

Modelling sea-level fingerprints of glaciated regions with low mantle viscosity

Alan Bartholet¹, Glenn A. Milne¹ and Konstantin Latychev²

5 ¹ Department of Earth and Environmental Science, University of Ottawa, Ottawa, K1N 6N5, Canada

² Department of Earth and Planetary Sciences, Harvard University, Cambridge, MA 02138, USA

Correspondence to: Glenn A. Milne (gamilne@uottawa.ca)

Abstract. Global patterns of sea-level change – often termed “sea-level fingerprints” – associated with future changes in ice/water mass re-distribution are a key component in generating regional sea-level projections. Calculation of these fingerprints is commonly based on the assumption that the isostatic response of the Earth is dominantly elastic on century time scales. While this assumption is accurate for regions underlain by mantle material with viscosity close to that of global average estimates, recent work focusing on the West Antarctic region has shown that this assumption can lead to significant error where the viscosity is significantly lower than typical global average values. Here we test this assumption for fingerprints associated with glaciers and ice caps. We compare output from a (1D) elastic Earth model to that of a 3D viscoelastic model which includes low viscosity mantle in three glaciated regions: Alaska, southwestern Canada and the southern Andes (Randolph Glacier Inventory (RGI) regions 1, 2 & 17, respectively). This comparison indicates that the error incurred by ignoring the non-elastic response is of order 1 mm in most areas (or about 1% of the barystatic signal) over the 21st century, with values reaching the centimetre level in glaciated regions. However, in glaciated regions underlain by low viscosity mantle, the non-elastic deformation can result in RSL changes with magnitudes of up to several 10s of centimetres (or several times the barystatic value). The magnitude and spatial pattern of this non-elastic signal is sensitive to variations in both the projected ice history and regional viscosity structure, indicating the need for loading models with high spatial resolution and improved constraints on regional earth viscosity structure to accurately simulate sea-level fingerprints in these regions. The anomalously low mantle viscosity in these regions also amplifies the GIA signal associated with glacier changes during the 20th century, causing it to be an important (even dominant) contributor to the modelled RSL change over the 21st century.

25 1 Introduction

A variety of processes drive changes in the vertical position of the ocean floor and ocean surface (e.g. Church et al., 2013; Milne et al., 2009), and the combination of these processes produces a complex pattern of sea-level change that varies through time. While the global mean relative sea-level change provides a useful single value which reflects the contribution from climate-related processes, specifically land ice melt and ocean warming, and does represent a reasonable estimate of sea level change at many coastal locations, various regional processes that produce a strong signal can result in large departures from the global mean value (Church et al., 2013). As a result, predicting future sea-level changes at regional to local scales is

challenging as it requires calculating and summing signals associated with numerous physical processes that have a range of spatial scales and response times (Slangen et al., 2011; 2014; Kopp et al., 2014).

35 Around the world, glaciers and ice sheets are losing mass and retreating (e.g. Oppenheimer et al., 2019; Vaughan et al., 2013; Shepherd et al., 2018; 2020; Wouters et al., 2019; Zemp et al., 2019). Observations since 1850 CE show that, on a global scale, the rate of glacier mass loss in the early 21st-century is without precedent for the observation period (Zemp et al., 2015). The melting of ice sheets and glaciers produces a spatial pattern of sea level change due to the resulting solid Earth deformation and changes to the geopotential (Farrell and Clark, 1976). When these changes happen on decadal to centennial time scales, 40 the resulting solid Earth response is assumed to be dominantly elastic and so the non-elastic (viscous) contribution is commonly neglected. The modelled spatial patterns in relative sea-level change associated with these short-term changes in ice mass are often termed "sea-level fingerprints" (e.g. Mitrovica et al., 2011). These fingerprints play a central role in projections of regional sea-level change (Church et al., 2013; Oppenheimer et al., 2019; Palmer et al., 2020; Slangen et al., 2012; 2014; Spada, 2017).

