

How relevant are frequency changes of weather regimes for understanding climate change signals in surface precipitation in the North Atlantic-European sector? – a conceptual analysis with CESM1 large ensemble simulations

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Final author comments

We are most grateful to the reviewers for their thoughtful and constructive comments that help us to further improve the manuscript. Based on the reviewers' suggestions, we will implement several changes in the manuscript. The main changes are that:

- We better explain certain aspects of our rationale, which in the previous version led to some confusion with the reviewers.
- We add additional figures to better illustrate some of the important basics of our study (e.g., the regime-specific precipitation anomalies and the wet day climatology).

Below we provide a one-to-one response to all points raised by the reviewers. The reviewers' comments are in black and our [replies in blue](#).

Reviewer 1

Recommendation: minor revisions

This paper provides a method to assess the relative contributions of the weather regimes frequency and intensity changes as well as of the skill of the weather regime classification to the precipitation change by the end of the century using reruns of the CESM1 Large Ensemble. The authors find that the change in frequency has a minor role except for some regimes in very specific regions. The manuscript is well written and relatively clear. My most major comment concerns Section 3 and the description of γ . All my comments can be found below in the order of the manuscript followed by some technicalities.

Introduction:

Lines 90-99: point 2 sounds like a repetition of point 1 because “quantify the relevance of WR frequency changes” is already mentioned in point 1. Therefore, point 2 could just be ‘use $\gamma_i(\Phi)$ on precipitation $\Phi=P$, $\Phi=N_{\text{wet}}$ and $\Phi=N_{\text{heavy}}$ ’. The details about the model used and the choice of seven regimes can come later in section 2.

We agree, thank you, we will modify the formulation of the 2nd main objective.

Section 2.3:

Lines 144-151: the authors point out that performing the weather regime classification on the CESM simulations historical and end-of-century periods separately would lead to different weather regimes. What about the ability of CESM in representing the historical weather regimes? The authors do not mention this aspect, but it could also be a reason for using the weather regimes patterns from ERA-Interim. Have the weather regimes in CESM been studied before? I would appreciate if the authors could add here a sentence on this topic.

When we wrote “... would lead to different weather regimes” we did not mean that they need to be substantially different, but rather that they are not identical. We agree that there are several ways, how a weather regime analysis could be done with climate simulations. We decided to stick to the regimes as identified in the reanalyses – which we regard as a good reference given the observational basis of reanalysis data – and project the simulated flows to these regimes. An alternative approach would be to perform an EOF analysis with fields from the climate simulations and then determine regimes separately in the present-day and future climate. This would be quite some work and, as we briefly explain in the manuscript, it would make quantifying the climate change effects on regime frequency more cumbersome because there would be a change in the regime frequencies (what we are interested in) but most likely also in the details of the regime patterns. We therefore did not identify weather regimes based on a separate EOF analysis in CESM. However, Fischer (2021) showed that, when using our method of identifying weather regimes in CESM simulations, the mean seasonal and year-round regime frequencies in CESM historical simulations are similar to the corresponding frequencies in ERA-Interim, indicating that the large-scale flow variability over the North

Atlantic European region is well captured in the CESM simulations. Furthermore, we recommend looking at the study by Fabiano et al. (2021; <https://doi.org/10.5194/wcd-2-163-2021>), to get an impression about how well state-of-the-art climate models reproduce Atlantic-European weather regime patterns.

Section 3:

Lines 228-264: I do not understand why the authors spend so much time describing the two ratios $\Delta f_i / f_{\text{hist},i}$ and $\Delta \Phi_i / \Phi_{\text{hist},i}^*$, as written in Eq. (6), when the rest of the paper and the figures deal with Δf_i , $\Phi_{\text{hist},i}^*$ and $\Delta \Phi_i / f_{\text{hist},i}$. Also, it is confusing when comparing with γ_{overall} , which actually uses the terms (iib) and (i) from Eq. (5). I found this part difficult to follow and confusing in light of the rest of the paper.

