fig. 2). The local forcings include snow, sea ice albedo, cloud and ice insulation feedbacks, which are typically considered the triggers in the causal chain leading to AA^{3,24,25}. Remote forcing mechanisms involve atmospheric and ocean heat and atmospheric moisture transport from the midlatitudes and tropics into the Arctic^{26,27}. Recent studies argue that remote mechanisms have accelerated sea ice disappearance during both winter^{28–31} and summer^{28,29,32,33} and are important contributors to AA. Thus, local and remote mechanisms may interact and amplify one another²⁴. For instance, tropical convection-forced warming through the transport of heat and moisture may be further amplified by local feedback processes, such as increased clouds.

Perhaps the best-known Arctic feedback is sea ice albedo³⁴, caused by the stark albedo difference between ice-free ocean and snow-covered sea ice surfaces (about 7% and about 80% reflectance, respectively). The long-term darkening of the Arctic surface resulting from sea ice loss has been observationally confirmed, indicating a mean surface albedo reduction from 0.52 to 0.48 since 1979³⁵. The increase in vegetation over Arctic land further contributes to a darkening surface at high latitudes³⁶. Additionally, rapid continental snow cover loss in spring lowers the surface albedo and allows the underlying soil to dry out more rapidly, favouring earlier and more intense warming of high-latitude land areas³⁷.

During winter, insulation by sea ice wanes during AA²⁵. The anomalously low extent of summer sea ice exposes darker ocean water to sunlight, allowing greater absorption of solar radiation, thus warming the Arctic upper-ocean mixing-layer and promoting anomalous latent and sensible heat fluxes in the autumn. Subsequently, this process delays sea ice-growth in the autumn/winter, allowing for warmer and moister Arctic air masses that further contribute to AA^{38–40}. Analysis of surface turbulent flux trends indicate enhanced fluxes from the ocean to the atmosphere in the Chukchi and Kara Seas in recent years^{39,41–43}.

The sea ice albedo feedback is not the only important mechanism contributing to AA⁴⁴. A new consideration of equal or possibly more importance is the local feedback related to the impact of low-level mixed-phase clouds⁴⁵. The net radiative effect of Arctic clouds is to warm the surface via enhanced downward longwave radiation for much of the year (predominantly during the polar night in winter), except in June and July when the reflection of solar radiation by clouds may dominate, cooling the surface^{46,47}. The impact of clouds is further complicated by the seasonal evolution of surface albedo, including the summer sea ice melt and production of melt ponds⁴⁸. CMIP5 model results disagree on whether Arctic cloud changes dampen or amplify AA^{4,47}.

Emerging evidence suggests that downward longwave radiation from anomalous cloud cover during winter can hinder the growth of sea ice^{49–55}. In addition, analysis of CMIP5 models indicates that changes in downward longwave radiation flux from a cloudless atmosphere, rather than the sea ice albedo feedback, is the largest contributing factor to simulated AA⁴⁷. Observations indicate that trends in downward longwave radiation are positive almost everywhere, owing to increased atmospheric water vapour over the Arctic Ocean for all seasons². Additional discussion on AA mechanisms is included in the Supplementary Information.

Despite the robust signal of AA, knowledge of the mechanisms remains incomplete. The roles of meridional (poleward)

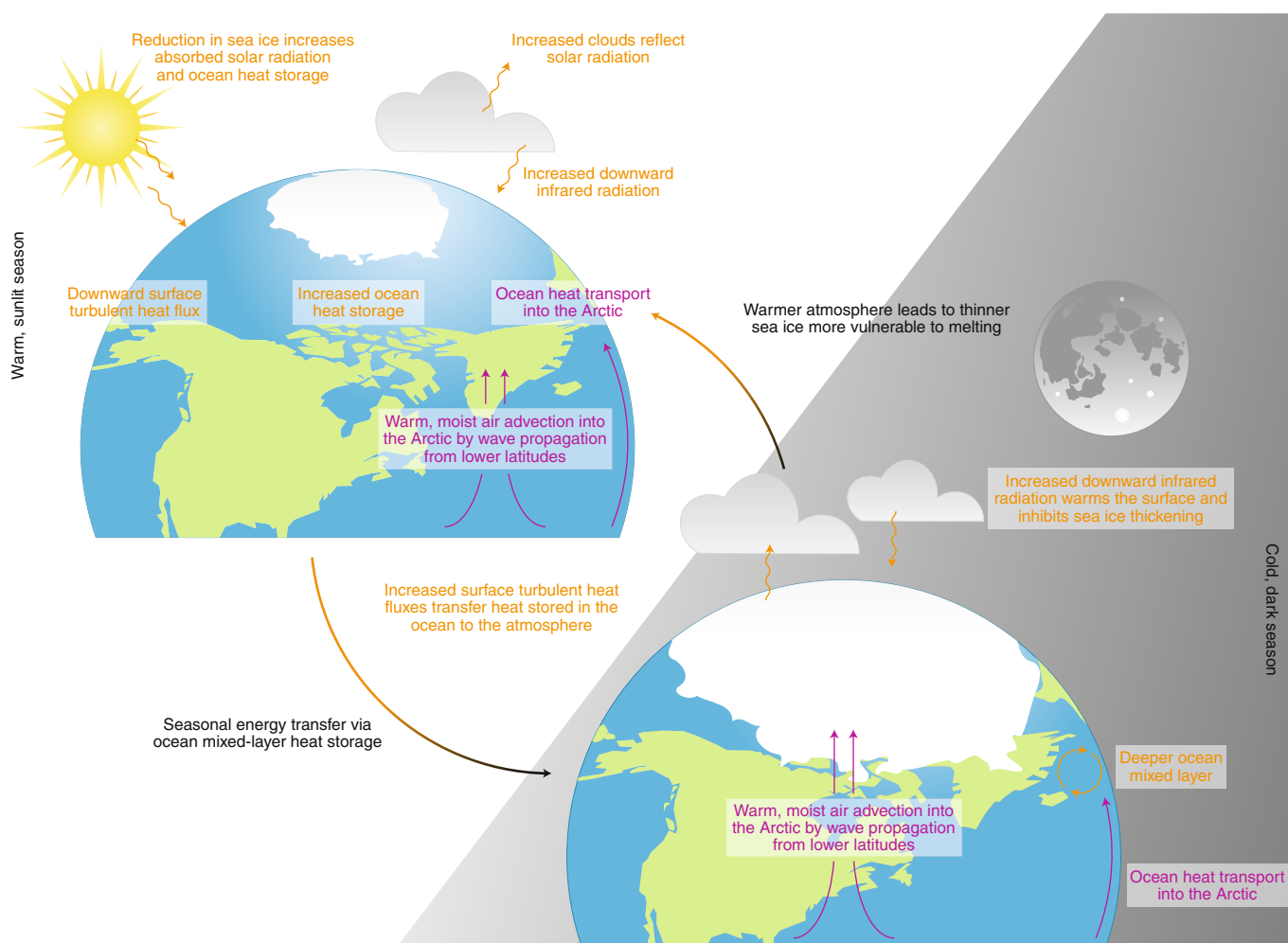


Fig. 2 | Mechanisms of Arctic amplification are complicated. This schematic diagram illustrates the important processes and energy flows influencing Arctic amplification. Local processes, such as sea ice albedo feedbacks, changes in surface turbulent fluxes, clouds, ocean heat storage and ocean mixed-layer change, are indicated in orange. Remote processes, such as atmosphere and ocean heat transport, are indicated in purple. An important aspect of Arctic amplification is the seasonal transfer of energy from the sunlit to the dark season, denoted by the graduated arrow (orange-black).

atmospheric heat and moisture transport, oceanic heat transport from midlatitudes into the Arctic^{28,29} and particularly the importance of the episodic deposition of heat and moisture at the synoptic scale are just beginning to be understood^{40,56–58}. A more comprehensive understanding of the chain of events leading to AA and the individual contributions of each process is needed, as the magnitude and mechanisms of AA fundamentally influence the character and likelihood of Arctic and midlatitude connections⁵⁹.

Arctic midlatitude linkages

Extensive new sea-ice-free areas in autumn and thinner sea ice in early winter months allow for greater heating of the overlying atmosphere, which represents a possible mechanism linking AA to midlatitude weather. Preferential warming of the Arctic atmospheric column leads to increased geopotential height thickness and a reduced meridional gradient as described by the geopotential tendency equation⁶⁰, which can slow the polar jet stream. It has been theorized that weakened zonal winds increases the likelihood of slower and more amplified Rossby waves, enhancing the possibility of blocking situations¹ and meridional transport of air masses associated with extremes. However, this idea has encountered scepticism^{61,62}.

A research challenge is to identify and understand possible links of thermal heating from Arctic sources to midlatitude weather. Amplified

warming does increase the potential for Arctic change to influence weather outside the region, especially if it increases the likelihood of high-latitude blocking. Blocking results from waves breaking within the background flow, which makes weather systems move more slowly or even become stationary^{63,64}. Like boulders blocking a river, once an atmospheric block forms, its impacts are felt both upstream and downstream of the block. Moreover, blocking events have been implicated as precursors for sudden stratospheric warmings^{65–67}, which in turn influence winter weather for up to two months^{68–70}.

Below-normal temperatures during the winter months over Europe and North America are associated with blocking anticyclones over high-latitude areas of northwestern Eurasia and Greenland, respectively^{3,71–76}. In addition to cold temperatures, recent observations show that high-latitude blocking is related to more frequent heavy snowfalls in the eastern United States⁷⁴, and an index of disruptive northeastern US snowfalls shows that over the most recent decade the population centres of this region have been adversely impacted by snowstorms three times as often as in any previous decade (Supplementary Fig. 7).

Midlatitude weather is highly complex, strongly steered by nonlinear jetstream dynamics including the impact of anomalous transient storm systems on the growth and phasing of planetary waves⁷⁷, the onset and maintenance of blocking, and the strength

and location of the Siberian High⁷⁸. Further complicating attribution of weather events is that possible signals, including Arctic forcing, are masked by internal variability⁷⁹ creating signal intermittency^{78,80}. Arctic-midlatitude linkages may also be sensitive to decadal variability in global SSTs^{81–83}. The complexity of midlatitude weather and the dependence on the background flow challenges the ability to link AA to midlatitude weather, especially episodic events such as cold air outbreaks and heavy snowfalls.