45 The assumption of an insignificant contribution of the non-elastic signal to sea-level fingerprints was recently addressed in a paper focusing on mass loss of the West Antarctic ice sheet (Hay et al., 2017). In this region, the viscosity of the Earth's shallow mantle is known to be several orders of magnitude lower than the global average value (e.g. Whitehouse et al., 2019). Hay et al. (2017) concluded that the viscous component of the response is significant and so should be included when 50 computing sea-level fingerprints. In this study, we extend this discussion to regions with glaciers that are underlain by low viscosity mantle. A number of studies have provided evidence that the glaciated regions of Alaska, Western Canada & USA and the Southern Andes are located in regions where the sub-lithosphere mantle viscosity is several orders of magnitude lower than typical global mean values (e.g. Hu and Freymueller, 2019; James et al., 2009; Jin et al., 2017; Richter et al., 2016). The cause of such low viscosity is likely to be related to the presence of plate subduction and the influx of water-rich fluids from 55 the subducting oceanic plate into the overlying mantle (e.g. Brocher et al., 2003). Departures from an elastic response will be relatively large in these regions and so the computed sea-level fingerprints may be in significant error. The primary aim of this work is to quantify the amplitude and spatial extent of the error caused by assuming an elastic Earth response in the three regions mentioned above. In particular, a key goal is to determine if the influence of non-elastic deformation in these low viscosity regions acts to significantly influence the calculated fingerprints beyond the regions defined by low viscosity mantle 60 material.

2 Methods

Our sea-level projections were generated using a numerical finite-volume formulation of the surface loading process (e.g. Latychev et al., 2005; Hay et al., 2017). This formulation assumes a spherical Maxwell body, discretised using a tetrahedral

grid in which the lateral resolution is greatest (~12 km) at the surface of the Earth model and lowest (~50 km) at the core-mantle boundary. The algorithm used the sea-level equation in our glacial isostatic adjustment (GIA) model is based on the theory described in Farrell and Clark (1976) but extended to incorporate the influence of Earth rotation on RSL changes (Milne and Mitrovica, 1998; Mitrovica et al., 2005). In order to apply this algorithm, two primary inputs must be defined: a realistic space-time evolution of grounded land ice to force the model and a realistic model of the Earth that defines the interior density and rheology structure to compute the viscoelastic response. These two model inputs are detailed below.

2.1 Ice model

In this study we created ice models for each of the 19 first order regions in the Randolph Glacier Inventory 5.0 (RGI; Pfeffer et al., 2014). The RGI provides the area of glacier extent in each of the regions and then we apply the region-specific thickness-area scaling function of Huss and Farinotti (2012) which calculates the mean thickness of each glacier in a region using:

$$\bar{h} = cS^\gamma \quad (1)$$

where \bar{h} is the mean thickness, S is the area of the glacier, and c and γ are constants specific to each region in the RGI. In order to determine a mass loss history for our ice model for all 19 regions in the RGI we use the decadal Representative Concentration Pathway (RCP) 4.5 projections provided by Huss and Hock (2015) for the period 2010-2100 CE with a net global barystatic (Gregory et al., 2019) sea-level change of 10.8 cm. The barystatic sea-level change for RGI regions 1, 2 & 17 are, respectively, 1.8, 0.2 and 0.3 cm for RCP 4.5 (Huss and Huck, 2015).

Using the decadal mass loss projections, we produced a model of ice extent changes that simulates the vertical thinning of the ice as well as a crude estimate of lateral retreat as the area of ice cover changes. We iterated over each of the decadal time steps and calculated the amount of uniform ice thickness change (based on areal extent) required to equal the projected sea-level equivalent (SLE) using a tolerance of ± 1 %. We then subtracted this height from the ice thickness distribution of the previous time step and revised the area distribution to account for locations where ice thickness had reduced to zero. We then applied a spatial Gaussian filter to the calculated change in ice extent between successive time steps (using the NumPy 1.16.1 Multidimensional Gaussian filter) to spatially smooth the ice thickness distribution. While this did result in some loss of spatial fidelity, it removed the need for anomalously large changes in ice thickness to produce the desired volume changes. This process was applied individually to each of the 19 first order regions in the RGI. Figure 1a shows ice extent at 2010 and 2100 CE for the RGI regions 1 (Alaska) & 2 (Western Canada and USA) and Figure 1b gives the same results for region 17 (Southern Andes).

While the focus of this study is sea-level fingerprints associated with future changes in glaciers, we also briefly consider the influence of loading changes during the 20th century as a GIA overprint on the 21st century fingerprint signal. We apply the same methods as described above but use the regional volume change estimates from Marzeion et al. (2015) to determine ice

thickness changes going backwards in time from 2010 CE. The total barystatic sea-level changes for RGI regions 1, 2 & 17 for the period 1902-2010 CE are, respectively, 0.7, 0.3 and 0.2 cm. In comparison to the 21st century loading model, no lateral changes were incorporated in the 20th century model since thicknesses generally increased at each time step (going backwards from 2010 CE). That is, the lateral extent remains fixed to that defined in the RGI (5.0).