It is unfortunate that this part was confusing to the reviewer, as it is, in our view, a central part of the paper. We guess that the insertion of Eq. (7) about γ_{overall} might have contributed to the confusion, as it interrupts a bit the flow between Eq. (6) and the longer discussion of the three factors that contribute to γ_i in L237-264. We will move Eq. (7) to after this discussion. The reason why we discuss the three factors in some detail is that they are, as we think, in a nice way independent: the first factor, $\Delta f_i / f_{\text{hist},i}$, is about the frequency change of the regime. It depends on the regime classification and the intensity of climate change but is a constant factor that does not vary in space. The other two factors are spatially variable, i.e., they determine the geographical pattern of γ_i . The 2nd factor depends on the intensity of climate change, and the 3rd factor on the “skill” of the regime classification to distinguish (in our case) between wet and dry conditions. We regard it as insightful and important to discuss γ_i in this way, and the expression in Eq. (6) elegantly separates the frequency and intensity aspects. What we then show in the figures is mathematically identical, and since γ_i as written in Eq. (6) is in the end simply the ratio of terms (i) and (iib) in Eq. (5), it is, in our view, fully consistent to show these two terms in the figures. We will explain this better in the revised version and are confident that in this way we can avoid confusion.

Line 253: “If days were randomly attributed to one of the WRs”: This sentence confused me at first because I did not which “days” the sentence referred to and “one of the WRs” made me think that only one weather regime was used here. I suggest rewriting the other way around like: ‘If each weather regime was attributed to a different random set of days within the historical period’.

Thank you for pointing out that this sentence was not clear. We think that the main problem is the formulation “to one of the WRs”, and we suggest rewriting the sentence as “If each day within the historical period was randomly attributed to a WR, ...”.

Lines 277-278: Could the authors add the actual values of these thresholds, and which variable is used to define those thresholds? I suspect that the authors use Fig. 2c,d to determine the threshold for Figs. 3, 4, and 5. Moreover, the percentage given here (30%) is quite vague as the reader does not know if the authors mean 30% of the grid points within the

domain plotted ($\sim 30^{\circ}\text{N}$ - 90°N / $\sim 80^{\circ}\text{W}$ - $\sim 40^{\circ}\text{E}$) or within the Northern Hemisphere (or even globally).

We meant 30% of grid points within the domain plotted, and we will clarify this. The reviewer is correct that we use Fig. 2c,d to determine the thresholds for all subsequent figures. For instance, the grid points masked in Fig. 3d are the about 30% grid points shown in Fig. 2c with the smallest absolute climate change signal in precipitation (mainly the white regions in Fig. 2c). We prefer not to add the threshold values to the paper, as this would put too much weight on these pragmatically chosen values. The only aim of this masking is to avoid that the reader starts interpreting large values of γ_i in regions where the question whether frequency changes of regimes contribute to the climate change signal, is not relevant, simply because the signal is small.

Section 4:

Line 286: “Denmark Strait” I would rather locate the negative response over the Irminger Sea. Please check if you agree and eventually correct.

Thanks, much better, we changed “Denmark Strait” to “Irminger Sea”.

Figure 2: It would be great to also have the DJF climatology of wet days and heavy rain days as well as their response to climate change. Four more panels could be added to this figure. Moreover, how do these DJF and JJA precipitation climatologies compare to reanalyses or observation-based products? Could the authors add a sentence on this?

Thanks for this suggestion. We will include an additional figure with four panels as suggested. About the precipitation climatologies: The DJF and JJA precipitation climatologies in CESM compare reasonably well with ERA5 and with the climatology of Xie and Arkin (1997, their Figs. 11 and 13). For instance, in DJF, Xie and Arkin showed values of about 5 mm day^{-1} south of Iceland, 3.5 mm day^{-1} over Ireland, and 2.5 mm day^{-1} over the Alps, which is a bit lower than the values shown in Fig. 2a in these regions (about 6.5 , 5 , and 4 mm day^{-1} , respectively). The higher resolution ERA5 reference dataset has values of about 6 , 4 , and 3.5 mm day^{-1} in the three selected regions (not shown). This indicates that the precipitation climatology in CESM agrees reasonably well with reference climatologies, and, in particular, captures large-scale gradients from the North Atlantic to central Europe.

Line 287: “weaker positive values” I do not find them that weak. I suggest to add “slightly” before “weaker”.