Hemisphere-wide response to AA

The exchange of heat from the Arctic Ocean to the atmosphere during delayed re-freezing in autumn and reduced vertical stability can intensify storm systems over the Arctic^{84–86}. The nonlinear interaction between storm systems and planetary-scale waves contributes to changes in the atmospheric circulation, which can constructively or destructively interfere with the large climatological standing waves; enhancement (destruction) of these waves can increase (decrease) upward propagation of energy in early to mid-winter that weakens (strengthens) the stratospheric polar vortex^{77,87,88}. The tropospheric response to either a weakened or strengthened polar vortex is hemispheric in scale and most closely resembles the negative or positive Arctic Oscillation (AO), respectively^{15,89,90}.

The earliest modelling studies demonstrated that the complete melt of Arctic sea ice forced a negative AO temperature response^{91,92}. Follow-up studies reaffirmed that regionally reduced sea ice extent predominately forced a negative AO circulation response with increased sea level pressure over the Arctic and decreased sea level pressure over the midlatitudes in winter^{93–95}.

However, a numerical study published in 2005, in which the Hadley Centre Atmosphere-3 (HadAM3) global climate model (GCM) was forced with pan-Arctic sea ice variability, found no significant relationship between differences in sea-ice concentration and the AO⁹⁶. Following this, a number of large ensemble modelling studies have come to the same conclusion—that is, there is little modelling evidence of an atmospheric response to the pan-Arctic sea ice trend^{97–99}. One possible explanation for the discrepancy in the hemispheric response between regionally and pan-Arctic-forced sea ice anomalies is that simultaneous forcing from different regions negate each other^{51,100,101}. Although Scandinavian/Ural blocking has been shown to weaken the polar vortex, Eastern Asia/Northwest Pacific blocking has been shown to strengthen it¹⁰². The response of the polar vortex to sea ice loss is dependent on the location of the ensuant blocking, which may help to interpret the diverse response to sea ice loss in models.

Regional response of AA

Previous reviews have focused on the influence of AA on midlatitude weather related to the hemispheric response projected onto the AO pattern of variability^{7,9}. However, research now suggests that regional anomalies in sea ice or temperature can force regional responses in midlatitude weather. These have focused on the relationship between sea ice loss and/or warming in the Barents–Kara Seas region with cold temperatures across Siberia and Central Asia for the recent period (that is, the WACE pattern)^{71,103–107}. A link between sea ice melt and/or warming over the Chukchi Sea and central North American cold temperatures^{12,80} and sea ice melt and/or warming in and around Greenland and eastern North American and Northern European temperatures have also been suggested^{74,108,109}. Additional detail on the regional response to AA is provided in the Supplementary Information.

Although there is a lack of consensus between observational and modelling studies on the hemispheric response to sea ice loss, there is possibly more agreement on the downstream regional response to localized Arctic sea ice loss and/or warming. Analysis of recent Arctic sea ice concentration trends shows three main regions of sea ice retreat in winter: Barents–Kara Seas, Chukchi–Bering Seas and

around Greenland (see Supplementary Fig. 8). In Fig. 3, we plot the temperature anomalies associated with above-normal winter temperatures regionally in the Arctic, in both the observations and the Hadley Centre Global Environmental Model-2 (HadGEM2⁵¹). Regional warming in the Barents–Kara Seas is linked to below normal temperatures across Central and East Asia. Regional warming in the Canadian Archipelagos–Baffin Bay and Greenland Seas is associated with below-normal temperatures across Northern and Central Europe, Siberia and, to a lesser degree, eastern North America. Finally, regional warming in the Chukchi–Bering Seas is related to below normal temperatures across Central and Eastern North America. Somewhat consistent results were found when the HadGEM2 was forced with regional sea ice loss⁵¹ (Fig. 3)—sea ice loss in the Barents–Kara Seas resulted in weak cooling across Eurasia, sea ice loss in the Canadian Archipelagos–Baffin Bay and Greenland Seas resulted in cooling across Europe, parts of Canada and the Eastern United States, and sea ice loss in the Beaufort–Chukchi Seas resulted in cooling in parts of North America.

However, even though the regression of pan-Arctic warmth with hemispheric temperatures yields midlatitude cooling in both the observations and models, pan-Arctic sea ice loss does not force a weakened polar vortex in the models^{51,100}, and cooling across the midlatitudes is nearly absent (Fig. 3). Therefore, although models do simulate regional cooling forced by regional sea ice loss, the cumulative response to each separate region does not add linearly but rather destructively, resulting in overall warming across the continents^{100,101}.

In general, the cooling from the modelling experiments is weaker than that derived from observational analysis. Additionally, while simulated regional sea ice loss results in downstream localized cooling, pan-Arctic sea ice loss results in warming across the Arctic and adjacent land areas, with almost no discernible cooling⁵¹.

Observational analysis versus modelling

Based on the consideration of a large majority of observational studies, we identified a list of proposed physical processes and/or mechanisms linking Arctic change and midlatitude weather, ordered from high to low confidence. These include: increasing geopotential thickness over the Arctic^{2,110}; weakening of the thermal wind^{3,111}; modulating stratosphere–troposphere coupling^{67,89,112}; exciting anomalous planetary waves or stationary Rossby waves in winter; changes in the atmospheric circulation and associated strengthening of the Siberian high and Aleutian low^{28,98,113}; altering storm tracks and behaviour of blockings^{86,114,115}.

The dynamical pathway considered most robust involves Barents–Kara sea ice loss contributing to a northwestward expansion of the Siberian High or Ural blocking leading to cold Eurasian winters (for example, refs. ^{9,106,107,116}). The Barents–Kara Seas region has experienced the greatest winter sea ice loss in the Arctic (Supplementary Fig. 8). This leads to large heating of the overlying atmosphere, dilation of the geopotential heights and a weakening of the westerly wind that favours increased blocking over the Barents–Kara Seas and adjacent Ural Mountains region^{107,117}. A ridge over northwestern Eurasia with a trough over northeastern Eurasia is favourable for the direct forcing of planetary waves onto the stratosphere via enhanced vertical propagation of wave energy^{88,89,118}. This can lead to wave breaking and disruption of the stratospheric polar vortex¹¹⁹. Considerable disruption of the polar vortex is then followed by a negative AO response and widespread cold temperatures across the NH midlatitude continents^{69,112} but with a focus across Asia⁷⁰.

The simulated response to Arctic sea ice loss has spanned a wide spectrum from no response to warming and cooling of the midlatitudes. Early modelling studies found that low sea ice, either pan-Arctic or east of Greenland and extending into the Barents–Kara seas, forced cold temperatures across the NH continents similar

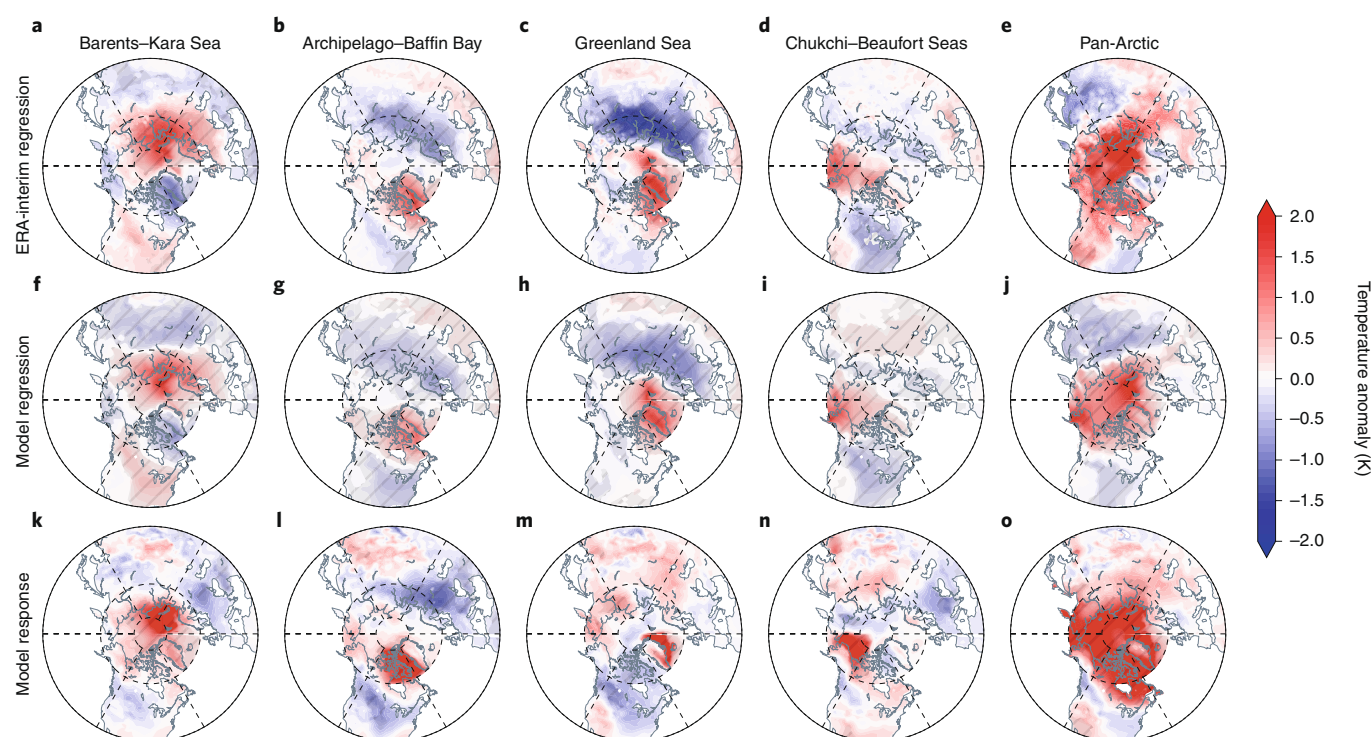


Fig. 3 | Observed and simulated winter temperature relationships to Arctic warming share similarities regionally. **a–e**, Observed NH near-surface air-temperature anomalies for all days when 850-hPa temperature anomalies were between 0.5 and 3.0 standard deviations above the climatological average for all winters (DJF) 1950–2019 in **(a)** Barents–Kara Sea, **(b)** Canadian Archipelago–Baffin Bay, **(c)** Greenland Sea, **(d)** Chukchi–Beaufort Seas and **(e)** Pan-Arctic regressed onto NH surface temperatures. Anomalies are calculated relative to climatological averages from 1981 to 2010. **f–j**, Same as for **a–e** but for atmospheric output from the ensemble-mean HadGEM2 GCM. **k–o**, October-to-March mean near-surface air-temperature responses in HadGEM2 model simulations from ref.⁵¹ to observed sea-ice loss in the **(k)** Barents–Kara Sea, **(l)** Canadian Archipelago–Baffin Bay, **(m)** Greenland Sea, **(n)** Chukchi–Beaufort Seas and **(o)** Pan-Arctic. Hatching denotes statistically significant response at the 95% confidence level using the Student's *t*-test. ERA-Interim used for observational data.

