Reply to Reviewers

Relationships between Arctic sea ice drift and strength modelled by NEMO-LIM3.6

Docquier et al. (2017), tc-2017-60

We would like to thank the editor Dirk Notz and the two anonymous reviewers for their comments regarding our revised manuscript.

Please find below:

- our answers to Referee #1 in blue
- our answers to Referee #2 in red
- a track change version of the manuscript.

Our corresponding corrections in the revised manuscript are marked **in blue** when they refer to **Referee #1** and **in red** for **Referee #2**.

1. Reply to Referee #1

1.1. General comments

As a whole, the authors addressed the points raised by the two reviewers and the manuscript has been improved significantly. Particularly, the sensitivity experiment changing ice strength P* made the interpretation of the result clearer. The results summarized in Fig. 8, 9 and 11 - 13 provide useful information for modelers working with different sea ice models. The thorough examinations and assessments of the model results using observed sea ice data can be a good exemplar for forthcoming studies in similar topic. However, I suggest to address the following minor points before publication.

1.1. Specific points

- Page 1, line 13-15: I suggest to put an additional sentence to mention what we learned regarding drift - strength relation from the sensitivity experiment, otherwise readers cannot understand the necessity of the sensitivity experiment in the context of this study.

Done.

- Page 8, line 19-20: The use of the term "Bootstrap" is confusing. The author described that "The OSI SAF algorithm ... is a linear combination of the Bootstrap algorithm ... and the Bristol algorithm ..." (Page 5, line 23-25), while at the same time, provided a sentence "The Bootstrap algorithm provides higher concentration than OSI SAF, ..." (Page 8, line 19-20). A consistent use of the term or further explanation is needed.

The OSI SAF algorithm is a combination of Bootstrap and Bristol algorithms, but we also use the concentration data from the Bootstrap algorithm only in our study (we call it 'Bootstrap'). We added a sentence at the end of the description of this dataset in Section 2.2.2.

- Page 10, line 20; Page 12, line 3; Page 15, line 21; page 16, line 3: The authors used a term "interaction" to describe the relation between ice drift and ice strength, while in this study, only one direction of the dynamical influence (i.e., effect of ice strength on the drift speed) was examined and the other direction (i.e., effect of ice drift change on ice strength) was not examined. From this point of view, I think it is appropriate to use a term "relation" instead of "interaction", since the study did not clarify the consequence of ice drift change on ice strength.

We replaced 'interactions' by 'relationships' throughout the whole manuscript (including the title) as we agree with the reviewer that 'interactions' is not really appropriate, but we think that 'relationship' is more appropriate than 'relation' as in Olason and Notz (2014).

- Page 12, line 13-14: I think "control" is not a suitable verb to describe the results shown in this study, since it implies the drift speed is a function of ice concentration and thickness only. As shown in the hysteresis loop in Fig. 11 and 13, there are other unknown controlling factors for ice drift speed. Therefore, I suggest to rephrase ".. is controlled .. " by " .. is strongly influenced .. ".

Done.

- Page 15, line 23-25: As mentioned above, the existence of the hysteresis loop indicates there are other unknown factors which influence ice drift speed. I suggest to address this for future study.

Done.

- Figure 13 a: It is difficult to identify the correspondence of the color of the regression lines to the different P* values. Please provide additional legend to describe the correspondence.

We kept three out of the five P* curves as in panel (b) in order to enhance readability and we modified the legend to make the correspondence with the regression lines clearer.

2. Reply to Referee #2

I would like to thank the authors for their responses to my previous remarks. It is clear that they took my remarks under serious consideration. They have, in particular restructured and refocused the article as, in fact both I and the other reviewer felt was necessary. As it stands, the paper is much closer to be acceptable for publication, than was the original submission.

Despite the good progress made I still have two major and some minor remarks that I would like the authors to respond to, before I can recommend publication.

2.1. Major comments

My first major comment is about the drift vs. thickness plots. Reading Olason and Notz, it is my understanding that they view this relationship to be only of relevance during winter, i.e. from November to March. And I agree. The reason for this is that it is only in winter that the ice cover is compact enough so that the ice thickness can play a role in the momentum equation. If the ice cover is very loose the open water part of the cover will "deform", so to speak, regardless of the thickness of the ice. The straight line between November and March is thus physical, while the straight line between May and September is coincidental.

You can also see this when looking at the IABP vs PIOMAS curve. I know I said "PIOMAS is not observations" last time, but we know that the shape of the Rothrock et al curve is wrong (they say as much in the paper themselves), and it's reasonable to assume that PIOMAS is closer to reality in that regard. In IABP vs PIOMAS the straight line in summer is only between July and September; it's still a straight line, but I would argue that this is coincidental.

Keeping this in mind your metrics should refer only to the November-March period, but it seems the entire curve is taken into account. This is crucial. Also, if you did this you could use your figure 13 b) to see that w.r.t. drift speed $P^* = 27.5$ gives (close to) the right slope, i.e. drift speed-thickness relationship.

We agree with the reviewer that it makes more sense that the relationship between drift speed and thickness is really physical only in winter when ice concentration is high. However, from a statistical point of view, this relationship also occurs in summer and we cannot firmly exclude any kind of relationship / causality between both variables at that time of the year.

Our metrics were computed over the whole year in the previous version of our manuscript. Following the very good suggestion from the reviewer, we computed our metrics separately for summer (May-September) and winter (November-March), but we prefer keeping the metrics computed over the whole year as the reference in our manuscript since the separation between 'physical' and 'non-physical' months is highly subjective. Also, taking winter months improves the results in terms of drift-thickness normalised distance (except for $P^* = 5.5 \text{ kN/m}^2$) but deteriorates the results for the drift-thickness slope ratio (Fig. 10).

We added some text related to the methodology (Section 2.3) and the new results (Sections 3.2 and 3.3) as well as a figure showing our metrics against P* for the sensitivity experiments (Fig. 10 in the revised manuscript). In Fig. 10b, we show that $P^* = 27.5 \text{ kN/m}^2$ is better than $P^* = 5.5$ and 100 kN/m² in terms of drift-thickness slope ratio for winter (solid blue curve), but $P^* = 45 \text{ kN/m}^2$ is the best fit (this curve is not shown in Fig. 9b [Fig. 13b in the previous version of the manuscript]).

My second major comment is that I feel that the structure of the paper can still, relatively easily be improved. I will not stand particularly firm on this, it is more a stylistic comment than a strictly scientific one. But I honestly believe that by improving the structure you can make the paper better focused on the important new methods and results, which will help in making it more widely read, recognised, and cited.

I suggest you really focus on the new metrics you developed. You would then first introduce the metrics and then evaluate NEMO-LIM using them. This second step shows the applicability of the metrics and evaluates the model at the same time. You can then use the P* experiments to show how you can use the metrics to aid with sensitivity studies. A plot of s_h and epsilon_h against P* w. Finally you show, through the P* experiments, that the drift speed in summer doesn't depend on ice thickness.

This way you put the new metrics and new science in foreground and the evaluation of NEMO-LIM in the background. That would, in my opinion, change the paper from a somewhat utilitarian model evaluation paper to one presenting new metrics and new findings.

We really appreciate this comment which aims at improving our paper. Following the suggestions from the reviewer, we removed some text (especially related to trends) and figures (Figs. 4, 6 and 7) from the evaluation part (Section 3.1). We computed our metrics over summer and winter months separately (see previous major comment), added some text and added a figure showing our metric against P* for the sensitivity experiments (Fig. 10 in the revised manuscript).

2.2. Minor comments

P.2 L.5: Replace "At large scale" with "To first order", or something similar. Changes in ice strength, unrelated to concentration and thickness can have a large scale effect (see Girard et al and the work that follows them).

Done.

P.2 L.11: You introduce the phrase "drift-strength feedback", but don't use it again in the revised paper. This sentence is not needed. Also I thought we agreed not to say "feedback" :)

We use this terminology in Section 4.2. Although we have not found a formal mathematical expression for this feedback, we cannot exclude its potential importance and prefer to keep the terminology as it is. Please note that this terminology is only used in the Introduction and in Section 4.2.

P.2 L.16: I would like you to say "most likely caused by reduced thickness and concentration".

Done.

P.2 L.32: change to "... multi-model dataset suggests that in those models thicker and more packed ..."

Done.

P3. L.18: Change the subsection title to something along the lines of "Model and sensitivity experiment description". Now it sounds like you'll describe the model and perform the sensitivity experiments, but you're in fact describing both.

We changed the subsection title into 'Model and sensitivity experiments'.

P6. L.29: You added "sea ice area", but do you really use that? Also, how does that differ from sea ice concentration. One is the true area and the other the fractional area, right?

We use sea ice area in Fig. 2a (numbering of the revised manuscript) as suggested by the editor due to uncertainties linked to sea ice extent. In our manuscript, we define sea ice area as the total area of sea ice cover, i.e. the sum of fractional sea ice area over all grid cells. Sea ice concentration is the percentage of ocean area covered by sea ice for each grid cell separately.

P7. L.4: You discuss the monthly mean drift speed computed from the daily components of ice velocity at length here. But I don't think it's needed. You don't use this information in the rest of the paper and it's not really relevant to what you're presenting here. Please remove this discussion.

We think this methodological information is crucial since the values of monthly mean drift speed are twice higher if computed from daily components compared to monthly components, as demonstrated in our Fig. 1 (numbering of the revised manuscript). This was not shown previously to the best of our knowledge and the results from our model evaluation would have been different if we had used monthly components instead, so we think this merits some attention. Some previous studies (e.g. Rampal et al., 2011) compute monthly drift speed from monthly components and the agreement with observations is worse due to this.

P.7 L.31: When introducing the metrics you don't say which months you use to calculate them. For the concentration related metrics this is probably June-October already(?), but for the thickness it should be November-March, as I mention in the major comments.

We computed our metrics over the whole period. But we agree with the reviewer that this is also a good idea to compute them over specific time periods, so we did it and added the new results in our revised manuscript (Section 3.2). We also added a new figure (Fig. 10). Please see also our response to the first major comment above.

P.8 L.12: the part of "which is based on a combination ... on the mean 1984-2000 seasonal cycle" is not really necessary here.

We removed this part from the manuscript.

P.9 L.10: You should show the OSI SAF drift, even if it doesn't cover summer. There is a huge discrepancy between the two observations you do show, so throwing in the third gives us a better idea of how serious this discrepancy is. Also, the NSIDC data is not really good in summer, last I checked.

We added the OSI SAF drift speed in Fig. 2d. As you can see, the OSI SAF product is within the range of the IABP product (except maybe for November), which confirms the relatively low reliability of the NSIDC product in terms of mean seasonal cycle. However, please note that the OSI SAF period is much shorter (2007-2015) and does not include summer months (June-September). We added this information in the text.