Thank you, changed as suggested.

Figure 3a: Why does this figure look so much like the DJF response displayed in Fig. 2c? Also, it seems that all four weather regimes presented here change in almost the same way in the future. Why is that? Somehow, I would have expected more WR-specific changes,

meaning following the WR precipitation anomalies shown in Fischer (2021). Could the authors comment on that aspect? Is it expected?

No, this was not expected! Indeed, the climate change signal is, at least at first sight, very similar in all regimes, and we were also surprised by this. It means that the climate change signal is, at least in some regions, mainly determined by other factors than the circulation variability captured by the weather regimes. A prominent example is the strong decrease of precipitation in Labrador Sea in all regimes. This is caused by the poleward retreat of the sea ice edge in the future climate, which will strongly reduce shallow convection associated with intense cold air outbreaks south of the sea ice edge in the current climate. However, closer inspection of the left column panels in Fig. 4 also shows important differences between the regimes: (i) south of Iceland, the climate change signal is either strongly negative, strongly positive, or close to zero in the regimes AT, AR, and EuBL, and (ii) also in Spain and along the west coast of Scandinavia there are large differences between the regimes. We will discuss these first-order similarities and detailed differences briefly in the revised version.

Line 308: I find slightly annoying to have to look for Fischer (2021) to find the precipitation anomalies associated with the weather regimes. Would there be a way to include this information as contours on panel (a) of Fig. 3 or on panel (c) since this panel is less busy than the others, for example? Or could these figures be added to a supplement?

Apologies for not including these fields explicitly, and thanks for your interest to look at them! These fields are to a certain degree visible in Fig. 3c and in the third column of Fig. 4, but because of using the same contour intervals as in Fig. 3b (for good reasons), not much is visible of the regime-specific precipitation anomalies. We decided to either add a few contours of $\Phi^*_{\text{hist},i}$ to these figures, or, in case that this makes these panels too dense, to add a figure to the Appendix with panels as shown in Fig. A17 of Fischer (2021).

Line 335: “weaker WR-specific anomalies”. To me it looks like the anomalies in Fig. A17 in Fischer (2021) are also strong for the other weather regimes. The zonal weather regime exhibits a strongly positive anomaly and the European Blocking a strong negative anomaly. Therefore, I suggest to modify this sentence.

Thanks, we mainly agree and simplify the sentence. It now reads “The reasons for the lower γ -values over Europe for the regimes AR, EuBL and ZO compared to AT are mainly the (much) lower frequency changes in these regimes (Fig. 1).”

Line 341: “of about 1.5 mm day^{-1} ” This value can be found in Fischer (2021), right? If yes, please add the reference. If not, please write where I can find these values.

Yes, the value was from Fig. A17 in Fischer (2021). Since we now show contours of $\Phi^*_{\text{hist},i}$ in some panels, we will refer to them.

Technical comments:

Line 238: “how large are the fields $\gamma_i(\Phi)$ ” → “how large are the fields $\gamma_i(\Phi)$?”

Changed as suggested.

Figure 2: the latitude labels are missing on all panels. The gray contours and their labels in panels (a) and (b) are quite difficult to see. Please consider using another color and to not overlay the contour on its label. Moreover, those lines are not described in the caption. I suppose they are the 500-hPa geopotential height (in m).

We added latitude labels to the left panels, and we will mention the 500-hPa geopotential height contours in the caption. Since this field is of secondary importance, we would like to keep the gray contours but we avoid that the labels overlay the contours.

Figure 3: I suggest to replace the “i” by AT so that we can immediately see that this figure is about the Atlantic trough. Moreover, in panel (d), the colorbar label 0.00 and longitude label 40°E are cut at the edges of the figure.

In the headings of the four panels, we everywhere replaced “i” by “AT” and “ Φ ” by “P”. Also, we make sure that the labels at the edges of the panels are not cut.

Figures 4, 5, 6, and 7: there is a slight misalignment between the left column and the other columns as visible from the colorbars that are higher in the left-most column compared to the other columns.

Thanks for spotting this. We try to correct this.

Line 388: add a comma between “ Φ ” and “larger”.

Changed as suggested.