to the negative AO temperature pattern^{91–95}. However, since then, modelling studies have supported the entire range of atmospheric response, including cold continents^{12,69,71,105,106,112,116,120,121}, a disrupted stratospheric polar vortex comparable to observed^{69,112,118,121} and weaker and/or delayed relative to observed^{51,100}, a negative AO^{118,122}, a positive AO^{123,124} with mild continental temperatures¹²⁵ and finally no robust impact on midlatitude weather^{97–99,126}.

Still, despite the wide spectrum of modelled responses, in most modelling investigations, especially those involving large ensembles, the atmospheric response to low sea ice forcing is small relative to the internal variability and does not include cold winters across the NH midlatitude continents. Therefore, based on these studies, observed cooling is attributed to natural variability^{12,97–99,124,126}. However, some of the differences in observed and modelled polar vortex behaviour may be due to the fact that most GCMs are 'low-top' models and only poorly resolve the stratosphere and stratosphere–troposphere coupling mechanisms^{88,127}. Some recent 'high-top' climate models with improved stratospheric variability support an atmospheric response to sea ice loss more consistent with observational analysis^{100,112,121}.

Recent NH winter temperature trends

Temperature anomalies for the midlatitude continents (all land grid points 30°–60° N, for December to March from 1988/89 through 2018/19 from observations and the corresponding predicted temperature anomalies from the North American Multi Model Ensemble (NMME¹²⁸) initialized with atmospheric and oceanic conditions including sea ice on 1 November for each year) display little organization other than a warm temperature bias (Fig. 4a). A fairly

wide scatter of predicted and observed temperature anomalies exists over the period, which could be considered representative of the noisy nature of midlatitude weather and/or the lack of consensus in Arctic forcing.

Comparison of observations and the model forecast midlatitude continent temperature anomalies separately, however, reveals some systematic patterns (Fig. 4b). The observed temperature anomalies are always on the cold extreme of the envelope of model forecasts, and many observed winters are even colder than the most extreme cold ensemble member. When the observed values are plotted with the ensemble mean of the model forecasts only, a clear dichotomy appears (Fig. 4c)—the observed value is colder than the ensemble mean in the era of AA without exception. The models predict that the midlatitudes should be warming at a rate nearly identical to the warming for the entire NH of +0.039 °C per year. In contrast, the observations show that temperatures across the midlatitude continents have remained nearly constant and the model-simulated rate of warming is diverging from the observed rate by about +0.38 °C per year. Similarly, trend lines diverge in the Arctic, with the simulated rate of Arctic warming only half of that observed (Fig. 4d). In contrast, comparison of the tropics, midlatitude oceans (Supplementary Fig. 9) and even NH land and ocean temperature for both the observations and the model forecasts shows good agreement between the model-predicted and observed hemispheric winter temperatures trends (Fig. 4d), despite the divergence in midlatitude land and Arctic winter temperatures (Fig. 4c). Finally, in the Supplementary Information and Supplementary Fig. 10, we present summer temperature trends where the observed and simulated midlatitude temperature trends are comparable.

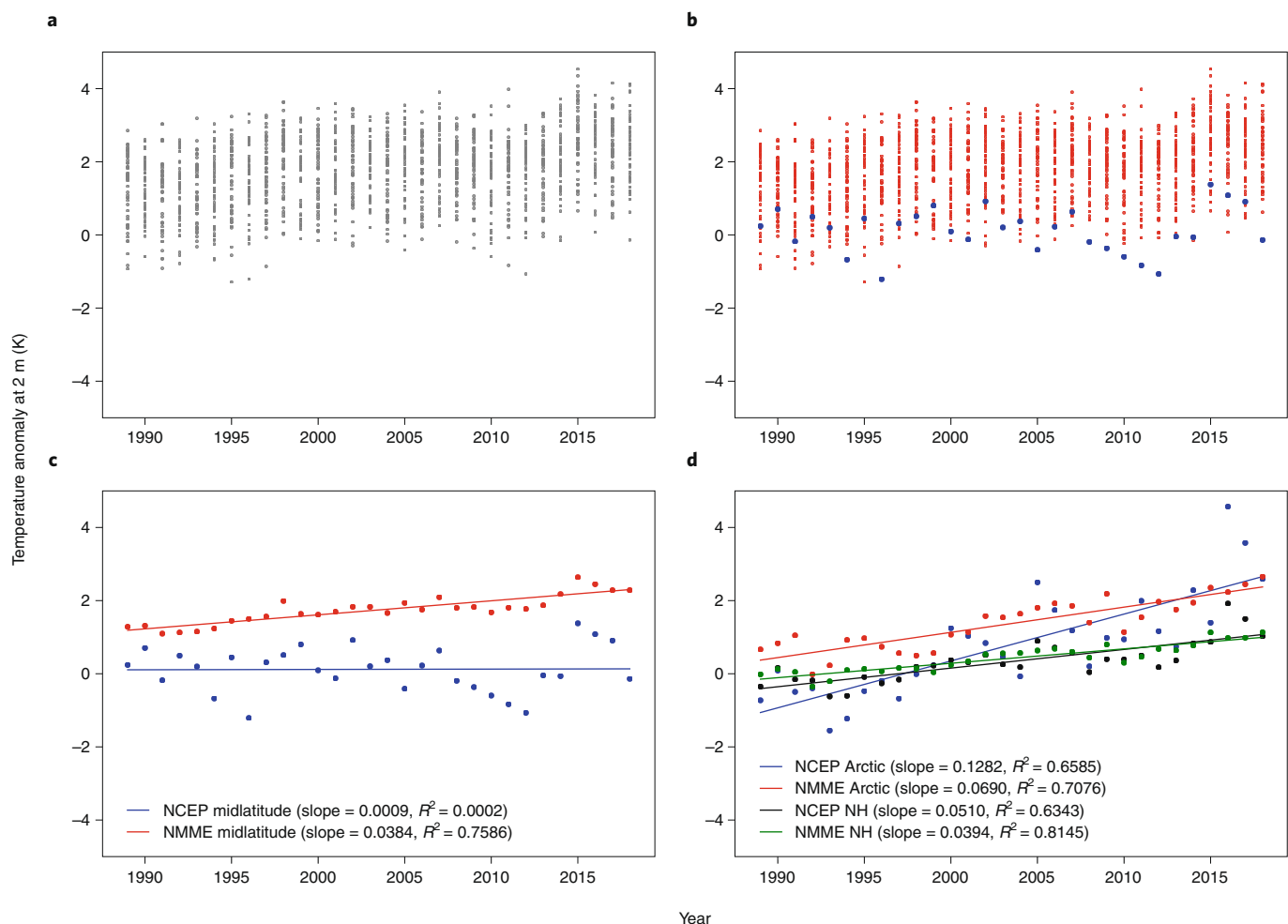


Fig. 4 | Observed and simulated midlatitude winter temperature trends are diverging. **a**, Reanalysis and hindcasted/predicted NMME individual ensemble members for NH midlatitude continental 2-metre (above the surface) temperature anomalies. **b**, Same as **a** but reanalysis (blue) and NMME (red). **c**, Reanalysis (blue) and hindcasted/predicted NMME ensemble mean (red) NH midlatitude continental temperature anomalies. Also included is the linear trend line for each dataset. **d**, Reanalysis (black) and hindcasted/predicted NMME ensemble mean (green) NH temperature anomalies and reanalysis (blue) and hindcasted/predicted NMME ensemble mean (red) Arctic temperature anomalies and linear trends. All temperature anomalies are for December, January, February and March from 1988/89 through 2018/2019. Anomalies are calculated relative to climatology from reanalysis 1981–2010 and from NMME 1982–2010 winter mean respectively. Variance (R^2) included for all trend lines. All trends except the NCEP NH midlatitude land regions are statistically significant at the >99% confidence level. There is a cold bias in the climatology of the NMME models extratropical atmosphere compared with the observations. In Supplementary Fig. 10, we show the NMME temperature anomalies relative to the NMME climatology.

These plots represent a new paradigm of two distinct and divergent camps on the influence of AA on midlatitude winter weather. Although the NH is warming in the GCMs at a rate comparable to the observed warming, the distribution of that heating is clearly different in the era of AA. The models suggest that during AA, anomalous winter warming is more equitably distributed between the Arctic and the midlatitudes so that both regions are warming at a rate comparable to or faster than the hemispheric average. In contrast, the observed temperature trends coupled with observational studies suggest that AA favours the increase of the meridional exchange of air masses between the Arctic and the midlatitudes, resulting in the NH midlatitude continents cooling relative to the whole NH as Arctic warming accelerates. This asymmetric distribution of observed NH warming is consistent with the surface temperature anomaly pattern following polar vortex disruptions⁹⁰.