P.10 L.5: (Paragraph) See my major point about drift-thickness relationship being coincidental in summer.

Please see our response to the first major point above.

P10. L.13: (Paragraph) I would skip this paragraph and figure. It's not a bad idea, but you need to dedicate much more time/space to discuss the physics and observations, since you have no one to cite on this. For figure 8c: This makes sense, since you'd expect a trend in concentration to coincide with a trend in speed, but the model does the oposite (which is interesting). Why don't you show the NSIDC speeds here? For figure 8d: I can't read anything useful out of this one: A trend in thickness coincides with a trend in drift speed mainly in months where there is no relationship between drift speed and thickness.

We removed this paragraph and Fig. 8c-d.

P.10 L.23: Skip this last line as it refers to the paragraph I recommend skipping above.

Done.

P.11 L.15: (Paragraph) If you just consider the winter months (which is where changing P* really has an effect) then you see that $P^* = 45 \text{ kN/m}^2$ is actually quite a good fit.

We already said that $P^* = 45 \text{ kN/m}^2$ is a good fit from December to February in this paragraph.

P.11 L.20: (Paragraph) If you consider only November-March for the drift-thickness relationship then $P^* = 27.5 \text{ kN/m}^2$ gives a reasonably good result. Also, changing P^* has little or no effect in summer, so you shouldn't think about the drift-concentration relationship here. Finally: Why don't you plot s_h and epsilon_h against P^* ? Here's an opportunity to use your new metrics to simplify the analysis!

By computing our metrics over winter months (November-March), $P^* = 45 \text{ kN/m}^2$ is the best fit for the slope ratio (s_h = 0.6) and $P^* = 27.5 \text{ kN/m}^2$ is the best fit for the normalised distance (epsilon_h = 4.1%) (see our new Fig. 10b).

We agree with the reviewer that the effect of varying P* on drift speed is small in summer but the shape of the drift-thickness relationship is different since thickness changes. So we still think this is valuable.

As for the last sub-comment, we added a new figure plotting our metrics against P* (Fig. 10). This is a very good idea and we thank the reviewer for this suggestion.

P.12 L.11: I've already said that the anti-correlation between drift speed and thickness is (mostly) coincidental in summer, but here you can conclusively show that this is the case (at least in your model). In figure 13a you plot drift speed versus ice thickness for different P*. The figure shows that changing P* has much less effect on the drift speed in summer than winter (and no effect at all in July). Since changing P* has the same effect as changing the thickness we can conclude that the speed-thickness relationship in summer is weak to non-existing. This is something new that I'm not aware of anyone conclusively demonstrating.

We guess that the reviewer talks about Fig. 13b, which is Fig. 9b in the revised manuscript. We agree with the reviewer that the effect of varying P* is small in summer but there is an effect, especially when looking at P* = 5.5 kN/m^2 compared to the other P* values and when looking at August and September (Figs. 5b and 9b in the revised manuscript). We added a sentence related to this point.

P.12 .L15: Be careful when comparing to previous studies here, because the frequency (and indeed the source) of the forcing can influence the optimal choice for P^*

We already emphasize several potential factors that could lead to differences between our study and the one from Steele et al. (1997). We added the forcing in our list.

P.14 L.1 You added a discussion about your lambda experiments, but I don't really see that this is necessary or helpful for the paper.

We prefer keeping this information since it is only one paragraph and we think it provides useful information for future modelling studies.

P.15 L.1: I like your section 4.4

Thank you.

P.15 L.31: Again, I'm not sure that you can't single out a value for P* that is optimal (in some sense at least).

We modified this conclusion due to further investigation where we find that $P^* = 45 \text{ kN/m}^2$ is a good candidate compared to other P* values in terms of the metrics used (Fig. 10) but we could not prove that this P* value is highly superior to the others, especially when looking at the seasonal cycles of thickness and drift speed compared to observations (Fig. 5).

P.16 L.5: What other processes than the drift-strength feedback are important? I'm not sure what you're trying to conclude here or on what it is based.

We removed this sentence.

Figures:

Figure 1: This is not really needed, it's just a linear relationship.

We removed this figure.

Figure 2: Also not needed since I asked you to remove the discussion related to it.

Please see our response to comment P.7 L.4. We think that this information is important in the context of our study as our results are based on the computation of monthly mean drift speed. We decided to keep this figure as it clearly shows the ratio between drift speed computed from daily components and the one computed from monthly components.

Figure 5: The difference plots should show the absolute speed difference and the direction of the difference.

We prefer keeping the figure as it is since we think it is easier to identify regions of model overestimation (in red) and underestimation (in blue) this way.

Figure 13a is not relevant since changing P* doesn't affect the concentration directly.

We agree with the reviewer that changes in P* do not affect sea ice concentration the same way as sea ice thickness. However, the shape of the drift-concentration relationship is affected since drift speed is impacted, which provides different metric values for the different P* experiments. Therefore, we prefer keeping this sub-figure (Fig. 9a in the revised manuscript).

In general you have too many figures, some not necessary at all and some just uninteresting (especially if you restructure further). I barely looked at figures 4, 5, 7, 10, 11, and 12, since they are not involved in the most interesting part of the discussion.

We removed Figs. 1, 4, 6, 7 and 8c-d (previous numbering) but we kept the other ones as they still provide key information for our article. We added a new figure relating our metrics to P* as suggested by the reviewer (Fig. 10).

Interactions Relationships between Arctic sea ice drift and strength modelled by NEMO-LIM3.6

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Preliminary remark for the this revised manuscript (not the track change version):

- corrections related to Referee 1 are in blue
- corrections related to Referee 2 are in redother corrections are in orange.

Abstract. Sea ice cover and thickness have substantially decreased in the Arctic Ocean since the beginning of the satellite 5 era. As a result, sea ice strength has been reduced, allowing more deformation and fracturing and leading to increased sea ice drift speed. We use the version 3.6 of the global ocean-sea ice NEMO-LIM model (Nucleus for European Modelling of the Ocean coupled to the Louvain-la-Neuve sea Ice Model), satellite, buoy and submarine and submarine observations, as well as reanalysis data over the period from 1979 to 2013 to study these these interactionsrelationships. Overall, the model agrees well with observations in terms of sea ice extent, concentration and thickness. Although the The seasonal cycle of sea ice drift

- speed is reasonably well reproduced by the model, the recent positive trend in drift speed is weaker than buoy observations in summer. NEMO-LIM3.6 is able to capture the relationships between the seasonal cycles of sea ice drift speed, concentration and thickness, with higher drift speed for both lower concentration and lower thickness, in agreement with observations. Sensitivity Model experiments are carried out by varying the initial ice strength, and these to test the sensitivity of Arctic sea ice drift speed, thickness and concentration to changes in sea ice strength parameter *P**. These show that higher values
- of <u>ice strength lead to P^* generally lead to lower sea ice deformation and lower sea ice thickness</u>, and that no single value of P^* is the best option for reproducing the observed drift speed and thickness. The methodology proposed in this analysis provides a benchmark for a further model intercomparison related to the <u>interactions relationships</u> between sea ice drift speed and strength, which is especially relevant in the context of the upcoming Coupled Model Intercomparison Project 6 (CMIP6).

1 Introduction

20 The motion or drift of sea ice results from a balance of wind stress, ocean stress, ice internal stress, Coriolis force and ocean surface tilt. Scale analysis shows that the main drivers of drift are the first three terms, and that both Coriolis force and ocean

surface tilt are an order of magnitude smaller (Steele et al., 1997; Leppäranta, 2011). For individual ice floes and for ice fields with low compactness, ice internal stress is generally neglected: sea ice is in free drift. Otherwise, ice internal stress is an important driver of sea ice motion and is a key element of the interactionsrelationships between sea ice drift speed and strength described hereafter. In this paper, we focus on the Arctic Ocean, for which a sufficient network of observations is available.

- At large scale To first order, sea ice strength mainly depends on two quantities, namely sea ice concentration (defined as the relative amount of ocean area covered by sea ice) and sea ice thickness. A decrease in concentration or thickness, as observed in recent decades in the Arctic Ocean (Stroeve et al., 2012; Vaughan et al., 2013; Lindsay and Schweiger, 2015), leads to a reduced ice strength and internal stress, which allows more deformation and fracturing within the ice, hence larger sea ice drift speed (Rampal et al., 2011; Spreen et al., 2011; Kwok et al., 2013). This in turn could provide could provide higher export of sea ice
- 10 out of the Arctic Basin (Rampal et al., 2011)(Rampal et al., 2011), resulting in lower sea ice concentration and further thinning (Langehaug et al., 2013). However, this hypothetical positive feedback, which we call 'drift-strength feedback' throughout this paper, has been poorly studied and its existence has not been shown in observations.

A clear increase in Arctic sea ice drift speed has been detected since the 1950s using buoy observations and satellite measurements (Häkkinen et al., 2008; Rampal et al., 2009, 2011; Spreen et al., 2011; Vihma et al., 2012; Kwok et al., 2013; Olason

- 15 and Notz, 2014). While increased wind speed seems to be the likely cause of the increase in sea ice motion before 1990, the reduced ice strength (most likely caused by reduced thickness and concentration) is the dominant driver since then (Döscher et al., 2014). It has been suggested that an increase in drift speed leads to higher sea ice export from the Arctic Basin, which mainly occurs through Fram Strait. However, a distinction needs to be made between area and volume exports: area export is the product of sea ice drift speed, concentration and transect length, while volume export is the product of area export and
- 20 ice thickness. Several studies show an increase of ice area export at Fram Strait since the late 1970s (Langehaug et al., 2013; Krumpen et al., 2016; Smedsrud et al., 2016), while Kwok et al. (2013) show a small decrease between 1982 and 2009. In terms of volume export, the amount of studies is limited by the relatively low ice thickness temporal coverage at Fram Strait. Spreen et al. (2009) show no significant change in ice volume export between 1990 and 2008. The review from Döscher et al. (2014) addresses this question and concludes that there is no significant long-term trend in sea ice area export due to a balance
- 25 between increased drift speed and decreased concentration, while volume export slightly falls due to a decreased sea ice thickness. A summary of these studies related to drift speed trend and its cause as well as sea ice export at Fram Strait is provided in Table 1.

Olason and Notz (2014) investigate the interactions relationships between Arctic sea ice drift speed, concentration and thickness using satellite and buoy observations. They show that both seasonal and recent long-term changes in sea ice drift are

- 30 primarily correlated to changes in sea ice concentration and thickness. On seasonal time scales, when sea ice concentration is low (from June to November), drift speed increases with decreasing concentration, while for high concentration (from December to March), drift speed changes are largely driven by changes in thickness (higher drift speed with lower thickness). An analysis of sea ice output from the Coupled Model Intercomparison Project 3 (CMIP3) multi-model dataset suggests that in those models thicker and more packed sea ice drifts faster, contrary to what is observed (Rampal et al., 2011). The same
- 35 study also shows that models with a stronger long-term thinning trend do not exhibit faster drift speed, suggesting that the

coupling coupling between drift and strength is underestimated in CMIP3 models. According to the authors, this could explain the too low trends in sea ice area, thickness and drift speed.