100 2.2 Earth model

The density and elastic properties of our Earth model are defined using the radial (1D) seismic Preliminary Reference Earth Model (Dziewonski and Anderson, 1981). We note that the influence of lateral variations in elastic and density structure on the computation of sea-level fingerprints has been shown to be negligible (Mitrovica et al., 2011). Due to large uncertainty in our knowledge of the viscosity structure of the Earth, the viscosity structure is most commonly defined by only three
105 parameters: the first is an outer shell of high viscosity (1×10^{37} Pa s) which is used to simulate an elastic outer shell (the lithosphere); the second is an isoviscous upper mantle region which extends from the base of the lithosphere to a depth of 670 km; and third, an isoviscous lower mantle region that extends from 670 km to the core-mantle boundary (2885 km). The values used to define the viscosity vary depending on the region detailed below resulting in an Earth model where the internal viscosity structure varies not only with depth but laterally as well.

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In defining global-scale viscosity structure, we assign a lithospheric thickness of 96 km, an upper-mantle viscosity of 5×10^{20} Pa s, and a lower-mantle viscosity of 1×10^{22} Pa s. While there is considerable uncertainty in our knowledge of global average viscosity structure, most of this uncertainty relates to that of the lower mantle (e.g. Mitrovica and Forte, 2004; Lambeck et al., 2014). The values we use for lithospheric thickness and upper mantle viscosity are broadly compatible with those from recent
115 analyses of global GIA data sets (Lambeck et al., 2014; Peltier, 2004) and the value we use for lower mantle viscosity represents a middle ground between these recent estimates. Given the short time period of our model simulations (~100 yr), the use of other global average viscosity structures could be substituted without significantly impacting the results as the component of non-elastic deformation is small for viscosity values typically inferred in global GIA analyses. The regional viscosity structure we adopt is the more important aspect of our Earth model as this is anomalously low in RGI regions 1, 2 & 17.

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For RGI region 1 (Alaska), a number of studies have estimated the regional viscosity structure (e.g. Larsen et al., 2005; Sato et al., 2011; Jin et al., 2017; Hu and Freymueller, 2019). All of these studies estimate a relatively thin lithosphere elastic thickness, averaging around 50 km but with uncertainty of a few 10s of km, and low viscosity values in the shallow upper mantle ranging between middle 10^{18} Pa s to low 10^{19} Pa s. In a recent analysis, Jin et al. (2017) used measurements from Ice
125 Cloud and Land Elevation Satellite (ICESat), global positioning system (GPS), and Gravity Recovery and Climate Experiment (GRACE) to estimate Earth model parameters. By isolating the signal due to past ice loading, they concluded on a best fit three-layer Earth model consisting of a lithospheric (elastic) thickness of 60 km, a 110 km thick asthenosphere with a viscosity of 2×10^{19} Pa s, and a sub-asthenosphere mantle with a viscosity of 4×10^{20} Pa s. A second recent study (Hu and Freymueller,

2019) also used vertical land motion rates from GPS to constrain a regional, depth-dependent viscosity structure. They
130 estimated lithosphere thickness to be 55 km and the viscosity and thickness of the asthenosphere to be, respectively, 3×10^{19}
Pa s and 230 km, but noted significant trade-off in these parameter values.

The relatively good agreement between these studies gives some confidence in choosing parameters. We adopted the values
of Jin et al. (2017) for this study (those from Hu and Freymueller (2019) were published after the completion of our modelling)
135 and extended their sub-asthenosphere region (with a viscosity of 4×10^{20} Pa s) to the bottom of the upper mantle (670 km);
below this depth values associated with the global background model are the default. The lateral extent of these viscosity
values at the model Earth surface is shown in red in Figure 2a. In order to constrain the lateral extent of the low viscosity
region we define a surface area that is roughly similar to the region studied by Jin et al. (2017). Note that the extent of this
region decreases with depth as it is projected radially downwards.