Empirical studies have highlighted that the excessive Arctic heat is distributed vertically through the lower- and mid-troposphere rather than horizontally (Fig. 1). The vertical distribution of the heat in the Arctic that extends to the mid-troposphere supports

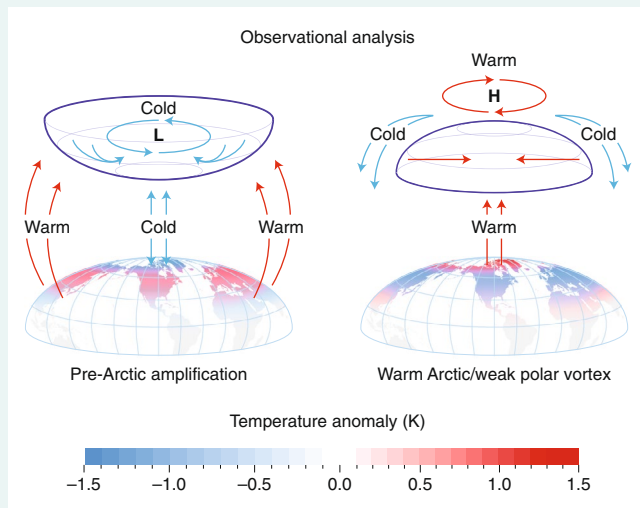
high-latitude blocking that further favours a poleward transport of heat from lower latitudes into the polar stratosphere that is conducive to disrupting the polar vortex. Following polar vortex disruptions, Arctic air is displaced into the midlatitudes, resulting in either cooling or a delay in the warming rate of the midlatitudes relative to the remainder of the NH. In contrast, model-simulated AA is relatively shallow but horizontally extensive (Fig. 1), which is only favourable for a weak disruption of the polar vortex that does not significantly cool the midlatitudes. A simplified explanation of the WACC pattern in the era of AA based on the majority of observational analysis and model data is provided in Boxes 1 and 2.

Conclusions

Improved understanding and parsing of the influence of Arctic, global SSTs and internal variability on midlatitude weather provides a clear pathway for improving subseasonal to seasonal weather outlooks that will aid policymakers in decisions and activities related to climate change. Projections have been for winters to become increasingly mild, with less frequent snowfalls. However,

Box 1 | Observational studies

Observational analyses support that AA, and in particular sea ice loss, can influence midlatitude winter weather through a stratospheric pathway. Climatology favours a strong polar vortex supported by cold air over the Arctic and milder air at lower latitudes. This temperature distribution forces low geopotential heights over the Arctic and higher heights in the midlatitudes (left panel of the figure). In recent decades, this climatologically favoured configuration of the polar vortex has become increasingly perturbed^{15,70,88,116}. Although Arctic warming is strongest at the surface (see Fig. 1 in the text), it extends throughout the mid-troposphere. In addition, the sea ice loss and associated warming is not uniform across the Arctic, but rather regionally focused. Concentration of Arctic warming in the Barents–Kara Seas dilates geopotential heights over northwestern Eurasia, leading to more frequent high-latitude Scandinavian/Ural blocking that is favourable for the excitation of vertically propagating energy associated with large-scale planetary waves^{9,67,69,88}. The increased vertical propagation of energy is coupled with more frequent intrusions of warm air from lower latitudes, depositing heat in the polar stratosphere, which causes a second maximum of Arctic warming where the polar vortex normally resides. Warming throughout the atmospheric column dilates the geopotential heights sufficiently to reverse the normal Equator–pole geopotential height gradient, resulting in cold air previously trapped near the pole to be displaced to the midlatitudes. As air flows southward away from the North Pole towards the Equator, the air is deflected to the west by the Coriolis force, forming an easterly wind around the North Pole. The redistribution of air masses that happens first in the stratosphere is then replicated through the troposphere to the surface. This completes the reversal of the NH circulation pattern with relatively warm temperatures and high geopotential heights over the Arctic and lower heights in the midlatitudes accompanied by more frequent cold air outbreaks to the midlatitudes (right panel).



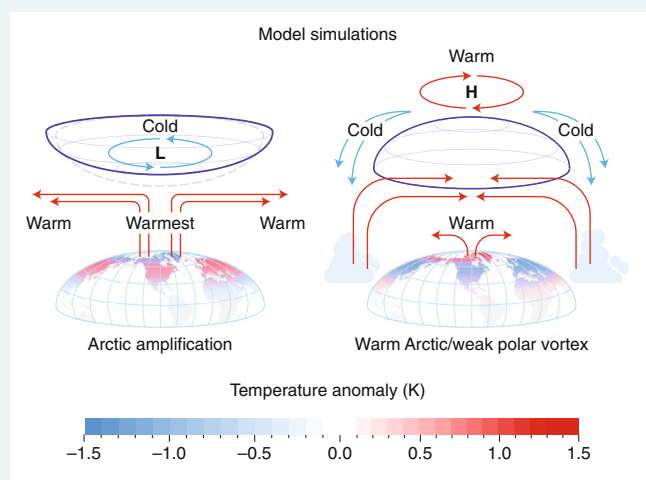
How Arctic amplification influences midlatitude weather through the polar vortex, based on observational analysis.

severe winter weather persists, and in some regions, heavy snowfalls have become more, not less, frequent⁷⁴. Although a growing number of studies argue that AA has contributed to more frequent severe winter weather across the NH continents, these are countered by others that argue differently—the influence of pan-Arctic warming is either insignificant or, alternatively, contributes to

Box 2 | Modelling data

The large-scale hemispheric circulation is similar in model simulations to the observations during the pre-AA period, with cold air over the Arctic, milder air over the midlatitudes and subtropics and the stratosphere dominated by a strong polar vortex with higher geopotential heights at lower latitudes (left panel in Box 1 figure). However, in the ensuing period of AA, the excess warming generated in the Arctic due to sea ice loss and other mechanisms described above is not redistributed vertically in model simulations, but rather horizontally (Fig. 1 in the text) via advection or conduction from the Arctic to lower latitudes¹¹. Furthermore, the CMIP5 and AMIP simulations either lack or have a relatively weak second maximum in heating in the polar stratosphere during the AA era. The simulated AA atmospheric circulation is nearly unchanged from the pre-AA period other than a weakening of the geopotential height gradient from Equator to pole, resulting in no increase in cold air outbreaks from the Arctic to the midlatitudes. Instead, cold air outbreaks are moderated, contributing to further warming of the midlatitudes (left panel). The simulated shallower Arctic heating either is insufficient in depth to force a disruption of the polar vortex or at most a polar vortex disruption of comparably weak magnitude in many modelling experiments. Therefore, any induced dynamical cooling, either due to a simulated weaker stratospheric polar vortex or a negative AO, is overwhelmed by amplified Arctic warming and the transport of the milder Arctic air southward¹³⁶. Conceptual mechanisms are derived from archived ensembles coordinated among modelling centres.

Instead, most model simulations indicate that during AA, observed colder temperatures in the midlatitudes are due to natural/internal variability or a remote forcing other than AA. As an example, changes in tropical convection transports additional heat both into the Arctic¹³⁷, resulting in amplified warming, and into the polar stratosphere, leading to a more highly disrupted polar vortex and displacement of cold air southwards to lower latitudes¹³⁸ (right panel).



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milder midlatitude winters. The divide on the influence of Arctic change has contributed to the impression that this research topic is controversial and lacking consensus^{8,129–131}. An alternative interpretation is that the wide range of results should be expected, owing to the varying approaches to studying the problem and the complexity and intermittency of Arctic/midlatitude connections^{80,132,133}.

Here we have attempted to elucidate the complexity of the topic by surveying and synthesizing observational and modelling studies so far (see Supplementary Fig. 4). First, we highlight that AA is not limited to sea ice melt but rather has multiple causes, with considerable spread among climate model projections. Although true consensus on the mechanisms of Arctic/midlatitude weather linkages is lacking, a more comprehensive assessment reveals a convergence of scientific evidence and ideas. Whereas early studies focused on the hemispheric response to sea ice anomalies, more recent studies highlight the importance of regional atmospheric response to localized sea ice anomalies; model and observational studies may share common ground demonstrating those linkages. However, we conclude that most model and observational studies diverge on the hemispheric response to pan-Arctic sea ice anomalies and warming. Overwhelmingly, observational studies argue that AA forces winter cooling across the midlatitude continents, whereas most modelling experiments do not. The spatial distribution of NH winter warming rates in the model simulations closely aligns with expectations of AA—the warming increases with latitude, the tropics warm the least, the Arctic warms the most, and the midlatitudes fall somewhere in between and close to the NH average. Therefore, the conclusion of many modelling studies is that any observed midlatitude winter continental cooling trends in the twenty-first century are due to natural variability. In contrast, observed NH winter warming rates have been characterized by moderate warming in the tropics, amplified warming in the Arctic and almost no warming across the midlatitude continents. The conclusion of empirical studies is that the distribution of observed heating rates probably cannot be explained without including dynamical arguments related to AA.

Currently, observed and simulated NH midlatitude continental temperature trends are diverging. If future midlatitude winters warm while converging towards simulated trends, then the current divergence is likely to have been a result of natural variability. Alternatively, future modelling simulations may converge towards support of the observationally derived hypothesis that AA favours colder midlatitude winters. As discussed above, modelling studies with regional sea ice melt confined to the Barents–Kara Seas and a well resolved stratosphere with interactive stratospheric chemistry do simulate a weakened polar vortex and cold mid-latitudes^{51,106,112,116,121} consistent with the observations. Precise representation of the stratosphere in models may help to resolve discrepancies between model and observational studies. A set of coordinated modelling studies is under way¹³⁴ that is designed to better quantify the forced atmospheric response to sea ice loss¹¹³.

Although further research should elucidate the varying mechanisms of Arctic/midlatitude weather linkages, it remains a challenge to extricate cause-and-effect signals from the inherently chaotic climate system. The present lack of certainty may frustrate policy-makers and the general public, but science often advances slowly on issues with great complexity and large variability. Regardless, this review of the state of research on connections between a rapidly melting Arctic and severe winter weather is timely, as large population centres in North America and Eurasia continue to experience severe cold, snowstorms and weather whiplash. Ongoing research will provide progress towards consensus on this scientifically and societally important topic.

Online content

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at <https://doi.org/10.1038/s41558-019-0662-y>.