The main goal of this study is to investigate the the interactions relationships between Arctic sea ice drift speed and strength using version 3.6 of the Nucleus for European Modelling of the Ocean coupled to the Louvain-la-Neuve sea Ice Model

- 5 (NEMO-LIM3.6). We first apply the methodology developed by Olason and Notz (2014) to the model to see how changes in ice drift speed are related to changes in ice concentration and thickness throughout the year. We extend this methodology by developing new process-based metrics that allow a direct comparison of the model against observations. However, good agreement between the modelled and observed drift-strength relationships model and observations is not a guarantee that the model is able to capture all the features of drift-strength interactionsrelationships. Thus, we carry on additional sensitivity
- 10 experiments where initial ice strength is varied, and we investigate the impact on the resulting drift speed, concentration and thickness of sea ice. The methodology proposed in this analysis provides a benchmark for further model intercomparison related to drift-strength interactionsrelationships and could be used in the analysis of sea ice outputs from the upcoming High Resolution Model Intercomparison Project (HighResMIP) (Haarsma et al., 2016) and CMIP6 Sea-Ice Model Intercomparison Project (SIMIP) (Notz et al., 2016).
- 15 In Section 2 we describe the model, the observations as well as the diagnostics and metrics. Then, results from the model evaluation against different observational and reanalysis datasets are presented (Section 3.1). Section 3.2 details the interactions relationships between drift speed and strength on seasonal time scales. Results from the sensitivity experiments are shown in Section 3.3. These results are discussed in Section 4. Finally, a summary is provided in Section 5.

2 Methodology

20 2.1 Model description and sensitivity experiments

The model used in this study is version 3.6 of the global ocean-sea ice coupled model NEMO-LIM (SVN revision 6631). The ocean component NEMO3.6 is a finite difference, hydrostatic, primitive equation model (Madec, 2016). The sea ice component LIM3.6 is a dynamic-thermodynamic model that uses the elastic-viscous-plastic (EVP) rheology on a C-grid and includes an explicit ice thickness distribution (ITD) (Vancoppenolle et al., 2009; Rousset et al., 2015).

- The atmospheric forcing is the Drakkar Forcing Set (DFS) 5.2 (Dussin et al., 2016), which is based on the ERA-Interim atmospheric reanalysis dataset. The model is run on the global tripolar eORCA1 grid (about 1° spatial resolution) from January 1958 to December 2015. Model outputs that are used in this study are sea ice concentration, thickness and velocity components over the period 1979-2013. This period is chosen to match the satellite period. Sea ice thickness used in this study is the sea ice volume per grid cell area taking into account open water (named 'sivol' according to SIMIP nomenclature) rather than the
- 30 actual thickness ('sithick'), since the former is more physical in representing global interactions relationships between sea ice dynamics and thermodynamics, and this is the variable used in the formulation of sea ice strength detailed below.

Four different simulations are performed in order to test the sensitivity of sea ice drift speed, thickness and concentration to changes in initial sea ice strength P. The latter is computed as a function of ice thickness h and concentration A using the

formulation of Hibler (1979):

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$$P = P^* h \exp[-C(1-A)],$$
(1)

where C (= 20) and P^* are fixed empirical constants. Five different values of $P^* (5.5, 20, 27.5, 45 \text{ and } 100 \text{ kN m}^{-2})$ are used in order to perform sensitivity experiments to test how a change in the strength parameterisation impacts the ice drift speed, concentration and thickness. The experiment with $P^* = P^* = 20 \text{ kN m}^{-2}$ is the control simulation that is analysed in Sections 3.1 and 3.2. The results from the other four experiments are presented in Section 3.3.

The value of $P^* = P^* = 20$ kN m⁻² is the commonly used value in NEMO-LIM3.6 and has been chosen through tuning of mean sea ice thickness and mean Fram Strait ice export (Vancoppenolle, personal communication). This is also the value used in the viscous-plastic models of SIMIP (Kreyscher et al., 1997) as well as in more recent modelling studies (Lipscomb et al., 2007; Juricke et al., 2013). Hibler and Walsh (1982) find that $P^* = P^* = 27.5$ kN m⁻² provides the best agreement

- 10 et al., 2007; Juricke et al., 2013). Hibler and Walsh (1982) find that $P^* = P^* = 27.5$ kN m⁻² provides the best agreement between their 222 km-resolution sea ice model and observations from the Soviet ice station NP-22 in terms of mean drift rates in 1974-1975. Tremblay and Hakakian (2006) find that the most likely value of P^* lies in the range 30-45 kN m⁻² based on satellite observations. Therefore, the value of P^* in Eq. (1) is highly uncertain and not a single value is considered as a reference (Feltham, 2008). The different sensitivity experiments carried out in this study account for this uncertainty.
- 15 The experiment with P* = P* = 5.5 kN m⁻² provides lower ice strength P than the control simulation (P* = P* = 20 kN m⁻²) for a given thickness. It is the lowest value used by Steele et al. (1997) in their model sensitivity study, corresponding to the value of 27.5 kN m⁻² (Hibler and Walsh, 1982) divided by 5. The experiment with P* = P* = 27.5 kN m⁻² gives higher ice strength P than the control simulation and corresponds to the value found by Hibler and Walsh (1982). The experiment with P* = P* = 45 kN m⁻² is the largest value of the likely range found by Tremblay and Hakakian (2006). The experiment with P* = P* = 100 kN m⁻² is close to the highest value of Steele et al. (1997). Figure ?? shows how sea ice strength varies as a function of sea ice thickness and concentration for the five P* values.

2.2 Reference products

In this study, we use several observational and reanalysis and reanalysis datasets for a given variable in order to evaluate model results, following the recommendations of Notz (2015) and Massonnet et al. (2016).

25 2.2.1 Sea ice drift speed

For sea ice drift speed, the International Arctic Buoy Programme (IABP) C buoy dataset is retrieved from the National Snow and Ice Data Center (NSIDC) (Tschudi et al., 2016). This dataset provides 12-hourly sea ice velocity vectors derived from buoy positions over the period extending from 1979 to 2015. Ice motion derived from buoys is more accurate than that obtained from satellites (error of less than 1 cm s⁻¹ for the average velocity over 24 h according to NSIDC), but the coverage is very limited

30 and the number of buoys and their locations varies from year to year. In addition, buoys have not been placed on ice in the Eastern Arctic. The daily mean sea ice drift speed is computed for each buoy from 12-hourly data. We also include the merged product from Tschudi et al. (2016), which provides daily sea ice motion vectors on the Equal-Area Scalable Earth (EASE) Grid with a resolution of 25 km from 1979 to 2015. This dataset, available on the NSIDC website, is a compilation of velocity vectors from IABP buoy data, satellite observations from Advanced Microwave Scanning Radiometer - Earth Observing System (AMSR-E), Advanced Very High Resolution Radiometer (AVHRR), Scanning Multi-

- 5 channel Microwave Radiometer (SMMR), Special Sensor Microwave/Imager (SSM/I) and Special Sensor Microwave Imager Sounder (SSMIS), as well as NCEP-NCAR reanalysis. The different sources of data are combined through a weighting that depends on the accuracy of each dataset. This merged product suffers from artifacts of the method used to incorporate buoy data, especially in terms of ice divergence and convergence (Szanyi et al., 2016). In our manuscript, we call this product 'NSIDC'. We use the low resolution sea ice drift product (OSI-405-b) from the European Organisation for the Exploitation of Meteoro-
- 10 logical Satellites Ocean and Sea Ice Satellite Application Facility (EUMETSAT OSI SAF, 2015b; Lavergne et al., 2010). This dataset covers the period from October 2006 to present. No data is available from May to September (inclusive) for the Arctic region due to high atmospheric liquid water content and to ice surface melting. Despite this low temporal coverage compared to other sea ice drift products, the quality of OSI SAF data is superior to other satellite products based on a recent uncertainty estimate (Sumata et al., 2014). This dataset combines satellite measurements of both the brightness temperature using passive
- 15 microwave instruments from SSM/I, SSMIS, AMSR-E and Advanced Microwave Scanning Radiometer 2 (AMSR2) and the radar backscatter using Advanced Scatterometer (ASCAT). Sea ice drift vectors are provided every 2-two days at a spatial resolution of 62.5 km, and we calculate daily mean drift speed from these data. We compared modelled drift speed averaged over two days to original OSI SAF data but we did not find any significant difference. Since we mainly compare the modelled sea ice drift speed to buoy data instead of satellite data (which have a lower temporal coverage), we have decided to keep daily 20 averages of sea ice drift speed as a benchmark for comparison.
- 20 averages of sea ice unit speed as a benchinark to

2.2.2 Sea ice concentration

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For sea ice concentration, the global reprocessed dataset (OSI-409-a) from OSI SAF (EUMETSAT OSI SAF, 2015a) is used. It covers the period from October 1978 to April 2015 using passive microwave data from SMMR, SSM/I and SSMIS. The OSI SAF algorithm to retrieve concentration from brightness temperature is a linear combination of the Bootstrap algorithm in frequency mode over open water (Comiso, 1986; Comiso et al., 1997) and the Bristol algorithm over ice (Smith, 1996). This is one of the best concentration algorithms in terms of precision (standard deviation) according to a recent evaluation (Ivanova et al., 2015). The spatial resolution for this dataset is 10 km. We compute the monthly mean concentration from daily data.

We also retrieve the monthly mean sea ice concentration (1979-2015) computed from the AMSR-E Bootstrap algorithm with daily varying tie-points (Comiso, 2015). This dataset is derived using measurements from SMMR, SSM/I and SSMIS.

30 Due to orbit inclination, data do not cover the region north of 84.5 °N for SMMR and 87.2 °N for SSM/I and SSMIS. Data are gridded on the SSM/I polar stereographic grid with a 25 km resolution. Largest errors related to this dataset are found in summer when melt is underway.

2.2.3 Sea ice thickness

2.2.3 Sea ice thickness

For sea ice thickness, we use the multiple regression model of Rothrock et al. (2008), based on 34 US Navy submarine cruises spanning the period 1975-2000 within the Scientific Ice Expeditions (SCICEX) box. This dataset includes more than 2000

5 records of sea ice draft (mostly in spring and autumn) measured from the first-return echo. A positive mean bias of 0.29 m in ice draft is identified by Rothrock and Wensnahan (2007) and is taken into account in our study. Sea ice thickness is derived from the draft using the methodology of Rothrock et al. (2008).