140 For RGI region 2 (Western Canada & USA), we are interested only in the area adjacent to southwestern British Columbia as
this is where GIA studies have inferred low viscosity values: James et al. (2009) concluded that RSL observations from
Vancouver Island can be fit equally well across a wide range of asthenosphere thicknesses and viscosities. The Earth model
with the lowest viscosity consisted of a lithospheric (elastic) thickness of 60 km, a 140 km thick asthenosphere with a viscosity
145 of 3×10^{18} Pa s, and a sub-asthenosphere mantle with a viscosity of 4×10^{20} Pa s. These results are supported by a more recent
study that considered sea-level observations from a larger area in southwestern British Columbia (Yousefi et al., 2018) and so
we adopt the values from James et al. (2009) to define the regional lithosphere thickness and upper mantle structure. The lateral
extent of this region at the model Earth surface is shown in green in Figure 2a.

150 In the southern Andes region (RGI area 17), a number of studies have inferred the presence of low viscosity material (e.g.
Ivins and James, 1999; Ivins and James, 2004; Lange et al., 2014; Richter et al., 2016) that likely resides in the mantle wedge
between the subducting plate and the base of the lithosphere (Klemann et al., 2007). In all of these studies, the estimated
lithosphere elastic thickness is relatively thin (~30 km) and asthenosphere viscosity low (order 10^{18} Pa s). We adopted results
from the most recent of the above-listed analyses, Richter et al. (2016), who used observations from 43 geodetic Global
155 Navigation Satellite System (GNSS) sites distributed over the Southern Patagonian Ice Field to analyze vertical and horizontal
velocities of present-day crustal deformation. By applying an ice-load history that assumes a moderate present-day glacial
mass loss, with slightly higher than present-day mass loss immediately following the Little Ice Age (LIA) maximum, Richter
et al. concluded on a preferred Earth model consisting of a 36.5 km thick lithosphere and a sub-lithosphere mantle with a
viscosity of 1.6×10^{18} Pa s. They applied a half-space Earth model and so provide no constraint on the depth-extent of the low
160 viscosity asthenosphere. We place the lower asthenosphere boundary at 150 km with viscosity values of our reference model
below this depth. The lateral extent of this low viscosity region is shown in Figure 2b.

3 Results and Discussion

Our goal is to quantify the signal of the non-elastic response to sea-level fingerprints computed for the three RGI regions introduced above. Therefore, in the following, we focus on comparing results from our 3-D viscoelastic Earth model to those computed assuming the Earth response to the loading changes is elastic.

Figure 3a shows the global sea-level fingerprint for the non-linear mass loss results of Huss and Hock (2012) as applied to all regions of the RGI assuming Earth deformation is entirely elastic. As is conventional, the fingerprint shows the total sea level change between the start and end of the study period (in this case, 2010 to 2100 CE). The pattern of sea-level change is typical in that it shows a sea level fall near the sources of the ice mass loss and a sea level rise in the far-field (e.g. Mitrovica et al., 2001). Using the same ice loading model, results for the 3D viscoelastic Earth model are shown in Fig. 3b. At the global scale, comparison between the results in Figs 3a & 3b shows that the differences are small; therefore, we subtract the elastic results from the viscoelastic results to isolate the difference (Fig. 3c). At locations located away from glaciated areas, the difference between the viscoelastic and elastic Earth models is negligible (generally of order 1 mm at 2100 CE). In glaciated regions where the viscosity structure is that of the global model (i.e. all RGI regions except 1, 2 & 17), differences approach the 1 cm level by 2100 CE (or about 10% of the barystatic sea-level change), indicating that the assumption of an elastic Earth is relatively accurate even in near-field regions when the viscosity of the underlying mantle is close to global average values. However, in areas where anomalously low viscosity values exist (Figure 2), the difference in sea-level change can be several times larger than the barystatic value (10.8 cm) due to the faster response of the low viscosity mantle. Thus, the error introduced by considering only the elastic solid Earth response is spatially restricted and significantly exceeds the cm level only in the vicinity of the low viscosity regions. The remainder of this section will focus on the signal in these near-field regions only.

Sea-level predictions for the regions with underlying low viscosity mantle are shown in Figure 4. The results for Alaska and Western Canada & USA (Figure 4a-c), indicate that the spatial pattern associated with the viscoelastic signal is markedly different from that for the elastic Earth model. Note that, for ease of interpretation, the predictions shown in Figure 4 consider only the RSL change associated with ice mass loss in the respective RGI regions (1, 2 in Fig. 4a-c and 17 in Fig. 4d-f), hence the difference between the results in Figs 3 & 4. The influence of ice changes in other RGI regions will cause an almost uniform signal over each of the areas shown in Fig. 4, with amplitude close to the global barystatic value, and so the spatial patterns (gradients) will not be significantly affected by this omission.