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References

- Francis, J. A. & Vavrus, S. J. Evidence linking Arctic amplification to extreme weather in mid-latitudes. *Geophys. Res. Lett.* **39**, <https://doi.org/10.1029/2012GL051000> (2012).
- Inflential early observational study arguing that Arctic amplification is contributing to more extreme weather in all seasons.**
- Cohen, J. et al. *Arctic Change and Possible Influence on Mid-latitude Climate and Weather*. US CLIVAR Report 2018-1, <https://doi.org/10.5065/D6TH8KGW> (2018).
- Stroeve, J. C. et al. Trends in Arctic sea ice extent from CMIP5, CMIP3 and observations. *Geophys. Res. Lett.* **39**, <https://doi.org/10.1029/2012GL052676> (2012).
- Pithan, F. & Mauritsen, T. Arctic amplification dominated by temperature feedbacks in contemporary climate models. *Nat. Geosci.* **7**, 181–184 (2014).
- Döscher, R., Vihma, T. & Maksimovich, E. Recent advances in understanding the Arctic climate system state and change from a sea ice perspective: a review. *Atmos. Chem. Phys.* **14**, 13571–13600 (2014).
- Wendisch, M. et al. Understanding causes and effects of rapid warming in the Arctic. *Eos* **98**, <https://doi.org/10.1029/2017EO064803> (2017).
- Vihma, T. Effects of Arctic sea ice decline on weather and climate: a review. *Surv. Geophys.* **35**, 1175–1214 (2014).
- Overland, J. E. et al. The melting Arctic and mid-latitude weather patterns: are they connected? *J. Clim.* **28**, 7917–7932 (2015).
- Cohen, J. et al. Recent Arctic amplification and extreme mid-latitude weather. *Nat. Geosci.* **7**, 627–637 (2014).
- Overland, J. E., Wood, K. R. & Wang, M. Warm Arctic–cold continents: impacts of the newly open Arctic Sea. *Polar Res.* **30**, 15787 (2011).
- Observational study that identified warm Arctic/cold continental pattern associated with sea ice loss.**
- Cohen, J., Jones, J., Furtado, J. C. & Tziperman, E. Warm Arctic, cold continents: a common pattern related to Arctic sea ice melt, snow advance, and extreme winter weather. *Oceanography* **26**, 150–160 (2013).
- Kug, J.-S. et al. Two distinct influences of Arctic warming on cold winters over North America and East Asia. *Nat. Geosci.* **8**, 759–762 (2015).
- Showed clear link between warm temperatures in the Chukchi–East Siberian Seas and cold temperatures in North America east of the Rockies. Also supported previously shown link between warm temperatures in the Barents–Kara Seas and cold Siberia.**
- Sun, L., Perlwitz, J. & Hoerling, M. What caused the recent ‘Warm Arctic, Cold Continents’ trend pattern in winter temperatures? *Geophys. Res. Lett.* **43**, 5345–5352 (2016).
- Cohen, J. & Barlow, M. The NAO, the AO, and global warming: how closely related? *J. Clim.* **18**, 4498–4513 (2005).
- Cohen, J., Barlow, M. & Saito, K. Decadal fluctuations in planetary wave forcing modulate global warming in late boreal winter. *J. Clim.* **22**, 4418–4426 (2009).
- Wegmann, M., Orsolini, Y. J. & Zolina, O. Warm Arctic–cold Siberia: comparing the recent and the early 20th century Arctic warmings. *Environ. Res. Lett.* **13**, <https://doi.org/10.1088/1748-9326/aaa0b7> (2018).
- Cohen, J., Furtado, J., Barlow, M., Alexeev, V. & Cherry, J. Arctic warming, increasing fall snow cover and widespread boreal winter cooling. *Environ. Res. Lett.* **7**, 014007 (2012).
- Argued that Arctic amplification including melting sea ice and extensive snow cover was contributing to a negative Arctic Oscillation and cold continental temperature trends. Also demonstrated that model projected and observed winter temperature trends were diverging.**
- Coumou, D., Di Capua, G., Vavrus, S., Wang, L. & Wang, S. The influence of Arctic amplification on mid-latitude summer circulation. *Nat. Commun.* **9**, 2959 (2018).
- Alexeev, V. A. et al. Vertical structure of recent Arctic warming from observed data and reanalysis products. *Climatic Change* **111**, 215–239 (2012).
- Vihma, T. in *Climate Extremes: Patterns and Mechanisms* (eds Wang, S.-Y. S. et al.) Ch. 2 (AGU Geophysical Monograph Series 226, 2017).
- Boe, J., Hall, A. & Qu, X. Current GCMs’ unrealistic negative feedback in the Arctic. *J. Clim.* **22**, 4682–4695 (2009).
- Alexeev, V. A., Langen, P. L. & Bates, J. R. Polar amplification of surface warming on an aquaplanet in ‘ghost forcing’ experiments without sea ice feedbacks. *Clim. Dyn.* **24**, 655–666 (2005).
- Manabe, S. & Wetherald, R. T. The effects of doubling the CO₂ concentration on the climate of a general circulation model. *J. Atmos. Sci.* **32**, 3–15 (1975).
- An early paper that showed Arctic or polar amplification due to local feedbacks in model projections forced by anthropogenic greenhouse warming.**
- Stuecker, M. F. et al. Polar amplification dominated by local forcing and feedbacks. *Nat. Clim. Change* **8**, 1076–1081 (2018).
- Dai, A., Luo, D., Song, M. & Liu, J. Arctic amplification is caused by sea-ice loss under increasing CO₂. *Nat. Commun.* **10**, 121 (2019).
- Rigor, I. G., Wallace, M. & Colony, R. Response of sea ice to the Arctic Oscillation. *J. Clim.* **15**, 2648–2663 (2002).