The gridded data at a spatial resolution of 25 km from ten Ice, Cloud, and land Elevation Satellite (ICESat) campaigns is also used (Kwok et al., 2009). The Geoscience Laser Altimeter System (GLAS) is the laser altimeter on board ICESat that measures

- 10 sea ice freeboard height, from which sea ice thickness is derived using snow depth and densities of ice, snow and water. The coverage period is limited to the months of October-November and February-March starting in late September 2003 and ending in March 2008. The Kwok et al. (2009) dataset provides the mean sea ice thickness for each of the ten campaigns. The mean absolute uncertainty of sea ice thickness derived from ICESat is 0.21 m in October-November and 0.28 m in February-March (Zygmuntowska et al., 2014).
- Due to the spatial and temporal gaps of sea ice thickness measurements and the high uncertainty inherent to thickness retrievals (Stroeve et al., 2014; Zygmuntowska et al., 2014), we also use monthly mean thickness derived from the Pan-Arctic Ice-Ocean Modeling and Assimilation System (PIOMAS) over the period 1979-2013. PIOMAS is a multi-category thickness and enthalpy distribution sea ice model coupled to the Parallel Ocean Program developed at the Los Alamos National Laboratory (Zhang and Rothrock, 2003). The model assimilates observed sea ice concentration and sea surface temperature
- 20 and is driven by daily NCEP-NCAR reanalysis surface forcing fields. The mean horizontal resolution in the Arctic is 22 km. PIOMAS data are primarily model-generated, and must therefore be interpreted with caution. Nevertheless, sea ice thickness from PIOMAS agrees well with ICESat data over the region for which submarine data are available (Schweiger et al., 2011) and constitutes a valuable tool in our analysis. Given the uncertainties of both observational products and PIOMAS, using all of the products together allows us to obtain a range of 'reference values' that is more reliable than the range based on observational products alone.
- 20 00501 vational products along

2.3 Diagnostics and metrics

A diagnostic is a measure of one characteristic of a model or an observational dataset, while a metric is a scalar number that compares a diagnostic to some reference (typically observations). In this study, we use both 'standard' diagnostics as well as process-based diagnostics and metrics. The standard diagnostics that we use are:

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- sea ice extent, defined as the total area of ocean with sea ice concentration higher than 0.15
 - sea ice area, which is the total area of sea ice cover, computed due to uncertainties linked to sea ice extent (Notz, 2014)
 - sea ice concentration, which is the relative amount of ocean area covered by sea ice

- sea ice thickness, defined as the sea ice volume per grid cell area

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- sea ice drift speed, which is the velocity of sea ice computed at the daily time scale.

It is important to note that for drift speed, all values given in this study are computed from the daily mean mean components of sea ice velocity u_d and v_d :

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$$D_d = \sqrt{u_d^2 + v_d^2}.$$
 (2)

where D_d is the daily mean drift speed. Monthly mean drift speed computed from the daily components of sea ice velocity is approximately twice higher than monthly mean drift speed computed from monthly components of sea ice velocity with NEMO-LIM3.6 due to higher temporal variability at the daily timescale (Fig. 1). A recent analysis also shows that such a factor of two is also apparent within the CMIP5 models (Tandon et al., submitted). Using daily components is more accurate for our study because we can capture synoptic-scale variability.

From daily values of these standard diagnostics, we compute monthly means temporally averaged over the period 1979-2013and monthly trends (i.e. linear regression slopes) over the same period. The maps shown in this paper (Figs. ??, 3, ??, 3, 6) provide monthly means averaged over three consecutive months for winter (January, February, March) and summer (July, August, September) for each grid cell. The plots of mean seasonal cycles (Figs. 2, ??, 5, 7) provide spatial means over the SCICEX box (Rothrock et al., 2008), which is also the domain used by Olason and Notz (2014) in their study. The SCICEX box is representative of sea ice processes happening in the Central Arctic region and is well covered by observational datasets

of sea ice concentration, thickness and drift speed. All maps in this study show the contours of the SCICEX box. We have also tested computing spatial means over a much wider domain taking into account all grid cells between 50 and 90 °N with a concentration threshold of $A \ge 0.15$. Unless specifically mentioned in the text, the default domain that is used in the following

20 sections is the SCICEX box. Since IABP buoy data are not gridded, we use all buoys within the SCICEX box to compute the spatial mean over that region. We acknowledge that comparing buoy and model drift speed has to be done with caution, as buoys measure the drift speed at one particular location while the model is meant to give the grid-cell average. For computing spatial means, a weight is given to each grid cell proportional to the grid cell area.

Based on the 'standard' diagnostics described above, we use two process-based diagnostics in order to quantify the ability
of NEMO-LIM3.6 to capture the interactions relationships between sea ice drift speed and strength in the Arctic. The first process-based diagnostic is a scatter plot of sea ice drift speed against sea ice concentration for each month of the mean seasonal cycle as in Olason and Notz (2014). The second diagnostic is similar to the first diagnostic with sea ice thickness instead of concentration. All values are spatially averaged over the SCICEX box and temporally averaged over the period 1979-2013. A key difference with Olason and Notz (2014) is that we do not normalise drift speed by wind friction speed since our findings were not sensitive to such normalisation. These two diagnostics are presented in Figs. 4 and 9.

Based on the previous process-based diagnostics, four metrics are computed over the mean seasonal cycle. The first metric s_A measures the ratio of the modelled drift-concentration slope to the observed drift-concentration slope. The closer the ratio to 1, the closer the model to the observations. The second metric s_h is similar to the first metric, except that the ratio involves drift-thickness slopes.

The third and fourth metrics quantify the normalised distances (in %) between the model and observations for both the drift-concentration (ϵ_A) and drift-thickness (ϵ_h) relationships respectively:

$$\epsilon_{A} = \frac{1}{n} \sum_{i=1}^{n} \sqrt{\left|\frac{A_{m,i} - A_{o,i}}{\overline{A_{o}}}\right|^{2} + \left|\frac{D_{m,i} - D_{o,i}}{\overline{D_{o}}}\right|^{2}} \times 100,\tag{3}$$

$$\epsilon_h = \frac{1}{n} \sum_{i=1}^n \sqrt{\left|\frac{h_{m,i} - h_{o,i}}{\overline{h_o}}\right|^2 + \left|\frac{D_{m,i} - D_{o,i}}{\overline{D_o}}\right|^2} \times 100,\tag{4}$$

5 where *n* is the number of months (i.e. 12), the *m* and *o* subscripts stand for 'model' and 'observations' respectively, \overline{A} , \overline{h} and \overline{D} are the mean concentration, thickness and drift speed (respectively) over the 12 months.

These four metrics are computed over the whole year, as well as over summer only (May-September) and winter only (November-March). The results from these metrics for the sensitivity experiments are shown in Fig. 10. Unless explicitly mentioned in the text, the metric results presented below correspond to the whole year.

10 3 Results

3.1 Model evaluation

The modelled mean seasonal cycle of Arctic sea ice extent is in good agreement with OSI SAF observational reference over the period 1979-2013. However, a too low extent is simulated in August (bias of 1.6 million km^2) (Fig. 2a, solid lines). This feature is similar to Rousset et al. (2015) who use NEMO-LIM3.6 at 2° resolution forced by the CORE normal year forcing

- 15 proposed by Large and Yeager (2009) , which is based on a combination of NCEP/NCAR reanalyses and diverse satellite products and superimposes the 1995 synoptic variability on the mean 1984–2000 seasonal cycle (we use a resolution of 1° and DFS5.2 forcing). The amplitude of the modelled seasonal cycle of sea ice area is higher than the observed one (Fig. 2a, dashed lines). Note that satellite observations perform better in winter compared to summer due to the presence of melt ponds in summer (Ivanova et al., 2015).
- The modelled mean seasonal cycle of sea ice concentration is very close to OSI SAF observations for all months, except in August when the model underestimates the mean concentration by ~ 0.15 (Fig. 2b). This partly explains the too low extent at that time of the year (Fig. 2a). The Bootstrap algorithm provides higher concentration than OSI SAF, especially in summer, but the spatial coverage is limited due to the absence of data close to the North Pole (Section 2.2and Fig. ??f). A more careful spatial analysis reveals that the model overestimates sea ice concentration in winter, especially at the ice front(Figs. ??a, ??b,
- 25 **??c**). Furthermore, the model clearly underestimates the observed concentration in the Central Arctic in summer (Figs. **??d**, **??e**, **??f**).

The mean seasonal cycle of sea ice thickness modelled by NEMO-LIM3.6 underestimates the seasonal cycle derived from submarine observations and is in better agreement with PIOMAS with a maximum in May and a minimum in September (Fig. 2c). Compared to PIOMAS, the model overestimates ice thickness when ice is thicker (January to July) and slightly

30 underestimates it when ice is thinner (August to October). We do not show the seasonal cycle of ice thickness from ICESat

due to the sparse temporal coverage of these satellite data. However, the model reproduces well the spatial distribution of ICESat thickness with thicker ice north of Greenland and in the Canadian archipelago. The model slightly overestimates the sea ice thickness provided by ICESat in February, March and April (mean bias of 0.07 m), and underestimates it in October and November (mean bias of -0.65 m).

- 5 Compared to IABP buoy observations, the model overestimates sea ice drift speed for all months with higher differences from December to March and for June and July (Fig. 2d). The too strong intensity of the modelled sea ice velocity was already shown with NEMO3.1-LIM2 (Dupont et al., 2015). However, the model captures the seasonality of drift speed with higher values in summer, when concentration and thickness are the lowest, and lower values in winter, when concentration and thickness are high. The minimum modelled drift speed lags the observed minimum by one month (March) and the maximum
- 10 occurs two months earlier than the observed maximum (September). The modelled drift speed is also within the range of OSI SAF observations. However, OSI SAF observations cover a much shorter period (2007-2015) and are not available in summer (June-September). The NSIDC drift speed from Tschudi et al. (2016) does not show a clear seasonal cycle and has values up to 4 km d⁻¹ lower than the IABP product. This is also shown by Olason and Notz (2014) with the previous NSIDC product. Sea ice drift speed from OSI SAF is not shown in Fig. 2d due to the absence of data in summer, but a A spatial analysis shows
- 15 that NEMO-LIM3.6 overestimates these satellite observations during the rest of the year OSI SAF satellite observations for the months when OSI SAF is available (mean bias of 0.91 km d⁻¹; Fig. 3c). The main patterns of sea ice circulation, i.e. Beaufort Gyre and Transpolar Drift, are reasonably well represented by the model (Figs. 3a and 3d).