Inspection of Fig. 4 indicates that the spatial pattern associated with the viscoelastic signal is markedly different to that of the elastic Earth model. When an elastic model is used, the near-field RSL signal is entirely negative reflecting a lowering of the geoid and uplift of the solid Earth. In this case, the entire region experiences uplift as shown in Figure S1. In the viscoelastic case, the low viscosity values reduce the Maxwell time of the material such that the non-elastic component of deformation

195 becomes significant after a few decades. As a result, areas of subsidence peripheral to the ice covered regions are predicted (Fig. 4(b & e); Fig. S1(b & e)). These areas of net subsidence (so-called “peripheral bulges”) are a characteristic feature of the GIA response on millennial time scales (e.g. Peltier, 1974; Clark et al., 1978; Whitehouse et al., 2018) and reflect the isostatic signal of a thin elastic lithosphere overlying a viscoelastic mantle within which the non-elastic component of deformation is significant.

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Focusing first on the results for RGI regions 1 & 2 (Fig. 4a-c), in areas where ice has thinned or disappeared (Fig. 1), the difference in RSL (Fig. 4c) shows a larger fall whereas peripheral to this area, the RSL fall is less (with some regions showing a small RSL rise by 2100 CE – blue bands peripheral to the central uplifting area in Fig. 4(b & e). Because of the considerably lower mantle viscosity in these regions, the solid Earth responds faster than it otherwise would have over the same time period. As a result, the areas shaded in red (Fig. 4c) show a greater sea level fall compared to the elastic case due to the additional uplift of the solid Earth surface associated with non-elastic deformation. The peripheral areas showing a reduced RSL fall or subtle RSL rise relate to non-elastic deformation that governs the formation of peripheral bulges. The results in Fig. 4c indicate that the error made by assuming an elastic Earth response can exceed several 10s of cm and be positive or negative depending on location. The differences between the viscoelastic and elastic model runs are dominated by vertical land motion, which is shown in Fig. S1 using the same format as Fig. 4. The sea surface component of RSL is, in general, smaller than the land motion signal but this is site and time dependent (see Fig. 5 and related discussion below).

Results for the Southern Andes (Figure 4(d-f); Figure S1(d-f)) are similar in that the non-elastic component of deformation in this region results in a more rapid sea-level fall in areas of ice thinning/retreat. The RSL differences (compared to the elastic case) are not as large as for Alaska because the amplitude of ice mass loss is less (Fig. 1), but the differences still reach values of ~10 cm and so are large relative to the barystatic signal (10.8 cm). The peripheral region of subsidence is less well developed compared to that for RGI region 1. This is probably due to the different amplitude and geometry of ice mass loss (Fig. 1) and the difference in the viscosity structure between the two regions.

220 The spatial patterns shown in Fig. 4 are complemented by model output of time series for six different towns or cities (population ranging from ~10,000 to several million inhabitants) in Fig. 5. These particular locations (indicated in Figs 1 & 4) were chosen to illustrate the range of RSL signals evident in near-field areas. RSL time series for RGI regions 1 & 2 are shown for Juneau and Sitka (Region 1), Vancouver and Victoria (Region 2), and Puerto Natales and Río Grande (Region 17). Time series for both the elastic and viscoelastic cases are based on a 10-year discretization of the ice thickness model as described in Section 2.1. The 1-D viscoelastic results (blue lines) are based on the reference (global) viscoelastic model. At all locations shown in Fig. 5, the difference between these results and those based on an elastic model (red lines) are at the centimetre level or less which is consistent with the results in Fig. 1c for glaciated regions not underlain by anomalously low viscosity mantle. The 3-D viscoelastic results (black lines) include the low viscosity regions illustrated in Fig. 2 and described in Section 2.2.

At Juneau, USA, a sea-level fall is predicted for both the elastic and 3-D viscoelastic results with the latter showing a much greater fall (by ~ 74 cm). The dashed and dash-dotted black lines show the component signals for the 3-D viscoelastic case and these indicate that the vertical land motion (VLM) contribution to RSL dominates over sea-surface height (SSH) change at this site. Clearly, the application of an elastic Earth model greatly underpredicts the sea-level fall at this location. The predicted RSL curves for Puerto Natales are similar in that a sea-level fall is also shown; however, at this location the 3D viscoelastic model predicts a smaller fall (by ~ 1 cm) compared to the elastic model. The lower RSL amplitudes at this location reflect the smaller ice mass changes and the location of the settlement relative to the area of major mass loss.