Lines 426-427: the larger [...] is the intensity change $\Delta\Phi_i$ – and thus the smaller is γ_i → the larger [...] the intensity change $\Delta\Phi_i$, the smaller γ_i

Changed as suggested.

References: many references have a double slash (//) after doi.org. The doi is missing for references in lines 483, 519, 553, and 576.

Thanks for spotting this, will be corrected.

Reviewer 2

Recommendation: minor revisions

The paper focuses on the decomposition of the precipitation response with climate change in terms of different weather regimes and defines a novel metric to quantify the relative importance of dynamic (related to regime frequency) vs. thermodynamic (related to regime intensity) changes. Although the metric is not able to definitely disentangle the two components, the changes in regime intensity dominate for most of the domain, indicating that regime frequency changes are of secondary importance to understand future changes in surface precipitation.

I think the results are very interesting and relevant for the community. The paper is well written, with attention to the details, denoting a great accuracy both in the work and in the presentation of the results. I invite the authors to consider a couple of doubts regarding the methodology and a minor issue regarding the assessment of the significance of the results, along with some more specific comments.

General comments

Significance of the results. I would appreciate a brief discussion of the significance of the changes in the composites with respect to the internal variability. For example, considering the standard deviation of 10-year chunks in the historical period would give an estimate of the variability of the regime-specific composites. This could also be a more quantitative metric to assess the skill of the regime in decomposing the precipitation field (e.g. comment at line 260). Also, this relates to comment at line 277.

We are not completely sure whether we understand this suggestion, and we therefore did not do additional calculations. We also would like to mention that in her PhD thesis (Fischer, 2021; Sect. 4.3.1), the first author did careful statistical testing of the statistical significance of the frequency changes of the regimes and found that the largest frequency changes were statistically significant at the 99% level.

Removal of the climatology. The authors remove the climatology of the two periods separately to get the geopotential anomalies, which are then projected on the observed ERA5 regimes. Since the anomalies refer to different mean states, this may have an impact on the actual dynamical configuration of the regimes and hence on the precipitation composites. Out of curiosity, have you checked whether the composites of some more dynamical field differ between corresponding eoc and hist regimes (e.g. the zonal wind)? In that case, this may constitute a dynamical effect which is now by construction inside the “regime intensity” component (related to discussion at lines 435-443).

Thank you for this interesting comment. First, we would like to mention that with our approach, the WR-specific geopotential height anomalies at 500 hPa are very similar in ERA-Interim and the two climate periods considered with CESM (Figs. A.7-A.10 in Fischer, 2021).

We regard this as an important a posteriori check that our method of attributing the WRs in different climates is meaningful. Addressing more specifically the reviewer's question, no, we did not investigate the change in, e.g., zonal wind at 500 or 300 hPa, and we think that such an analysis of the mean circulation changes in the CESM ensemble simulations is beyond the scope of this study. We also dare to disagree with the last sentence of the reviewer; in our view, a mean circulation change does not necessarily affect "regime intensity", it could still affect "regime frequency". But again, we leave an in-depth analysis of these questions to future studies.

The intensity change term (i) in equation 5 contains not only the change in the regime-specific precipitation anomaly ($\Phi_{\text{eoc},i}^* - \Phi_{\text{hist},i}^*$) but also the change in the overall precipitation climatology between the two periods ($\Phi_{\text{hist}} - \Phi_{\text{eoc}}$). The climatology part has instead been removed from term (ii) since it would have summed to zero over all regimes (term iia), so I was wondering whether this creates by construction an asymmetry between the two terms that make up gamma (making gamma smaller). It may be helpful to see the contribution of the climatology separated from the regime-specific anomalies in term (i) (so e.g. subtracting the field in Fig. 2c from the second column in Fig. 4).

Thank you for this comment. We agree with the reviewer that our term (i) contains the overall climate change signal, whereas term (iib) does not. The reason for this asymmetry mentioned by the reviewer is the fact that the sum (over all regimes) of the frequency changes must be zero, whereas the sum of the intensity changes corresponds to the total climate change signal and is not zero. In our view, our approach is best suited to address the specific question of this study, which is "how relevant are frequency changes of weather regimes for understanding climate change signals in surface precipitation". If we followed the suggestion by the reviewer (and also split term (i) into a term with the overall precipitation change and a term with a regime-specific precipitation change, $\Delta\Phi_i = \Delta\Phi + \Delta\Phi_i^*$, then we would address a different question namely "how relevant are frequency changes of weather regimes due to climate change relative to changes of regime-specific surface precipitation anomalies", which is not what we are aiming for in this study.