27. Zhang, X., Ikeda, M. & Walsh, J. E. Arctic sea-ice and freshwater changes driven by the atmospheric leading mode in a coupled sea ice–ocean model. *J. Clim.* **16**, 2159–2177 (2003).
28. Zhang, X., Sorteberg, A., Zhang, J., Gerdes, R. & Comiso, J. C. Recent radical shifts in atmospheric circulations and rapid changes in Arctic climate system. *Geophys. Res. Lett.* **35**, L22701 (2008).
Identified radical spatial changes in the large-scale atmospheric circulation showing a contracted/weakened Icelandic low and a northward extended/strengthened Siberian high; linked the amplified Arctic warming/accelerated decrease in sea ice in the Barents–Kara seas to Eurasian cooling.
29. Zhang, X. et al. Enhanced poleward moisture transport and amplified northern high-latitude wetting trend. *Nat. Clim. Change* **3**, 47–51 (2013).
30. Park, D.-S., Lee, S. & Feldstein, S. B. Attribution of the recent winter sea-ice decline over the Atlantic sector of the Arctic Ocean. *J. Clim.* **28**, 4027–4033 (2015).
31. Gong, T., Feldstein, S. B. & Lee, S. The role of downward infrared radiation in the recent Arctic winter warming trend. *J. Clim.* **30**, 4937–4949 (2017).
32. Laliberte, F. & Kushner, P. J. Midlatitude moisture contribution to recent Arctic tropospheric summertime variability. *J. Clim.* **27**, 5693–5706 (2014).
33. Ding, Q. et al. Influence of high-latitude atmospheric circulation changes on summertime Arctic sea ice. *Nat. Clim. Change* **7**, 289–295 (2017).
34. Perovich, D. K., Richter-Menge, J. A., Jones, K. F. & Light, B. Sunlight, water, and ice: extreme Arctic sea ice melt during the summer of 2007. *Geophys. Res. Lett.* **35**, <https://doi.org/10.1029/2008gl034007> (2008).
35. Pistone, K., Eisenman, I. & Ramanathan, V. Observational determination of albedo decrease caused by vanishing Arctic sea ice. *Proc. Natl Acad. Sci. USA* **111**, 3322–3326 (2014).
36. Jeong, J.-H. et al. Intensified Arctic warming under greenhouse warming by vegetation–atmosphere–sea ice interaction. *Environ. Res. Lett.* **9**, 094007 (2014).
37. Overland, J. E., Francis, J. A., Hanna, E. & Wang, M. The recent shift in early summer Arctic atmospheric circulation. *Geophys. Res. Lett.* **39**, L19804 (2012).
38. Serreze, M. C. & Francis, J. A. The arctic amplification debate. *Climatic Change* **76**, 241–264 (2006).
39. Screen, J. A. & Simmonds, I. The central role of diminishing sea ice in recent Arctic temperature amplification. *Nature* **464**, 1334–1337 (2010).
40. Pithan, F. et al. Role of air-mass transformations in exchange between the Arctic and mid-latitudes. *Nat. Geosci.* **11**, 805–812 (2018).
41. Boisvert, L. N., Wu, D. L. & Shie, C.-L. Increasing evaporation amounts seen in the Arctic between 2003 and 2013 from AIRS data. *J. Geophys. Res.* **120**, 6865–6881 (2015).
42. Boisvert, L. N. & Stroeve, J. C. The Arctic is becoming warmer and wetter as revealed by the Atmospheric Infrared Sounder. *Geophys. Res. Lett.* **42**, 4439–4446 (2015).
43. Taylor, P. C., Hegyi, B. M., Boeke, R. C. & Boisvert, L. N. On the increasing importance of air–sea exchanges in a thawing Arctic: a review. *Atmos.* **9**, <https://doi.org/10.3390/atmos9020041> (2018).
44. Winton, M. Amplified Arctic climate change: what does surface albedo feedback have to do with it? *Geophys. Res. Lett.* **33**, L03701 (2006).
45. Wendisch, M. et al. The Arctic cloud puzzle: using ACLOUD/PASCAL multi-platform observations to unravel the role of clouds and aerosol particles in Arctic amplification. *Bull. Am. Meteorol. Soc.* **100**, 841–871 (2019).
46. Kay, J. E. & L’Ecuyer, T. Observational constraints on Arctic ocean clouds and radiative fluxes during the early 21st century. *J. Geophys. Res. Atmos.* **118**, 7219–7236 (2013).
47. Boeke, R. C. & Taylor, P. C. Seasonal energy exchanges in sea ice retreat regions contribute to the inter-model spread in projected Arctic warming. *Nat. Commun.* **9**, 5017 (2018).
48. Intrieri, J. M. et al. An annual cycle of Arctic surface cloud forcing at SHEBA. *J. Geophys. Res.* **107**, <https://doi.org/10.1029/2000JC000423> (2002).
49. Uttal, T. et al. Surface heat budget of the Arctic Ocean. *Bull. Am. Meteorol. Soc.* **83**, 255–275 (2002).
50. Francis, J. A., Hunter, E., Key, J. R. & Wang, X. Clues to variability in Arctic minimum sea ice extent. *Geophys. Res. Lett.* **32**, <https://doi.org/10.1029/2005GL024376> (2005).
51. Screen, J. A. Simulated atmospheric response to regional and Pan-Arctic sea-ice loss. *J. Clim.* **30**, <https://doi.org/10.1175/JCLI-D-16-0197.1> (2017).
Observational and modelling showing the atmospheric to regional and pan-Arctic response to Arctic warming/sea ice loss.
52. Liu, Y. & Key, J. R. Less winter cloud aids summer 2013 Arctic sea ice return from 2012 minimum. *Environ. Res. Lett.* **9**, <https://doi.org/10.1088/1748-9326/9/4/044002> (2014).
53. Lee, S. A theory for polar amplification from a general circulation perspective. *Asia-Pac. J. Atmos. Sci.* **50**, 31–43 (2014).
54. Park, H.-S., Lee, S., Kosaka, Y., Son, S.-W. & Kim, S.-W. The impact of Arctic winter infrared radiation on early summer sea ice. *J. Clim.* **28**, 6281–6296 (2015).
55. Hegyi, B. M. & Taylor, P. C. The regional influence of the Arctic Oscillation and Arctic Dipole on the wintertime Arctic surface radiation budget and sea ice growth. *Geophys. Res. Lett.* **44**, 4341–4350 (2017).
56. Woods, C. & Caballero, R. The role of moist intrusions in winter Arctic warming and sea ice decline. *J. Clim.* **29**, 4473–4485 (2016).
57. Kim, B.-M. et al. Major cause of unprecedented Arctic warming in January 2016: Critical role of an Atlantic windstorm. *Sci. Rep.* **7**, 40051 (2017).
58. Hegyi, B. M. & Taylor, P. C. The unprecedented 2016–17 Arctic sea ice growth season: the crucial role of atmospheric rivers and longwave fluxes. *Geophys. Res. Lett.* **45**, 5204–5212 (2018).
59. Messori, G., Woods, C. & Caballero, R. On the drivers of wintertime temperature extremes in the High Arctic. *J. Clim.* **31**, 1597–1618 (2018).
60. Holton, J. R. *An Introduction to Dynamic Meteorology* 2nd edn (Academic, 1979).
61. Barnes, E. A. Revisiting the evidence linking Arctic amplification to extreme weather in midlatitudes. *Geophys. Res. Lett.* **40**, 4734–4739 (2013).
Early paper that was sceptical of reported Arctic–mid-latitude linkages and found no evidence that Arctic amplification was contributing to increased blocking or extreme weather.
62. Screen, J. A. & Simmonds, I. Exploring links between Arctic amplification and mid-latitude weather. *Geophys. Res. Lett.* **40**, 959–964 (2013).
63. Rex, D. F. Blocking action in the middle troposphere and its effect upon regional climate. I. An aerological study of blocking action. *Tellus* **2**, 196–211 (1950).
64. Rex, D. P. Blocking action in the middle troposphere and its effect upon regional climate. II. The climatology of blocking actions. *Tellus* **2**, 275–301 (1950).
65. Quiroz, R. S. Tropospheric–stratospheric interaction in the major warming event of January–February 1979. *Geophys. Res. Lett.* **6**, 645–648 (1979).
66. Quiroz, R. S. The association of stratospheric warmings with tropospheric blocking. *J. Geophys. Res.* **91**, 5277–5285 (1986).
67. Martius, O., Polvani, L. M. & Davies, H. C. Blocking precursors to stratospheric sudden warming events. *Geophys. Res. Lett.* **36**, L14806 (2009).
68. Baldwin, M. P. & Dunkerton, T. J. Stratospheric harbingers of anomalous weather regimes. *Science* **294**, 581–584 (2001).
69. Kim, B.-M. et al. Weakening of the stratospheric polar vortex by Arctic sea-ice loss. *Nat. Commun.* **5**, <https://doi.org/10.1038/ncomms5646> (2014).
Early paper that established stratospheric pathway for atmospheric response to sea ice loss in the Barents–Kara sea in both observations and modelling experiments.
70. Kretschmer, M. et al. More frequent weak stratospheric polar vortex states linked to mid-latitude cold extremes. *Bull. Am. Meteorol. Soc.* **99**, 49–60 (2018).
71. Honda, M., Inoue, J. & Yamane, S. Influence of low Arctic sea-ice minima on anomalously cold Eurasian winters. *Geophys. Res. Lett.* **36**, <https://doi.org/10.1029/2008GL037079> (2009).
Early paper showing through model experiments that sea ice loss in the Barents–Kara Seas can force in cold Siberian temperatures by exciting a Rossby wave train.
72. Sillmann, J., Croci-Maspoli, M., Kallache, M. & Katz, R. W. Extreme cold winter temperatures in Europe under the influence of North Atlantic atmospheric blocking. *J. Clim.* **24**, 5899–5913 (2011).
73. Zhang, X., Lu, C. & Guan, Z. Weakened cyclones, intensified anticyclones, and the recent extreme cold winter weather events in Eurasia. *Environ. Res. Lett.* **7**, 044044 (2012).
74. Cohen, J., Pfeiffer, K. & Francis, J. Warm Arctic episodes linked with increased frequency of extreme winter weather in the United States. *Nat. Commun.* **9**, 869 (2018).
75. Johnson, N. C., Xie, S.-P., Kosaka, Y. & Li, X. Increasing occurrence of cold and warm extremes during the recent global warming slowdown. *Nat. Commun.* **9**, 1724 (2018).
76. Hanna, E. et al. Greenland Blocking Index daily series 1851–2015: analysis of changes in extremes and links with North Atlantic and UK climate variability and change. *Int. J. Climatol.* **38**, 3546–3564 (2018).
77. Lee, S. H., Charlton-Perez, A. J., Furtado, J. C. & Woolnough, S. J. Abrupt stratospheric vortex weakening associated with North Atlantic anticyclonic wave breaking. *J. Geophys. Res.* **124**, <https://doi.org/10.1029/2019JD030940> (2019).
78. Overland, J. E. et al. Nonlinear response of mid-latitude weather to the changing Arctic. *Nat. Clim. Change* **6**, 992–999 (2016).
79. Shepherd, T. G. Effects of Arctic warming. *Science* **353**, 989–990 (2016).
80. Overland, J. E. & Wang, M. Resolving future Arctic/Midlatitude weather connections. *Earth’s Future* **6**, 1146–1152 (2018).
81. Screen, J. A. & Francis, J. A. Contribution of sea-ice loss to Arctic amplification is regulated by Pacific Ocean decadal variability. *Nat. Clim. Change* **6**, 856–860 (2016).
82. Osborn, T. J., Jones, P. D. & Joshi, M. Recent United Kingdom and global temperature variations. *Weather* **72**, 323–329 (2017).