At Sitka, Vancouver, Victoria and Río Grande, results for the viscoelastic Earth model give a RSL response that transitions from a fall to a rise. This is due to the more complex spatial pattern of the predicted response when a viscoelastic Earth model with anomalously low viscosity material is applied. As noted above, the GIA response is characterised by uplift in regions of mass loss and subsidence in some of the areas peripheral to the glaciers (Fig. S1(b & e)). Looking at the results for these four locations, the non-monotonic nature of the RSL response is governed by that of the VLM; the SSH contribution is primarily that of a sea-level fall associated with the reduction in ice mass resulting in a diminishing gravitational pull on the surrounding ocean. This fall in SSH offsets some of the sea-level rise caused by the VLM in these locations. The non-monotonic shape of the RSL curve has the net effect of producing a relatively small RSL change over the 21st century – at all four sites exhibiting this behaviour, the amplitude of RSL change is no more than a few cm. As a consequence, the final difference between the elastic and viscoelastic curves at 2100 CE is also relatively small, except at Sitka where the RSL rise of ~ 4 cm for the viscoelastic model compares to a large fall of ~ 22 cm for the elastic case.

The results in Figs 4 & 5 are based on only one realisation of viscosity structure and one estimate of ice thickness changes in each of the three regions. A small number of additional model runs were performed to give a crude indication of the sensitivity of the results to changes in these primary model inputs. Figure 6 shows modelled RSL curves at the same locations in Fig. 5 but for which one aspect of the model input was changed (red and blue lines). We show results for the case where the ice loading history was not smoothed (Fig. S2) and so the ice thickness changes are generally larger and more spatially restricted compared to the smoothed case (Fig. 1), particularly at later times in the 21st century when the lateral ice extent has significantly reduced. This change in the spatial fidelity of the ice distribution leads to a significant change in the predicted RSL curves at all locations but particularly so at Juneau and Sitka. While the largest change is at Juneau with a decrease in predicted RSL fall by ~ 50 cm, the change at Sitka is notable due to the change in sign. A spatial map of the change in RSL (2100 CE relative to 2010 CE) is shown in Fig. S4 which can be compared to the results in Fig. 4b. In general, the differences relative to the elastic model are smaller though still at a magnitude of several decimetres in some locations (such as Juneau). Also of note is that the more localised ice loading does not lead to the prediction of RSL rise during the 21st century in the Alaska region (this is not the case for the other two RGI regions considered). The greater sensitivity of the Alaskan results to this change in the ice model most likely reflects the larger mass changes in this region. Given that there is sensitivity to this aspect of the model

input at all low viscosity locations (Figure S5(a & d)), we conclude that the application of a global-scale GIA model with uniform spatial resolution is not an optimal approach to model the near-field isostatic response to the detailed changes in ice distribution illustrated in Figs 1 and S2. As a result of the limited spatial resolution of our GIA model, Iceland, which is known to be underlain by low viscosity mantle, was not included in the analysis. Further work should focus on the use of regional (Cartesian) models or global models with non-uniform grids (e.g. Larour et al, 2017) or nested, high-resolution regional grids (e.g. Goldburgh et al., 2016) to more accurately capture the detailed loading history and associated isostatic response in these low viscosity RGI regions.