Monthly mean trends in sea ice extent are clearly negative all year long in the model and OSI SAF observations, especially in summer, but the model underestimates these trends (Fig. **??**a). For sea ice concentration trends, the agreement between

- 20 the model and observations is relatively goodbut the model overestimates the negative trend in August and September (Fig. **??**b). Monthly mean thickness trends lie within the PIOMAS range but the seasonal cycle amplitude is lower (Fig. **??**c). Finally, monthly mean trends in drift speed simulated by the model agree well with IABP from November to June but can not reproduce the positive observed trend from August to October (Fig. **??**d). The model produces drift speed trends that are closer to the NSIDC dataset in summer.
- 25 Figure ?? shows spatial variations of modelled monthly mean trends in sea ice drift speed and concentration. Interestingly, the summer trend in drift speed is positive in the western part of the SCICEX box and negative in the eastern part (Fig. ??b). This effect is particularly enhanced in August (Fig. ??c), which explains the slightly negative trend in drift speed (-0.18 km d⁻¹ decade⁻¹)when averaged over the whole SCICEX box (Fig. ??d). The cause of the negative drift speed trend in August in the eastern Central Arctic is due to the removal of sea ice in this region after 1979, as shown by the modelled
- 30 trend in sea ice concentration in August (Fig. ??f). When considering grid cells with ice concentration higher than 0.15, the August mean drift trend averaged over the SCICEX box is slightly positive (0.09 km d⁻¹ decade⁻¹). Therefore, the model bias in summer drift speed trend is partly due to the absence of summer sea ice in the eastern Central Arctic.

3.2 How does sea ice drift relate to ice strength?

The interactions relationships between sea ice drift speed and strength can be quantified via the relationships between drift speed and concentration on the one hand and drift speed and thickness on the other hand. In this study, we analyse these relationships in terms of mean seasonal cycles. The linear relationship between drift speed and concentration is clear for both the model and

5 the observations when concentration is relatively low (i.e. in summer): the lower the concentration, the higher the drift speed, with slopes significantly different from zero at the 5% level (Fig. 4a). The modelled drift-concentration slope is weaker than the observed ones (using IABP for drift speed) mainly due to too low mean modelled sea ice concentration in August and too high mean modelled drift speed in March and April. The modelled drift-concentration relationship is in better agreement with the observed IABP/OSI SAF pair (slope ratio $s_A = 0.5$ and normalised distance $\epsilon_A = 3.7\%$) compared to IABP/Bootstrap (s_A).

10 = 0.3 and
$$\epsilon_A = 4.2\%$$

The relationship between drift speed and thickness shows a similar general pattern as the drift-concentration relationship with higher drift speed for lower thickness, with significant slopes at the 5% level (Fig. 4b). However, the drift-thickness relationship is more complex with a hysteresis loop for NEMO-LIM3.6, the IABP/Submarines submarines pair and the IABP/PIOMAS pair. From May to September, during the melting season, sea ice thickness decreases and drift speed increases. Then, from

- September to March, drift speed decreases and thickness increases. The behaviour is slightly different between the model and 15 observations, with a clearer linear relationship from May to September for observations, but the general shape of the scatter plot is similar... The drift-thickness slope ratio is higher (hence better) with the IABP/submarines pair ($s_h = 0.6$) compared to the IABP/PIOMAS pair ($s_h = 0.5$), while the drift-thickness normalised distance is lower (hence better) with the IABP/PIOMAS pair ($\epsilon_h = 3.9\%$) compared to IABP/submarines ($\epsilon_h = 6.0\%$). For both the model and observations, for a given thickness, the
- 20 drift speed can take two values depending on the season: a high value in summer when sea ice melts and a low value in winter when sea ice forms and grows.

We also show scatter plots for the monthly mean trends, and these show large differences between the model and the observed pairs (Figs. 4c and 4d). The positive slope-While the anticorrelation between drift speed and thickness is clearly physical in winter when concentration is high, this anticorrelation is probably only statistical in summer when concentration

- is low (Olason and Notz, 2014). To assess the performance of the modelled relationships is largely driven by low trends in 25 summer, while the observations (using IABP for drift speed)show a decrease in drift speed trend with more positive trends in concentration and thickness. The pair using the NSIDC dataset produces a closer drift-thickness slope ratio and normalised distance compared to NEMO-LIM3.6. drift-thickness relationship against the observed one, we also computed our metrics over winter months only (November-March). By doing this, we find that the slope ratio is lower with both the IABP/submarines
- $(s_h = 0.5)$ and IABP/PIOMAS $(s_h = 0.4)$ pairs compared to the same computation over the whole year. In terms of normalised 30 distance, results improve with the IABP/submarines pair ($\epsilon_h = 5.0\%$) and deteriorate with the IABP/PIOMAS pair ($\epsilon_h = 4.3\%$). Therefore, we do not think that computing our metrics over specific time periods allows a better understanding of the processes at play between drift speed and thickness. However, the low trends in modelled drift speed in summer are due more to a

progressive removal of sea ice rather than an actual decrease in sea ice motion in past years as previously shown (Section 3.1 and Fig. ??).

The analysis of drift-concentration and drift-thickness relationships demonstrates that NEMO-LIM3.6 captures reasonably well drift-strength interactions relationships on seasonal timescales. Note that relating drift speed to concentration and thickness

5 for every month of the time series (and not only for the mean seasonal cycleinstead of multi-year monthly means) also gives similar slopes with slightly lower model performance ($s_A = 0.5$ and $\epsilon_A = 6.6\%$ compared to with the IABP/OSI SAF pair; $s_h = 0.5$ and $\epsilon_h = 7.8\%$ compared to with the IABP/PIOMAS pair). The trend relationships are less convincing but two months (August and September) particularly dominate the signal due to a progressive removal of sea ice in the past years within the domain of study.

10 3.3 Sensitivity to changes in ice strength

The previous scatter plots (Fig. 4) are valuable to provide insight regarding the interactions relationships between sea ice dynamics and strength (concentration and thickness), but they do not quantify the impact of a change in sea ice strength on the resulting ice thickness and drift speed. In order to do this, we perform experiments in which we vary P^* in Eq. (1), as described in Section 2.1and in Fig. ??.

- Varying P^* leads to tiny differences in mean sea ice concentration (not shown) but has a significant impact on sea ice thickness and drift speed (Fig. 5). For higher values of P^* , i.e. larger ice strength, the mean sea ice thickness is lower throughout the whole year (Fig. 5a) and the mean drift speed is lower in winter and spring and higher during summer and fall (Fig. 5b).
- Increasing ice strength via the *P*^{*} parameter leads to lower thickness values (Fig. 5a). A more careful spatial analysis allows us to see that the lower ice thickness with higher *P*^{*} appears everywhere in the Arctic and during all months of the year, with the most visible differences occurring north of Greenland and the Canadian Archipelago where ice is the thickest (Fig. 6). In the
- experiments with larger (lower) P^* , the mean ice thickness is lower (higher) due to lower (higher) deformation rates (Fig. 7a) and less (more) ice piling up (Fig. 6); this finding is similar as Steele et al. (1997). Deformation rates are computed from strain rate divergence and shear following Eq. (5) from Spreen et al. (2017). However, deformation rates from the experiment with $P^* = P^* = 100 \text{ kN m}^{-2}$ are relatively high compared to other experiments, especially in winter (Fig. 7a), despite the relatively
- low thickness arising from this experiment (Fig. 5a). The net ice production resulting from this experiment, which combines all sea ice mass balance processes described in Rousset et al. (2015), is 1.5 times lower than the four other experiments on average, which all provide a very similar seasonal cycle (Fig. 7b). Therefore, relatively high deformation rates with $P^* =$ $P^* = 100 \text{ kN m}^{-2}$ are compensated by relatively low net ice production, which provides low ice thickness. Table 2 provides a summary of mean ice thickness, drift speed, deformation rates and net ice production averaged over the whole period and over
- 30 the SCICEX box.

The experiments with higher P^* also provide a more uniform sea ice thickness distribution resulting from a higher ice strength. Figure 8 shows the distribution of ice-covered grid cells in each thickness bin for both winter and summer months: the higher the ice strength (higher P^*), the higher the number of grid cells in the modal class (2.5-3 m in winter and 1.5-2.5 m in summer), and the more uniform (i.e. peaked) the thickness distribution.

Higher sea ice drift speed with higher ice strength from June to August, except for $P^* = -P^* = 100 \text{ kN m}^{-2}$ (Fig. 5b), probably stems from the fact that for higher strength, ice thickness is lower at the beginning of the summer (Fig. 5a), leading to higher drift speed values. The modelled drift speed is closer to observations with $P^* = P^* = 5.5 \text{ kN m}^{-2}$ in June and July, $P^* = P^* = 27.5 \text{ kN m}^{-2}$ in May and from September to November, $P^* = P^* = 45 \text{ kN m}^{-2}$ from December to February and in April, $P^* = P^* = 100 \text{ kN m}^{-2}$ in March. Therefore, there is no single P^* value that provides a best fit to observed drift speed.

Figure 9 shows the drift-concentration and drift-thickness relationships for the model with different P^* values as well as observations in terms of mean seasonal cycle averaged over the period 1979-2013 and over the SCICEX box. All model simulations but one ($P^* = P^* = 5.5$ kN m⁻²) provide coherent relationships with significant slopes at the 5 % level, i.e. a decreasing

10 drift speed with increasing concentration and thickness as well as a hysteresis loop for the drift-thickness relationship. For the drift-concentration relationship (It is also clearly apparent from Fig. 9a), the b that a higher P* parameter value leads to lower thickness and a higher amplitude of the seasonal cycle of drift speed.

 P^* = By plotting each of our metrics against P^* , we show that $P^* = 45$ kN m⁻² curve is closer to observations is the best option in terms of drift-concentration slope ratio ($s_A = 0.7$ with IABP/OSI SAF and $s_A = 0.5$ with IABP/Bootstrap, Fig. 10a)

- 15 and normalised distance ($\epsilon_A = 2.5\%$). For the drift-thickness relationship (Fig. 9b), the slope ratio is the highest with $P^* =$ with IABP/OSI SAF and $\epsilon_A = 3.1\%$ with IABP/Bootstrap, Fig. 10c) over the whole year. $P^* = 45$ and 100 kN m⁻² are the best fits for the drift-thickness slope ratio ($s_h = 0.8$) and the with IABP/submarines and $s_h = 0.7$ with IABP/PIOMAS, Fig. 10b). The drift-thickness normalised distance is the smallest with $P^* =$ using $P^* = 20$ kN m⁻² with IABP/submarines ($\epsilon_h = 66.0\%$) . It is also clearly apparent from Fig. 9b that ahigher and $P^* = 27.5$ kN m⁻² with IABP/PIOMAS ($\epsilon_h = 3.2\%$) (Fig. 10d).
- 20 Results are qualitatively similar for the drift-concentration slope ratio over summer months (Fig. 10a) and the drift-thickness slope ratio over winter months (Fig. 10b) compared to these ratios computed over the whole year. $P^* = 5.5$ kN m⁻² is the best option for the drift-concentration normalised distance during summer (Fig. 10c), while $P^* = 45$ kN m⁻² is the best fit for the drift-thickness normalised distance in winter (Fig. 10d). Although $P^* = 45$ kN m⁻² appears as a good candidate overall, it is not highly superior to other P^* values and not the best option in terms of reproducing the observed mean seasonal cycles of
- 25 thickness and drift speed (Fig. 5). parameter value leads to lower thickness and a higher amplitude of the seasonal cycle of drift speed.