Specific comments

L45. The matter is quite debated, I would be softer on affirming that there is "clear" evidence that the regimes "represent physical modes of the atmosphere". For example, the number of regimes to be considered varies in literature, and there is no clear indication that 7 is the "true" number (to my knowledge). I agree that the atmospheric flow shows a tendency for non-linearity and preferred states, but I also think that the classification in regimes is always artificial to a certain extent. I would suggest the review by Hannachi et al. (2017) for a historical perspective on this point.

Hannachi, Abdel., David M. Straus, Christian L. E. Franzke, Susanna Corti, and Tim Woollings. "Low-Frequency Nonlinearity and Regime Behavior in the Northern Hemisphere Extratropical Atmosphere." *Reviews of Geophysics* 55, no. 1 (2017): 199–234. <https://doi.org/10.1002/2015RG000509>.

Thank you, we will choose a softer formulation and include a reference to this interesting review article.

L51. I would suggest to add Madonna et al. (2021), which discuss the link between various regime frameworks and seasonal precipitation/temperature anomalies in Europe.

Madonna, Erica, David S. Battisti, Camille Li, and Rachel H. White. “Reconstructing Winter Climate Anomalies in the Euro-Atlantic Sector Using Circulation Patterns.” *Weather and Climate Dynamics* 2, no. 3 (August 25, 2021): 777–94. <https://doi.org/10.5194/wcd-2-777-2021>.

Thank you, reference will be included.

L66. The result by Huguenin et al. (2020) should be moved inside the discussion at lines 74-78 regarding the “rather low consensus on future changes in WR occurrence”. Also, regarding this point, it may be worth discussing other evidence of circulation changes (in winter) in warmer climates, for example the work by Oudar et al. (2020) and Peings et al. (2018).

Oudar, Thomas, Julien Cattiaux, and Hervé Douville. “Drivers of the Northern Extratropical Eddy-Driven Jet Change in CMIP5 and CMIP6 Models.” *Geophysical Research Letters* 47, no. 8 (2020): e2019GL086695.

Peings, Yannick, Julien Cattiaux, Stephen J Vavrus, and Gudrun Magnusdottir. “Projected Squeezing of the Wintertime North-Atlantic Jet.” *Environmental Research Letters* 13, no. 7 (2018): 074016.

Thanks also for making us aware of these studies. We will include them in this paragraph and also mention the results by Huguenin et al. (2020).

L156. How is the seasonal normalization coefficient computed for the historical and future model fields? I expect the coefficient would be different from the one computed for the ERA reanalysis and would differ for the future and historical periods too. How does this choice impact the seasonality of the regimes and their projection on the ERA EOF space?

We apologise because the formulation about the normalization coefficient was incorrect. Thank you for picking up this detail. The normalization coefficient is computed separately for the historical and future simulation. The text will be updated to correctly reflect this: “This index corresponds to normalized anomalies of the projection for each regime i relative to the mean projection in the respective climate period, and the normalization is done with the climatological standard deviation of the projection in the respective climate period”. The normalization coefficient is indeed different between ERA-Interim, CESM hist, and CESM eoc. The respective climate period is used to compute the normalization coefficient to ensure the normalized fields agree with the statistical basis for the weather regime projection.

L165. What is the sensitivity to this threshold? i.e. what was the proportion of no-regime days with the original threshold of 1?

The sensitivity is rather weak in the small range of the required threshold modification. With a threshold of 1.0 we would have 32.4% of no-regime days in CESM hist, and with a threshold of 0.98 we get 30.9%, which is very close to the 30.8% in ERA-Interim.

L176-180, Figure 1. Even if this is a single model study, a quick comment and comparison of these results with others in literature would be needed here.