83. Li, F., Orsolini, Y. J., Wang, H., Gao, Y. & He, S. Atlantic multidecadal oscillation modulates the impacts of Arctic sea ice decline. *Geophys. Res. Lett.* **45**, 2497–2506 (2018).
84. Jaiser, R., Dethloff, K., Handorf, D., Rinke, A. & Cohen, J. Impact of sea ice cover changes on the Northern Hemisphere atmospheric winter circulation. *Tellus A* **64**, <https://doi.org/10.3402/tellusa.v64i0.11595> (2012).
85. Semmler, T. et al. Seasonal atmospheric responses to reduced Arctic sea ice in an ensemble of coupled model simulations. *J. Clim.* **29**, 5893–5913 (2016).
86. Basu, S., Zhang, X. & Wang, Z. Eurasian winter storm activity at the end of the century: a CMIP5 multi-model ensemble projection. *Earth's Future* **6**, 61–70 (2018).
87. Smith, K., Kushner, P. J. & Cohen, J. The role of linear interference in Northern Annular Mode variability associated with Eurasian snow cover extent. *J. Clim.* **24**, 6185–6202 (2011).
88. Wu, Y. & Smith, K. L. Response of Northern Hemisphere midlatitude circulation to Arctic amplification in a simple atmospheric general circulation model. *J. Clim.* **29**, 2041–2058 (2016).
89. Cohen, J., Barlow, M., Kushner, P. J. & Saito, K. Stratosphere–troposphere coupling and links with Eurasian land surface variability. *J. Clim.* **20**, 5335–5343 (2007).
90. Butler, A. H., Sjöberg, J. P., Seidel, D. J. & Rosenlof, K. H. A sudden stratospheric warming compendium. *Earth Syst. Sci. Data* **9**, 63–76 (2017).
91. Newton, R. L. Response of a general circulation model of the atmosphere to removal of the Arctic ice-cap. *Nature* **241**, 39–40 (1973).
92. Warshaw, M. & Rapp, R. R. An experiment on the sensitivity of a global circulation model. *J. Appl. Meteorol.* **12**, 43–49 (1973).
93. Magnusdottir, G., Deser, C. & Saravanan, R. The effects of North Atlantic SST and sea-ice anomalies on the winter circulation in CCM3. Part I: Main features and storm track characteristics of the response. *J. Clim.* **17**, 857–876 (2004).
94. Deser, C., Magnusdottir, G., Saravanan, R. & Phillips, A. The effects of North Atlantic SST and sea-ice anomalies on the winter circulation in CCM3. Part II: Direct and indirect components of the response. *J. Clim.* **17**, 877–889 (2004).
95. Alexander, M. A. et al. The atmospheric response to realistic Arctic sea-ice anomalies in an AGCM during winter. *J. Clim.* **17**, 890–905 (2004).
96. Singarayer, J. S., Valdes, P. J. & Bamber, J. L. The atmospheric impact of uncertainties in recent Arctic sea-ice reconstructions. *J. Clim.* **18**, 3996–4012 (2005).
- Modelling paper that showed no relationship between sea ice variability and the North Atlantic Oscillation, an early precursor for many more modelling studies.**
97. McCusker, K. E., Fyfe, J. C. & Sigmond, M. Twenty-five winters of unexpected Eurasian cooling unlikely due to Arctic sea ice loss. *Nat. Geosci.* **9**, 838–842 (2016).
98. Blackport, R. & Kushner, P. J. Isolating the atmospheric circulation response to Arctic sea ice loss in the coupled climate system. *J. Clim.* **30**, 2163–2185 (2017).
99. Ogawa, F. et al. Evaluating impacts of recent Arctic sea ice loss on the Northern Hemisphere winter climate change. *Geophys. Res. Lett.* **45**, 3255–3263 (2018).
100. Sun, L., Deser, C. & Tomas, R. A. Mechanisms of stratospheric and tropospheric circulation response to projected Arctic sea ice loss. *J. Clim.* **28**, 7824–7845 (2015).
101. McKenna, C. M., Bracegirdle, T. J., Shuckburgh, E. F., Haynes, P. H. & Joshi, M. M. Arctic sea-ice loss in different regions leads to contrasting Northern Hemisphere impacts. *Geophys. Res. Lett.* **44**, <https://doi.org/10.1002/2017GL076433> (2017).
102. Nishii, K., Nakamura, H. & Orsolini, Y. J. Geographical dependence observed in blocking high influence on the stratospheric variability through enhancement and suppression of upward planetary-wave propagation. *J. Clim.* **24**, 6408–6423 (2011).
103. Petoukhov, V. & Semenov, V. A link between reduced Barents–Kara sea ice and cold winter extremes over northern continents. *J. Geophys. Res.* **115**, <https://doi.org/10.1029/2009JD013568> (2010).
104. Chen, H. W., Alley, R. B. & Zhang, F. Interannual Arctic sea ice variability and associated winter weather patterns: a regional perspective for 1979–2014. *J. Geophys. Res. Atmos.* **121**, <https://doi.org/10.1002/2016JD024769> (2016).
105. Mori, M., Watanabe, M., Shiogama, H., Inoue, J. & Kimoto, M. Robust Arctic sea-ice influence on the frequent Eurasian cold winters in past decades. *Nat. Geosci.* **7**, 869–873 (2014).
- Model study demonstrating that sea ice loss in the Barents–Kara Seas forces increased blocking and cold temperatures across Eurasia in winter.**
106. Mori, M., Kosaka, Y., Watanabe, M., Nakamura, H. & Kimoto, M. A reconciled estimate of the influence of Arctic sea-ice loss on recent Eurasian cooling. *Nat. Clim. Change* **9**, 123–129 (2019).
107. Luo, D., Xiao, Y., Yao, Y., Dai, A., Simmonds, I. & Franzke, C. Impact of Ural blocking on winter warm Arctic–cold Eurasian anomalies. Part I: Blocking-induced amplification. *J. Clim.* **29**, 3925–3947 (2016).
108. Chen, X. & Luo, D. Arctic sea ice decline and continental cold anomalies: upstream and downstream effects of Greenland blocking. *Geophys. Res. Lett.* **44**, 3411–3419 (2017).
109. Vihma, T. et al. Effects of the tropospheric large-scale circulation on European winter temperatures during the period of amplified Arctic warming. *Int. J. Climatol.*, <https://doi.org/10.1002/joc.6225> (2019).
110. Overland, J. E. & Wang, M. Large-scale atmospheric circulation changes are associated with the recent loss of Arctic sea ice. *Tellus* **62A**, 1–9 (2010).
111. Outten, S. D. & Esau, I. A link between Arctic sea ice and recent cooling trends over Eurasia. *Climatic Change* **110**, 1069–1075 (2012).
112. Zhang, P. et al. A stratospheric pathway linking a colder Siberia to Barents–Kara sea ice loss. *Sci. Adv.* **4**, eaat6025 (2018).
113. Screen, J. A. et al. Consistency and discrepancy in the atmospheric response to Arctic sea-ice loss across climate models. *Nat. Geosci.* **11**, 155–163 (2018).
114. Francis, J. & Vavrus, S. Evidence for a wavier jet stream in response to rapid Arctic warming. *Environ. Res. Lett.* **10**, <https://doi.org/10.1088/1748-9326/10/1/014005> (2015).
115. Di Capua, G. & Coumou, D. Changes in meandering of the Northern Hemisphere circulation. *Environ. Res. Lett.* **11**, <https://doi.org/10.1088/1748-9326/11/9/094028> (2016).
116. Hoshi, K. et al. Weak stratospheric polar vortex events modulated by the Arctic sea ice loss. *J. Geophys. Res.* **124**, <https://doi.org/10.1029/2018JD029222> (2019).
117. Yao, Y., Luo, D., Dai, A. & Simmonds, I. Increased quasi stationarity and persistence of Ural blocking and Eurasian extreme cold events in response to Arctic warming. Part I: Insights from observational analyses. *J. Clim.* **30**, 3549–3568 (2017).
118. Nakamura, T. et al. A negative phase shift of the winter AO/NAO due to the recent Arctic sea-ice reduction in late autumn. *J. Geophys. Res.* **120**, 3209–3227 (2015).
119. Jaiser, R. et al. Atmospheric winter response to Arctic sea ice changes in reanalysis data and model simulations. *J. Geophys. Res.* **121**, 7564–7577 (2016).
120. Orsolini, Y., Senan, R., Benestad, R. E. & Melsom, A. Autumn atmospheric response to the 2007 low Arctic sea ice extent in coupled ocean–atmosphere hindcasts. *Clim. Dyn.* **38**, 2437–2448 (2012).
121. Romanowsky, E. et al. The role of stratospheric ozone for Arctic–midlatitude linkages. *Sci. Rep.* <https://doi.org/10.1038/s41598-019-43823-1> (2019).
122. Deser, C., Tomas, R. A. & Sun, L. The role of ocean–atmosphere coupling in the zonal-mean atmospheric response to Arctic sea ice loss. *J. Clim.* **28**, 2168–2186 (2015).
123. Screen, J. A., Deser, C., Simmonds, I. & Tomas, R. Atmospheric impacts of Arctic sea-ice loss, 1979–2009: separating forced change from atmospheric internal variability. *Clim. Dyn.* **43**, 333–344 (2014).
124. Smith, D. M. et al. Atmospheric response to Arctic and Antarctic sea ice: the importance of ocean–atmosphere coupling and the background state. *J. Clim.* **30**, 4547–4565 (2017).
125. Ayarzagüena, B. & Screen, J. A. Future Arctic sea-ice loss reduces severity of cold air outbreaks in midlatitudes. *Geophys. Res. Lett.* **43**, 2801–2809 (2016).
126. Chen, H. W., Zhang, F. & Alley, R. B. The robustness of midlatitude weather pattern changes due to Arctic sea ice loss. *J. Clim.* **29**, 7831–7849 (2016).
127. Charlton-Perez, A. et al. On the lack of stratospheric dynamical variability in low-top versions of the CMIP5 models. *J. Geophys. Res.* **118**, 2494–2505 (2013).
128. Kirtman, B. P. et al. The North American Multimodel Ensemble. *Bull. Am. Meteorol. Soc.* **17**, 585–601 (2014).
129. Wallace, J. M., Held, I. M., Thompson, D. W. J., Trenberth, K. E. & Walsh, J. E. Global warming and winter weather. *Science* **343**, 729–730 (2014).
130. Kintisch, E. Into the maelstrom. *Science* **344**, 250–253 (2014).
131. Gramling, C. Arctic impact. *Science* **347**, 818–821 (2015).
132. Francis, J. A., Vavrus, S. J. & Cohen, J. Amplified Arctic warming and mid-latitude weather: new perspectives on emerging connections. *WIREs Clim. Change* **E474**, <https://doi.org/10.1002/wcc.474> (2017).
133. Vavrus, S. J. The influence of Arctic amplification on midlatitude weather and climate. *Curr. Clim. Change Rep.* **4**, 238–249 (2018).
134. Smith, D. M. et al. The Polar Amplification Model Intercomparison Project (PAMIP) contribution to CMIP6: investigating the causes and consequences of polar amplification. *Geosci. Model Dev.* **12**, 1139–1164 (2019).
135. Wilks, D. *Statistical Methods in the Atmospheric Sciences* (Academic, 2006).
136. Screen, J. A. The missing Northern European cooling response to Arctic sea ice loss. *Nat. Commun.* **8**, 14603 (2017).
137. Ding, Q. et al. Tropical forcing of the recent rapid Arctic warming in northeastern Canada and Greenland. *Nature* **509**, 209–212 (2014).
138. Schwartz, C. & Garfinkel, C. I. Relative roles of the MJO and stratospheric variability in North Atlantic and European winter climate. *J. Geophys. Res.* **44**, <https://doi.org/10.1002/2016JD025829> (2017).

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Methods

In Fig. 1, air temperature (variable 'ta') was retrieved from the Earth System Grid Federation (ESGF) archive for the reanalysis of the Collaborative REAnalysis Technical Environment (CREATE-MERRA-2, ERA5, JRA-55 and CFSR) for the period December 1980 to February 2019 and was averaged on pressure level to obtain a seasonal and zonal mean. A linear trend was then computed at each point in the latitude–pressure plane. The trend was assumed to be distributed according to a t -distribution. For the RCP8.5 scenario of the CMIP5 project, trends were combined by first taking an average over all simulations for each model, then averaging over all models over an institute and then averaging over institutes to obtain a multimodel mean. The distribution of trends at each point in the latitude–pressure plane and for each season was found through bootstrapping with 50,000 samples. For each sample, we randomly select one simulation for each model, combine all the chosen simulations to obtain a multimodel mean, and then compute a trend using this multimodel mean time series. By repeating this procedure, we obtain a distribution of trends. From this distribution of trends for each season, we can find at each point in the latitude–pressure plane the P -value for the null hypothesis of no trend. We then apply the false discovery rate correction¹³⁵ with a global P -value of 0.05. The false discovery rate correction is a field significance test that calculates a new threshold P -value based on the distribution of P -values.