4 Discussion

4.1 Novelties of the present study

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The main novelty of the present study is the in-depth analysis of the interactionsrelationships between Arctic sea ice drift and sea ice strength (concentration and thickness) via an extension of the work carried out by Olason and Notz (2014) and a series of model sensitivity experiments in which the sea ice strength is varied. Rampal et al. (2011) mention these these interactionsrelationships as an important element of Arctic sea ice processes and other studies analyse interactions relationships between some elements of the system (Spreen et al., 2011; Kwok et al., 2013; Langehaug et al., 2013; Olason and Notz, 2014), but none of these studies quantifies the magnitude of drift-strength interactions relationships in detail. Here we address this issue using NEMO-LIM3.6 at 1° resolution with several process-based diagnostics and metrics as well as sensitivity experiments with different values of initial sea ice strength.

The drift-concentration and drift-thickness diagnostics and metrics used here are based on the work of Olason and Notz

- 5 (2014). They analyse the interactions relationships between the three variables using different observational datasets within the SCICEX box. On seasonal timescales, they find that sea ice concentration controls sea ice drift speed in summer (when concentration is relatively low) and sea ice thickness is the main driver in winter (when concentration is relatively high). In our analysis, we include model results and we also find that drift speed is anti-correlated to concentration during summer months in the same SCICEX box (Fig. 4a). We also find that drift speed is anti-correlated to thickness not only during winter
- 10 months but also during summer (with a clearer relationship for the observations compared to the model, Fig. 4b). However, the drift-thickness relationship has less physical meaning in summer when concentration is high (Olason and Notz, 2014) and the impact of varying P* on drift speed is lower in summer. In our study, we do not normalise sea ice drift speed by wind friction speed as in Olason and Notz (2014) because the same relationship is found with and without normalisation. In sum, we find that on seasonal timescales drift speed is controlled strongly influenced by both thickness and concentration.
- There are some similarities between the results arising from our sensitivity experiments and the findings from Steele et al. (1997), which use a 40 km-resolution sea ice model based on Hibler (1979) over 7 model years. They explain that, as P^* decreases (for $P^* < 30-40$ kN m⁻²), internal stress gradient decreases and mean ice motion increases (with ice nearly in free drift for $P^* = P^* = 5.5$ kN m⁻²), which leads to higher ice thickness. However, for $P^* > 55$ kN m⁻², ice thickness slightly increases with increasing P^* in Steele et al. (1997) due to the progressive locking of sea ice (the ice motion ceases), providing
- an ice thickness mainly determined by equilibrium thermodynamics. We do not observe this nonlinearity in our sensitivity experiments as ice thickness continues decreasing with increasing P* for P* ≥ 45 kN m⁻² (Fig. 5a). Several reasons could explain this difference between Steele et al. (1997) and our study, including differences in model physics (e.g. ice thickness distribution included in our model), model parameters (e.g. grid resolution, time step), experimental setup (e.g. model years, forcing) and averaging domain. However, in our experiments, ice thickness from February to June is very similar between P* = 25 P* = 45 kN m⁻² and P* = P* = 100 kN m⁻² (Fig. 5a) and deformation rates with P* = P* = 100 kN m⁻² are relatively
- high (Fig. 7a). Therefore, this nonlinearity may occur for $\frac{P^* \rightarrow P^*}{P} \ge 100 \text{ kN m}^{-2}$.

Our study can also be used to identify which P^* values yield results close to reference products (observations and reanalyses). Our findings suggest that We show that $P^* = 45$ kN m⁻² is a good candidate in terms of the metrics we use (Fig. 10). However, this value is not highly superior to other P^* values. Our findings also suggest that the best match

- 30 is strongly dependent upon the month of the year. For sea ice thickness, the amplitude of the modelled seasonal cycle is higher than the ones derived from submarine observations and PIOMAS renalysis, so that all P^* values ranging from 5.5 to 100 kN m⁻² could be used depending on the month (Fig. 5a). For drift speed, the highest values of P^* (45 and 100 kN m⁻²) better match observations in winter, and the lowest value (5.5 kN m⁻²)) is more suitable in summer (Fig. 5b). In agreement with Massonnet et al. (2014), we do not recommend a specific value of P^* , since the optimal value
- 35 for that parameter is dependent on many factors (resolution, atmospheric forcing, values chosen for other parameters, ini-

tial conditions, model). We still recommend excluding the lowest value ($P^*_{-5.5}$ kN m⁻²) from the possibilities due to a weaker representation of the drift-concentration and drift-thickness relationships (Fig. 9). This shows the limitations of the parameterisation from Hibler (1979) and could support the use of new sea ice rheologies, such as the elasto-brittle rheology (Girard et al., 2011; Dansereau et al., 2016)(Girard et al., 2011; Dansereau et al., 2016).

5 4.2 Complexity of drift-strength interactions relationships

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The potential positive feedback between sea ice drift and strength that is described in Rampal et al. (2011) proposes that an initial decrease in sea ice concentration or thickness leads to a decrease of in sea ice strength and internal stress. This results in larger deformation and enhanced drift speed. According to Rampal et al. (2011), this would lead to an increased export of sea ice out of the Arctic Basin. This finally would lead to further decreases in sea ice concentration and thickness. However, observations do not show an increase in ice export (Döscher et al., 2014) while there is a clear decrease in concentration and

thickness (Stroeve et al., 2012; Vaughan et al., 2013) and increase in drift speed (Spreen et al., 2011). Furthermore, our study shows that, even if this positive feedback exists, it is more complex than Rampal et al. (2011) suggest for two main reasons.

The first complication is the fact that a change in export of sea ice is not only a cause but also a consequence of changes in concentration and thickness. The volume export is the product of sea ice drift speed, concentration and thickness.

- 15 a decrease in concentration or thickness will both emphasize the positive feedback by increasing drift speed and the resulting export of sea ice, and reduce its magnitude by directly decreasing export of sea ice. This will balance the resulting sea ice export. We compute sea ice export at Fram Strait from sea ice drift speed, thickness (which takes into account concentration, since our thickness is the sea ice volume per area) and transect length at two different latitudes (76°N and 80°N) following Spreen et al. (2009). From 1979 to 2013, the volume flux modelled by NEMO-LIM3.6 decreases with a negative trend of
- 20 $1.8 \text{ km}^3 \text{ d}^{-1} \text{ decade}^{-1}$ in the control simulation ($P^*_{\sim}=20 \text{ kN m}^{-2}$) but interannual variations are very large, especially at the southern transect (76°N). Increasing ice strength (by increasing P^*) results in a decreasing volume flux at Fram Strait mainly due to the lower thickness. Therefore, in our model the direct effect of decreasing concentration and thickness is more important than the impact of increasing drift speed on the export at Fram Strait.

The second source of complexity is the fact that sea ice thickness decreases with higher ice strength (Section 3.3). If the 25 drift-strength feedback dominated in our P^* experiments, ice thickness would be higher for higher ice strength (higher P^*), due to lower drift speed and export. However, ice thickness decreases with higher ice strength due to lower deformation (Figs. 5a and 7a). Thus, isolating the drift-strength feedback with a set of sensitivity experiments is difficult.

A previous study demonstrated the impact of increased ice strength using a coupled ice-ocean model to account for largescale effects (Häkkinen and Mellor, 1992). They use both the classical Hibler parameterisation for ice strength as well as a 30 square dependence of ice strength on thickness for first-year sea ice following Overland and Pease (1988) and compare both approaches. They show that increased ice strength leads to thicker ice, which is different from what we find in this study (increased strength leads to thinner ice). However, Häkkinen and Mellor (1992) do not use an ITD scheme, which may explain the difference with our results. Some sea ice models that include an ITD scheme use *P* scaling as $h^{3/2}$ since it is more physically realistic than *P* scaling as *h* (Rothrock, 1975). However, using such a scaling is less numerically stable (Lipscomb et al., 2007) and leads to poorer agreement with observations (Ungermann et al., 2017). According to Leppäranta (2011), the exact value of the thickness exponent remains an open question.

To test the impact of such a scaling on the resulting ice thickness and drift speed, we also performed sensitivity experiments in which we introduce an exponent λ in the ice strength equation (1), varying between 0.5 and 2 ($\lambda = 1$ corresponds to the original formulation of Hibler (1979)):

$$P = P^* h^{\lambda} \exp[-C(1-A)].$$
⁽⁵⁾

These experiments are more complex than the P^* experiments since they introduce a nonlinear dependence between ice strength P and ice thickness h but they provide insight into the understanding of the impact of a change in the ice strength parameterisation. Overall, these experiments lead to similar conclusions as for the P^* experiments: higher λ leads to lower ice thickness, lower drift speed in winter and higher drift speed in summer, lower ice thickness heterogeneity, and a similar behaviour for drift-concentration and drift-thickness relationships.

An additional element that has not been studied here and could increase the complexity of the drift-strength interactionsrelationships is the interaction between the ocean-sea ice system and the atmosphere. In this analysis, we use an ocean-sea ice model forced by atmospheric reanalysis. A full coupling with the atmosphere could provide different results regarding drift-strength

- 15 interactionsrelationships. For example, Juricke and Jung (2014) find that the implementation of a stochastic sea ice strength parameterisation leads to different responses in the coupled ECHAM6-FESOM model compared to the FESOM model forced by atmospheric fluxes generated by the coupled model. In the uncoupled simulation, the Arctic sea ice volume increases compared to a reference run without parameterisation, while the volume remains largely unchanged in the coupled simulation. This suggests that a negative atmospheric feedback explains the differences between both coupled and uncoupled modes. Therefore,
- 20 care needs to be taken when extrapolating results from forced simulations to coupled models. Specifically for our study, the effect of coupling on drift-strength interactions relationships could be assessed by comparing our results to coupled simulations using NEMO-LIM3.6 (e.g. EC-Earth in the framework of CMIP6).

4.3 Impact of domain choice

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In this study, we compute spatial means both over the SCICEX box, roughly corresponding to the Central Arctic, and over a wider domain encompassing all grid cells north of 50°N with a concentration threshold ($A \ge 0.15$). We prefer using the SCICEX box in our study because it produces much better agreement between the model and observations. The wider domain includes the large model biases occurring in the vicinity of the ice front and of straits, e.g. model overestimation of drift speed at Fram Strait (Fig. 3).