We don't know with what to compare here, because to the best of our knowledge, this is the only study so far that applied the Grams et al. (2017) regime classification to climate change simulations. Other studies investigating regime frequency changes used other methods, which makes a meaningful comparison difficult.

L233. The sign of the ratio may be also interesting to investigate (i.e. do dynamic and thermodynamic effects contribute in the same direction?).

We agree, and we first differentiated between positive and negative values of gamma. We then realized that this made the plots and discussion more complex, without yielding too much additional insight. Therefore, we decided to reduce complexity here in consider in this study only the modulus of gamma.

L242. The order of magnitude estimate is fine, but I would avoid a more quantitative estimate at this stage (e.g. 10 -> 9-11%), since the frequency change could in principle be much larger.

We prefer to leave this sentence as is. It should be clear to the reader that this is just an estimate, and we would like to explain what a relative frequency change of 0.1 means in our case where typical values of f_i are about 10%.

L260. For a "very good WR classification ...". I understand that you expect delta Phi for each regime to be small with respect to the typical regime anomaly of Phi. However, the estimate is quite arbitrary (in principle, the regime intensity could increase/decrease by a more significant fraction) and a low value of this ratio could be due to other causes, rather than to the quality of the regime classification.

We don't fully understand this comment. With a "very good classification" we mean "good" in the sense that it stratifies well between higher and lower values of Phi. In this sense, $\Phi_{\text{hist},i}$ is a reasonable indicator for a "good classification". To avoid confusion, we can add "For a very good WR classification in terms of the variable Phi, ...".

L277. I think it would be more appropriate here to set a more objective threshold on the climate change signal, e.g. where the signal is significant with respect to internal variability (e.g. considering the historical variability in a 10-year random sample). What does the 30% threshold correspond to in terms of climate change signal?

The (subjective) threshold for masking the gamma plots should not be considered as something too important. See also the reply to a comment of the first reviewer on p. 3-4 of this document. The only aim of this masking is to avoid that the reader starts interpreting large values of γ_i in regions where the question whether frequency changes of regimes contribute to the climate change signal, is not relevant, simply because the signal is small.

Fig. 2. I suggest to use the green/brown colorbar for the precipitation differences, as done in other figures. Also, it would be nice to add a title with the respective seasons on top (just a suggestion).

Thank you, we add small titles, but we decided to not change the colorbar. While we understand the point of the reviewer, we think that having a different colorbar better highlights the fact that what is shown in Fig. 2c,d (total climate change signal in precipitation, red/blue colorbar) is what we would like to “explain” in this study (i.e., the starting point of the study), whereas all the other climate change panels in Figs. 2-7 (brown/green colorbar) are for a specific weather regime and have a different role in our study.

L286. Also, negative values are found in the Mediterranean region, it may be worth commenting on that.

We will mention the negative values in the Mediterranean.

L335. “weaker WR-specific anomalies”. I think it would be worth adding in a supplementary a figure with the P^* fields (hist and eoc, and/or the delta P fields), to allow comparison of the relative magnitude before multiplying by additional factors. Fig. A.17 and A.19 of the doctoral thesis would be very useful here.

Also in response to a similar suggestion by the first reviewer, we will add contours of $P^*_{\text{hist},i}$ to the panels in the 3rd column of Figs. 4-7.

L345. “but is more variable within a specific WR”. I don't think this is indicated by the precipitation anomaly composite.

Indeed, this was not shown in the paper, and we decided to delete this remark.

L435. I appreciate the observation regarding the fact that intensity changes could also contain a dynamical signal, for example in terms of the amplitude of the dynamical anomalies. Do you see a way to extract some more information out of this, i.e. to separate a general thermodynamic response to regime-specific features?

No, unfortunately, we don't see a clean way of separating thermodynamic and dynamic signals, also because they can be interrelated in diverse and complex ways. In our view, more research is needed to understand regime-specific intensity changes.

L440. “ $\Delta\Phi_i$ is fairly uniform across WRs”. This is not true for all regions, for example the central North-Atlantic and the Iberian peninsula.

We agree with the reviewer, our formulation was not precise. We change it to “While, at least in some regions, $\Delta\Phi_i(P)$ is fairly uniform across WRs, ...”.