For the reanalyses of the Collaborative REAnalysis Technical Environment–Intercomparison Project, we applied the exact same analysis except that the 50,000 bootstrap samples for the trend distribution were generated in a slightly different fashion. Instead of selecting one simulation for each reanalysis (there is only one), we selected a random trend from the t -distribution of trends for each of the reanalyses. The linear air-temperature trend in Fig. 1c, d is based on the 16-member Atmosphere Model Intercomparison (AMIP) simulations with the 'higher-top' version of the NCAR's Community Atmosphere Model version 5 (CAM5¹³⁹) for 1980/1981 to 2015/2016. In Fig. 1c, the air temperature is first averaged zonally and seasonally and over all 16 members before the linear trend is calculated. For Fig. 1d we chose the ensemble member whose trend best matches the observation. Significance was assessed in the same way as for the other panels. With a single simulation, the method reduces to a one-sided t -test onto which we apply the false discovery rate.

In Fig. 3, spatial relations among regional and full Arctic 850-hPa air temperature and NH near-surface temperatures composited were examined with a series of composites computed with ERA-Interim Reanalysis¹⁴⁰. Area-averaged reference means were formed from 1981 to 2010 in both the near-surface temperature and 850-hPa air temperature for the Barents–Kara Sea (65° N to 80° N, 10° E to 100° E), Canadian Archipelagos and Baffin Bay (60° N to 90° N, 80° W to 50° W), east of Greenland (65° N to 80° N, 40° W to 10° W), and the Chukchi and Bering Seas (65° N to 80° N, 170° E to 210° E). The near-surface temperature anomalies were regressed onto 850-hPa air temperature using daily data in winter (DJF) 1979/80 to 2018/19; all data are linearly detrended when the 850-hPa air temperatures are between 0.5 and 3 standard deviations above the climatological average. Completing this analysis is the polar cap temperature at 850 hPa, area-averaged from 65° N to 90° N and similarly regressed with NH near-surface temperatures (Fig. 3e). A comparable analysis was completed with HadGEM2 data. The model data are from 1,600 winters simulated under present-day conditions using the HadGEM2-ES model. Specifically, we ran 400 realizations of 5 years in length from 2008 to 2012 under the RCP8.5 scenario. Runs were started on 1 January, so there are only four full winters in each 5-year run. Initial conditions for the 400 realizations were generated by first branching off 16 different realizations at the year 1990 from historical simulations and then forcing with historical/RCP8.5 forcing until 2008. At year 2008, 25 realizations were branched off each of the 16 different climate states by using the atmospheric initial conditions from 25 different dates (from 1 January to 25 January). Forced response to sea ice in Fig. 3k–o is from ref. ⁵¹.

In Fig. 4, the linear trend for December, January, February and March (DJFM) 2-m temperature was computed using both the National Centers for Environmental Prediction (NCEP) Reanalysis¹⁴¹ and the November forecast components of the North American Multi-Model Ensemble (NMME¹²⁸). Included in the NMME were models from the Canadian Meteorological Center (CMC1–CanCM3 and CMC2–CanCM4), the Center for Ocean–Land–Air Studies (COLA-RSMAS-CCSM4) and the Geophysical Fluid Dynamics Laboratory (GFDL-CM2p5-FLOR-A06 and GFDL-CM2p5-FLOR-B01). Reference means were computed from 1981 to 2010 for NCEP and 1982 to 2010 for NMME components (NMME hindcasts begin in 1982). For the NMME components, the zero-hour forecasts were treated as analyses for the DJFM period, with each model treated individually; so, for example, the CMC1–CanCM3 analyses for 1982–2010 were used to form the reference mean for computing anomalies in the CMC1–CanCM3 November forecasts for DJFM. For the midlatitude NH (30° N to 60° N), all annual anomalies from 1989 to 2017 were computed for observed (NCEP) and forecast (NMME November for DJFM), using all ensemble members of the individual NMME components (Fig. 4a with all in grey, Fig. 4b with NCEP in blue and NMME in red). The annual mean of all NMME components and ensembles was then used to compute the linear trend from 1989 to 2017 (Fig. 4c in red) for comparison to the NCEP linear trend (Fig. 4c in blue). For broader comparison,

these calculations were repeated for the entire NH and Arctic only with trend lines for NMME (green/red) and NCEP (black/blue) shown in Fig. 4d. Anomalies are calculated relative to climatology from reanalysis for 1981–2010 and from NMME 1982–2010 winter mean respectively.

In Supplementary Fig. 1a, the near-surface mean temperatures zonally averaged from 90° S to 90° N and from 1960 to 2018 are plotted. Data are from NASA/GISS¹⁴². In Supplementary Fig. 1b, 2-m air-temperature anomalies and the 5-year running mean for December through February are plotted for the Arctic, midlatitude land areas and the difference between the Arctic and midlatitude land areas. Climatology used is the 30-year average of 1981–2010. Data are from NCEP/NCAR reanalysis data¹⁴¹.

In Supplementary Fig. 2a and b, the linear trend is computed for each grid cell in the Hadley Centre–Climate Research Unit global temperature dataset-4 (HadCRUT4¹⁴³) for land surface only, multiplied by 10 to provide a trend in °C per decade for the months October through December, and January through March, respectively, from 1988 to 2008. In Supplementary Fig. 2c, d, the average surface temperature anomaly is computed for each grid cell in the Hadley Centre CRU land surface data for the months October through December, and January through March, respectively, from 2008 to 2018. Climatology used is the 30-year average of 1981–2010.

The simulations presented in Supplementary Figs. 5 and 6 are conducted at NOAA's Earth System Research Laboratory Physical Science Division. These are AMIP simulations from 1979 to present day, forced by observed GHGs, ozone, aerosols and surface lower boundaries (that is, sea surface temperature and sea ice conditions). Three model simulations from NCAR 'low-top' Community Atmosphere Model Version 5 (30 members¹⁴⁴), NCAR 'higher-top' CAM5 (16 members¹³⁹) and ECHAM5 (30 members¹⁴⁵) are used for the decadal temperature trend across 1980–2015.

In Supplementary Fig. 5, the air temperature is first averaged zonally and seasonally and over all available members before the linear trend is assessed.

In Supplementary Fig. 7, we tabulated the number of disruptive northeast snowstorms by decade from the NOAA website.

In Supplementary Fig. 8, the linear trend in sea ice concentration from the Hadley Centre Sea Ice and Sea Surface Temperature data set (HadISST¹⁴⁶) is shaded.

In Supplementary Fig. 9, the winter near-surface air-temperature anomalies and the linear trend for DJFM were computed using both the NCEP Reanalysis and the November forecast components of the NMME models for the tropics (0°–30° N) and midlatitude oceans (30°–60° N). Climatology used for reanalysis is 1981–2010 and that for NMME is 1982–2010 winter mean.

In Supplementary Fig. 10, reanalysis is repeated as in Fig. 4 and Supplementary Fig. 9, except that the climatology used is 1981–2010 winter mean from the NCEP Reanalysis for all NMME temperature anomalies.

Supplementary Fig. 11 is same as Fig. 4 but for summer (June, July and August: JJA).

In Supplementary Fig. 12, we computed the difference in the trends from 1989–2019 between winter (DJF) and summer (JJA). Shown on the left-hand side is the zonal mean difference in the trends.

Data availability

The air-temperature data in AMIP simulations and detailed forcing information for Fig. 1 are available at: <https://go.nature.com/34c5lJT>. Data and detailed model simulation information for Supplementary Fig. 5 can be found at: <https://go.nature.com/34c5lJT>. Data for Supplementary Fig. 7 are from <https://www.ncdc.noaa.gov/snow-and-ice/rsi/nesis>. All other data that support the findings of this study are available within the paper and its Supplementary Information files.

References

139. Richter, J., Deser, C. & Sun, L. Effects of stratospheric variability on El Niño teleconnections. *Environ. Res. Lett.* **10**, 124021 (2015).
140. Dee, D. P. et al. The ERA-Interim reanalysis: configuration and performance of the data assimilation system. *Q. J. R. Meteorol. Soc.* **137**, 553–597 (2011).
141. Kalnay, E. et al. The NCEP/NCAR 40-year reanalysis project. *Bull. Am. Meteorol. Soc.* **77**, 437–471 (1996).
142. Hansen, J., Ruedy, R., Sato, M. & Lo, K. Global surface temperature change. *Rev. Geophys.* **48**, RG4004 (2010).
143. Morice, C. P., Kennedy, J. J., Rayner, N. A. & Jones, P. D. Quantifying uncertainties in global and regional temperature change using an ensemble of observational estimates: the HadCRUT4 dataset. *J. Geophys. Res.* **108**, D08117, D08101 (2012).
144. Neale, R. B. et al. *Description of the NCAR Community Atmosphere Model (CAM 5.0)*. NCAR Technical Note NCAR/TN-486+STR (National Center of Atmospheric Research, 2012).
145. Roeckner, E. et al. *The atmospheric general circulation model ECHAM5. Part I: Model description*. Technical Report 349 (Max Planck Institute for Meteorology, 2003).
146. Rayner, N. A. et al. Global analyses of sea surface temperature, sea ice, and night marine air temperature since the late nineteenth century. *J. Geophys. Res.* **108**, 4407 (2003).

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Author contributions

J.C. and X.Z. co-led the review and designed the synthesis research. J.C. took a lead in writing the article with input from X.Z., J.F., J.O., P.C.T., S.L., D.C., D.H., T.S., T.V., T.J. and all the other authors. F.L. created Fig. 1. P.C.T. and S.L. together with A. Amin created Fig. 2. J.C. and K.P. created Fig. 3. J. Cohen and K.P. created Fig. 4. J.C. created the figures for Box 1 and Box 2. J.F. assisted with manuscript revision.

Competing interests

The authors declare no competing interests.

Additional information

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