The use of the wider domain produces results for drift-concentration and drift-thickness relationships that clearly diverge compared to observations due to the inclusion of coastal grid cells that have high model biases. Computing mean concentration, thickness and drift speed over the Central Arctic (SCICEX box in our analysis) provides values that are much more consistent with observations and more representative of Arctic conditions. Therefore, the comparison between our central and wide domains demonstrates the impact of domain choice, with generally better performance when using the central domain. A decomposition of the Arctic Ocean into sub-regions such as in Koenigk et al. (2016) would be a possible improvement compared to the use of a single wider domain.

4.4 How can this methodology help in future model intercomparisons?

5 The methodology proposed in this analysis, particularly the process-based diagnostics and metrics, can be used to assess the performance of other models against observational datasets, which will be an important component of SIMIP (Notz et al., 2016). It can be extended to models being forced by atmospheric reanalysis (such as the model used here) as well as fully coupled models, in order to provide a benchmark for further model intercomparison. In the framework of such a model intercomparison, the use of the process-based metrics that we developed (slope ratios and normalised distances) may be valuable 10 for identifying which models fall within the observational range.

In this study, we only focus on one model resolution. Although some preliminary results show that a higher spatial resolution with the same model_NEMO-LIM3.6 provides a higher sea ice thickness, there is a need for a deeper analysis of the impact of model resolution. The methodology proposed fits quite well into the framework of the EU Horizon 2020 PRIMAVERA project (https://www.primavera-h2020.eu/), which aims at evaluating the effect of high resolution in global climate models.

15 Finally, this process-based analysis provides an alternative to classic model evaluations that only look at sea ice extent and thickness. It systematically highlights the links between sea ice dynamic and thermodynamic processes. Evaluating new sea ice rheologies using this methodology will provide a stronger test of model performance.

5 Conclusions

This study first shows that the global ocean-sea ice NEMO-LIM3.6 model is able to reproduce the observed sea ice
 extent, concentration, thickness and drift speed reasonably well over the historical period (from 1979 to 2013). Monthly mean trends in concentration, thickness and drift speed are also in the observational range, except for the trend in drift speed during summer. We show that this model bias is linked to the removal of sea ice in the eastern Central Arctic rather than an actual decrease of drift speed This study first shows that the global ocean-sea ice NEMO-LIM3.6 model is able to reproduce the observed sea ice extent, concentration, thickness and drift speed reasonably well over the historical period (from 1979
 to 2013).

The interactions relationships between sea ice drift speed and strength are well represented through the relationships between drift speed and concentration on the one hand, and drift speed and thickness on the other hand. In particular, the increasing drift speed with lower concentration and thickness is reproduced by the model. Different process-based metrics were developed in the framework of this study and allow to test the performance of our model against observations and

30 <u>reanalyses</u>. The drift-thickness relationship is marked by a hysteresis loop: two drift speed values are possible for a given thickness depending on the season, with a higher sea ice drift speed during the melting season and a lower value during the growing season. When considering the relationships between the trends in drift speed, concentration and thickness, the spread

between the model and observations is higher mainly due to too low summer trend in modelled This indicates that further investigation is needed to identify other potential factors that control the drift speed.

Sensitivity experiments show that higher initial ice strength leads to lower ice thickness. This is due to lower deformation rates that prevents ice piling up, especially north of Greenland and the Canadian Archipelago. In the case of the highest

- 5 strength experiment used here, net ice production is relatively low, which compensates for relatively high deformation rates. These experiments also show that no single value of $P^* = 45$ kN m⁻² is a good candidate in terms of drift-concentration and drift-thickness relationships. However, this value is not highly superior to other P^* values and the best P^* is the best-option for reproducing the observed mean seasonal cycles of drift speed and thickness , but the best option depends on the variable and on the month of the year. Therefore, we do not recommend one single P^* value. We suggest that other rheologies might
- 10 be more appropriate.

Finally, this study shows that the interactions relationships between sea ice dynamics and state are complex and cannot be summarised by a simple feedback loop. The diagnostics and metrics proposed in this study that relate drift speed to concentration and thickness are necessary conditions for representing the drift-strength interactions relationships, but they are not sufficient. Sensitivity experiments in which sea ice strength is varied are also essential for gaining insight into these

15 interactionsrelationships. While NEMO-LIM3.6 correctly represents the drift-concentration and drift-thickness relationships, sensitivity experiments show that processes other than the drift-strength feedback are more important in driving sea ice thickness and drift speed responses. In this analysis, we use one resolution of one model with an atmospherically forced mode. A multi-model assessment using different model resolutions, e.g. in the framework of the EU Horizon 2020 PRIMAVERA project, will provide further insight into the interactions relationships between sea ice dynamics and state.

20 6 Code availability

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All codes for computing and plotting the results of this article are written in Python programming language and are available upon request.

Author contributions. DD, FM and TF designed the experimental study. FM and AB performed the model simulations. DD collected the observational datasets, developed the diagnostics and metrics, analysed the results and produced the figures. NFT and OL provided substantial feedback to the analysis. DD prepared the manuscript with contributions from all co-authors.

Competing interests. The authors declare that they have no conflict of interest.

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Sea ice strength as a function of sea ice thickness computed from Eq. (1) (Hibler, 1979) for five given values of P^* corresponding to the five sensitivity experiments. The three panels correspond to three different values of sea ice concentration: (a) A = 0.8, (b) A = 0.9, (c) A = 1. Note that the y axes are different in the three panels.

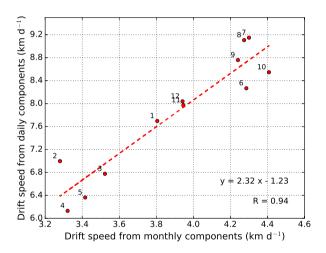


Figure 1. Scatter plot of modelled (NEMO-LIM3.6) monthly mean sea ice drift speed computed from daily components against drift speed based on monthly components. Data are temporally averaged over the period 1979-2013 and spatially averaged over the SCICEX box. Numbers denote months. The dashed line represents the linear regression. The equation of the linear regression and the Pearson correlation coefficient between both variables are shown in the lower right corner.

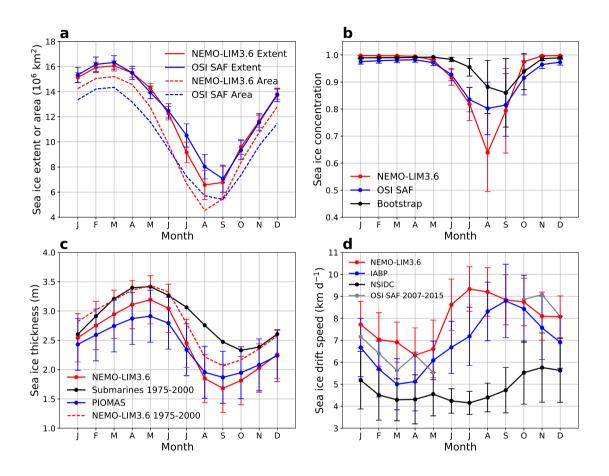


Figure 2. Modelled (NEMO-LIM3.6) and observed monthly mean seasonal cycles of Arctic sea ice (a) extent (total area of grid cells where concentration is higher than 0.15) and area, (b) concentration, (c) thickness (sea ice volume per area) and (d) drift speed averaged over the period 1979-2013 (except for submarine and OSI SAF observations that span 1975-2000 and 2007-2015 respectively). The spatial mean over the SCICEX box is shown in (b), (c) and (d). Sources for observations and reanalysis: OSI SAF satellite data for extent and concentration, Bootstrap satellite data for concentration, submarines and PIOMAS reanalysis for thickness, IABP buoysand-, NSIDC (Tschudi et al., 2016) and OSI SAF for drift speed. Error bars show the temporal standard deviation of monthly values. In panel (c), the model seasonal cycle is also computed over 1979-2000 1975-2000 to allow for more direct comparison with submarine observations.

(a) Modelled (NEMO-LIM3.6) mean Arctic sea ice concentration averaged over the winter months (JFM, i.e. January-February-March) of the period 1979-2013. (b) Difference in concentration between NEMO-LIM3.6 and OSI SAF averaged over the winter months of the period 1979-2013. (c) Difference in concentration between NEMO-LIM3.6 and Bootstrap averaged over the winter months of the period 1979-2013. (d), (e), (f) Same as (a), (b), (c) respectively for the summer months (JAS, i.e. July-August-September). The black polygon marks the SCICEX box.

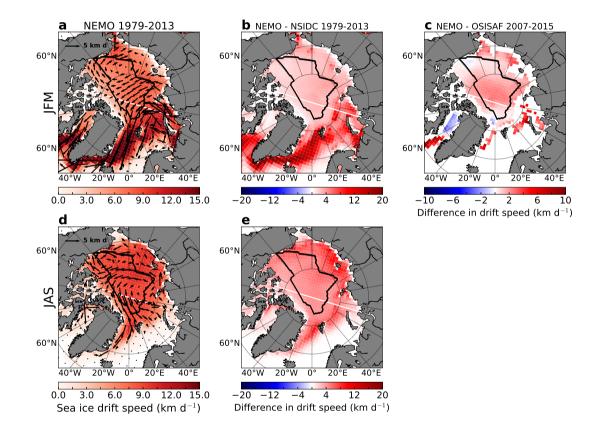


Figure 3. (a) Modelled (NEMO-LIM3.6) mean Arctic sea ice drift speed averaged over the-winter months (JFM, i.e. January-February-March) of the period 1979-2013. (b) Difference in drift speed between NEMO-LIM3.6 and the NSIDC dataset (Tschudi et al., 2016) averaged over the winter months of the period 1979-2013. (c) Difference in drift speed between NEMO-LIM3.6 and OSI SAF averaged over the winter months of the period 2007-2015. (d), (e) Same as (a), (b) respectively for the summer months (JAS, i.e. July-August-September). OSI SAF drift data are not available in summer. The black polygon marks the SCICEX box.

Modelled (NEMO-LIM3.6) and observed monthly mean seasonal cycles of trends in Arctic sea ice (a) extent, (b) concentration, (c) thickness and (d) drift speed averaged over the period 1979-2013. The spatial mean over the SCICEX box is shown in (b), (c) and (d). A dot is shown for monthly trends that are significant at the 5% level. Sources for observations and reanalysis: OSI SAF satellite data for extent and concentration, Bootstrap satellite data for concentration, PIOMAS reanalysis for thickness, IABP buoys and NSIDC

(Tschudi et al., 2016) for drift speed. Error bars show the temporal standard deviation of monthly values.

(a) Modelled (NEMO-LIM3.6) mean trend in Arctic sea ice drift speed averaged over the winter months (JFM, i.e.

January-February-March) of the period 1979-2013. (b) Same as (a) for the summer months (JAS, i.e. July-August-September). (c) Same as (a) for August only. (d), (e), (f) Same as (a), (b), (c) respectively for sea ice concentration. The black polygon marks the SCICEX box.

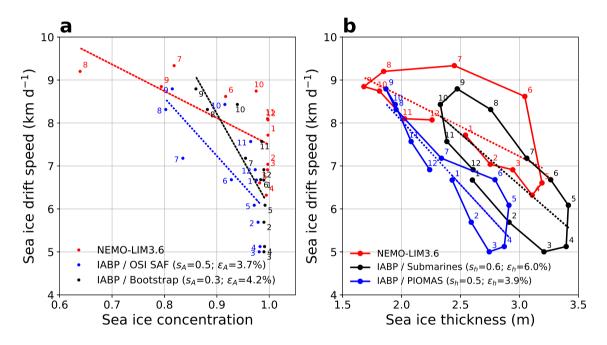


Figure 4. Scatter plots of modelled (NEMO-LIM3.6) and observed monthly mean sea ice drift speed against (a) concentration and (b) thickness temporally averaged over the period 1979-2013 (except for submarine observations that span 1975-2000) and spatially averaged over the SCICEX box. (c), (d) Same as (a), (b) for trends. Numbers denote months. Dotted lines show linear regressions. Sources for observations and reanalysis: IABP and NSIDC (Tschudi et al., 2016) for drift speed, OSI SAF and Boostrap for concentration, submarines and PIOMAS for thickness. Slope ratios and normalised distances between NEMO-LIM3.6 and the different observation datasets are shown in brackets in the legends.

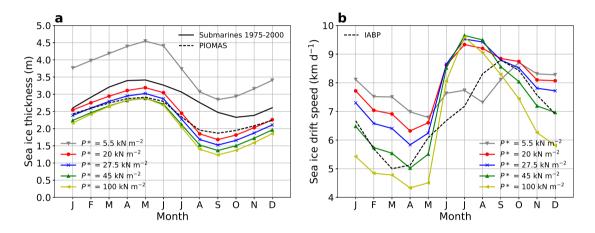


Figure 5. Modelled (NEMO-LIM3.6) monthly mean seasonal cycles of sea ice (a) thickness and (b) drift speed temporally averaged over the period 1979-2013 and spatially averaged over the SCICEX box for five different P^* values (see Eq. (1)). Observations and reanalysis are represented as black lines (submarine observations, spanning 1975-2000, and PIOMAS for thickness in (a) and IABP for drift speed in (b)).

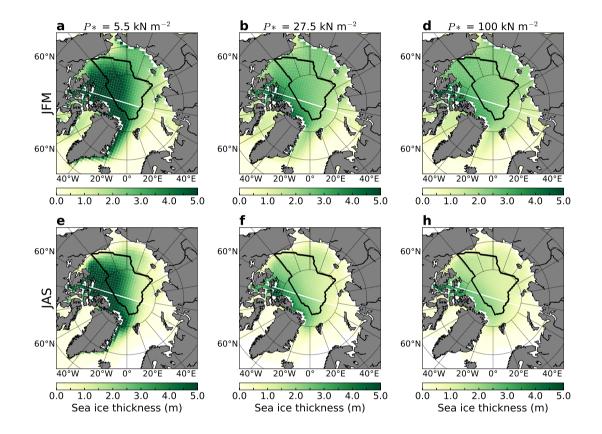


Figure 6. Modelled (NEMO-LIM3.6) mean Arctic sea ice thickness averaged over the winter months (JFM, i.e. January-February-March) of the period 1979-2013 for (a) $P^*_{=}$ = 5.5 kN m⁻², (b) $P^* = 27.5$ kN m⁻², (c) $P^*_{=}$ = 100 kN m⁻². (e), (f), (g) Same as (a), (b), (c) respectively for the summer months (JAS, i.e. July-August-September). The black polygon marks the SCICEX box.

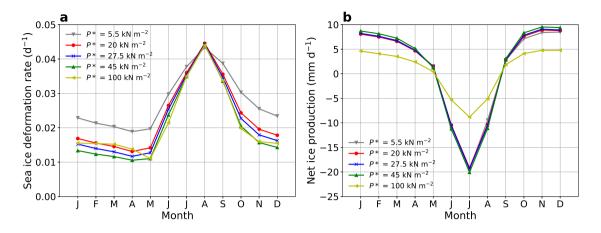


Figure 7. Modelled (NEMO-LIM3.6) monthly mean seasonal cycles of (a) sea ice deformation rate and (b) net ice production temporally averaged over the period 1979-2013 and spatially averaged over the SCICEX box for five different P^* values.

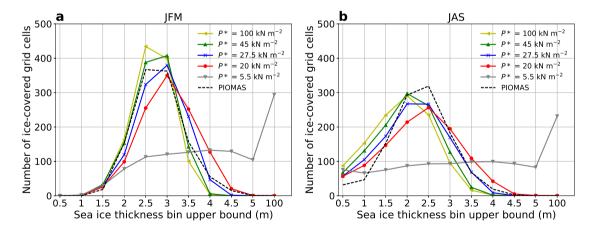


Figure 8. Number of ice-covered grid cells in each thickness bin temporally averaged over 1979-2013 and spatially averaged over the SCICEX box for both (a) winter (JFM, i.e. January-February-March) and (b) summer (JAS, i.e. July-August-September). Results are shown for NEMO-LIM3.6 (five different $P*-P^*$ values) and for PIOMAS reanalysis interpolated onto the eORCA1 grid. The x axis shows the upper bound of each thickness bin.

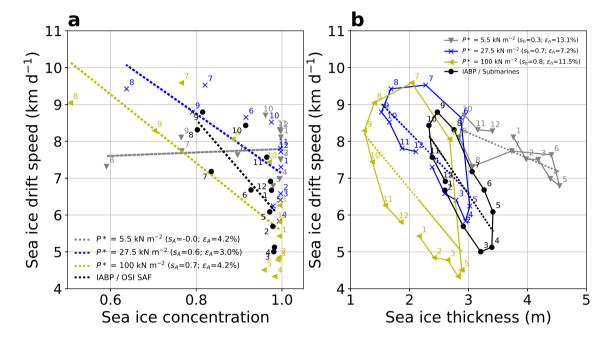


Figure 9. Scatter plots of modelled (NEMO-LIM3.6) monthly mean sea ice drift speed against sea ice (a) concentration and (b) thickness temporally averaged over the period 1979-2013 and spatially averaged over the SCICEX box for the different P^* values (only three values in (b) for readability). Numbers denote months. Observations and reanalysis are represented in black. Dotted lines show linear regressions. Slope ratios and normalised distances between NEMO-LIM3.6 and the different observation datasets are shown in brackets in the legend.

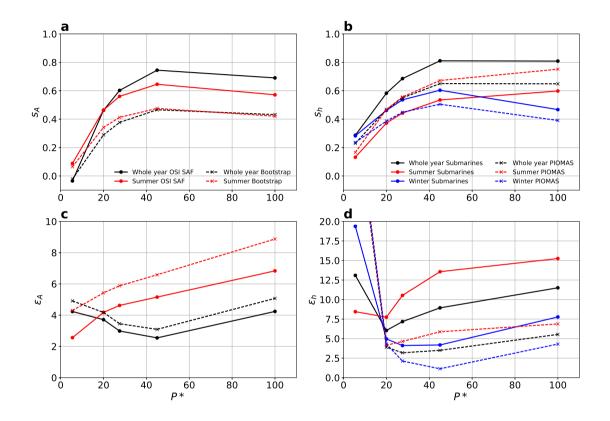


Figure 10. (a) Drift-concentration slope ratio s_A , (b) drift-thickness slope ratio s_b , (c) drift-concentration normalised distance ϵ_A and (d) drift-thickness normalised distance ϵ_b as a function of ice strength parameter P^* . Black lines show the average over the whole year, red lines over summer (May-September), and blue lines over winter (November-March). In (a) and (c), observed sea ice concentration is retrieved from OSI SAF (solid lines) and Bootstrap (dashed lines). In (b) and (d), sea ice thickness comes from submarines (solid lines) and PIOMAS (dashed lines). In all sub-figures, sea ice drift speed is from IABP. Drift-concentration metrics are not shown for winter in (a) and (c) as concentration is high and almost constant at that time of the year (Fig. 4a).

Table 1. Summary of published literature providing observational drift speed trend and its cause, as well as area and volume export of sea ice at Fram Strait.

Reference	Drift speed	Cause of drift increase	Area export	Volume export
Häkkinen et al. (2008)	1950-2006:	Wind		
	significant positive trend			
Spreen et al. (2009)				1990-2008:
				no significant change
Kwok (2009)			1979-2007:	
			no significant trend	
Rampal et al. (2009)	1979-2007:	Ice strength		
	+17% decade ^{-1} in winter			
	+8.5% decade ^{-1} in sum-			
G	mer			
Spreen et al. (2011)	1992-2009:	Ice strength (first)		
$C_{1}^{2} + c_{1}^{2} + c_{1$	+10.6% decade ⁻¹	Wind (second)		
Gimbert et al. (2012)		Ice strength	1979-1995: increase	
Polyakov et al. (2012) Vihma et al. (2012)	1989-2009: increase	Ice strength (first)	1979-1995: increase	
Viiiiia et al. (2012)	1989-2009. Increase	Wind (second)		
Kwok et al. (2013)	1982-2009:	Not wind	1982-2009:	
11. (2015)	+6.2% decade ^{-1} in winter		small decrease	
	+3.6% decade ^{-1} in sum-			
	mer			
Langehaug et al. (2013)			1957-2005:	
			small increase	
Döscher et al. (2014)	Increase	From 1990: ice strength	No long-term trend	Decrease
		Before 1990: wind		
Olason and Notz (2014)	1979-2011:			
	+1.1 km d ^{-1} decade ^{-1} in	Ice strength		
	summer			
	+0.4 km d ^{-1} decade ^{-1} in			
	winter			
Krumpen et al. (2016)			1980-2012:	
			significant positive	
	T	XX 7' 1	trend	
Smedsrud et al. (2016)	Increase	Wind	1979-2014:	
			+6% decade ^{-1}	

Table 2. Mean sea ice thickness h, drift speed D, deformation rates d_{τ} and net ice production p_i temporally averaged over the period 1979-2013 and spatially averaged over the SCICEX box for the five P^* experiments.

$P^* (kN m^{-2})$	<i>h</i> (m)	$D (\mathrm{km}\mathrm{d}^{-1})$	$d_r (\mathrm{d}^{-1})$	$p_i \ (\mathrm{mm} \ \mathrm{d}^{-1})$
5.5	3.70	7.75	0.0277	1.27
20	2.47	7.96	0.0232	1.38
27.5	2.31	7.73	0.0219	1.41
45	2.16	7.23	0.0205	1.53
100	2.09	6.53	0.0214	0.95