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The blue lines in Fig. 6 indicate the sensitivity of our model results to changes in the Earth model viscosity structure. The solid blue lines show the results for model runs in which the lateral extent of the low viscosity regions was significantly extended (Figure S3). Comparison of the black and (solid) blue lines indicates that the results are sensitive to this aspect of the Earth viscosity model, with the greatest sensitivity found in Alaska where the RSL differences (relative to the original 3-D Earth model) reach several 10s of centimetres. At the other locations, the differences are generally less than a few cm (Figs 6 & S5(b & e)). In the final sensitivity test, we kept the lateral extent of the low viscosity areas the same (Fig. 2) but changed the depth of the bottom of this region to coincide with the 670 km depth seismic discontinuity (regions 1 & 2). While this is not a particularly realistic scenario, it serves to make a preliminary assessment of the impact of this model parameter on the output. The results of this change are shown by the blue dashed lines in Fig. 6 and the maps in Figs S4 and S5 (c & f). These changes to the viscosity structure in each region also significantly impact the predicted RSL changes. Again, the largest sensitivity is evident in Alaska with amplitudes of several decimetres at both Juno and Sitka. At the other locations, the sensitivity tends to be within the range ± 5 cm (Western Canada & US) and ± 10 cm in the Southern Andes. Clearly, changes to both the lateral and depth extent of the low viscosity region has a significant impact on the model output and so we recommend the use of more realistic Earth models that consider additional constraints such as regional seismic velocity models and/or viscosity structure associated with subduction (e.g. Austermann et al., 2013; Klemann et al., 2007; Yousefi et al., 2021).

The large amplitude of the non-elastic signal on century time scales in low viscosity regions indicates that application of an elastic model can result in significant error in the calculated sea-level fingerprint. A potentially important implication of this result is that the isostatic response to mass loss changes during the 20th century could be a significant contributor to the RSL response during the 21st century. The importance of this earlier loading signal is evident in the large contemporary uplift rates measured in the regions considered (e.g. Hu and Freymueller, 2019; Richter et al., 2016). We note that this signal is generally not considered to be a sea-level fingerprint as it is due to past ice mass changes. Instead, it is considered as part of the GIA component of the regional sea-level projections (e.g. Slangen et al., 2014). The ice model is defined as described in Section 2.1. The Earth viscosity model is the same as that described in Section 2.2 and used to generate the results in Figs 4 & 5. The RSL contribution of our 20th century ice load (1902-2010 CE) is shown in Fig. S6 (dashed black lines) along with the contribution from the load model shown in Fig. 1 (solid black lines; these are the same as the solid black lines in Fig. 5). As

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expected, the 20th century signal is monotonic as there is no active loading after 2010 CE. The amplitude at the six sites considered ranges from ~10 cm to ~2 cm (between 2010-2100 CE). The sign of the change due to 20th century loading at each location is compatible with the rate of change of the RSL fingerprints towards the end of the 21st century (e.g., sites showing a positive RSL fingerprint trend are where the 20th century signal is a RSL rise from 2010 to 2100 CE). At some sites where the fingerprint signal is highly non-monotonic and thus results in a small net RSL change (Victoria, Rio Grande), the 20th century loading signal dominates the total changes from 2010-2100 CE. Figure S7(b & e) shows the regional influence of 20th century loading on RSL at 2100 CE relative to 2010 CE. Overall, our results indicate that the 20th century signal can be at the 5-10 cm level and so should be considered when generating regional RSL projections in low viscosity areas.

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While this study assumes a Maxwell rheology, it is possible that, on the relatively short time scales considered here, significant departures from this simple rheological model may occur. These departures could take the form of a transient component of the non-elastic response (e.g. Yuen et al., 1986; Pollitz, 2005), in which the viscosity increases with time or a power-law response that is often associated with relatively large deviatoric stress (e.g. Wu and Wang, 2008; van der Wal et al., 2013) for which the effective viscosity would increase as stress levels relax. The significance of these more complex rheological models in low viscosity regions would be a natural extension of this analysis.

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4 Conclusions

Sea-level fingerprints are an integral aspect of calculating regional variations in future sea-level change. Calculation of these fingerprints commonly assumes that the isostatic response of the Earth is elastic on century time scales. Here we tested this assumption by comparing output from a (1D) elastic Earth model to that of a 3D viscoelastic model which includes low viscosity mantle in three glaciated regions: Alaska, southwestern Canada and the southern Andes (RGI regions 1, 2 & 17, respectively). This comparison indicates that the error incurred by ignoring the non-elastic response is generally of order 1 mm over the 21st century but can reach magnitudes of up to several 10s of centimetres when proximal to glaciated regions overlying anomalously low viscosity mantle. Our model results show significant sensitivity to variations in the input ice distribution history and regional viscosity structure. Given this, a logical extension of this work would apply models with high spatial resolution to adequately capture the ice load changes and incorporate more constraints on regional 3-D viscosity structure (e.g. slab geometry or constraints from seismic imaging). We conclude that sea-level fingerprints based on elastic Earth models are accurate in most areas but can be in error by an amount several times the global barystatic value (10.8 cm here) in glaciated regions with shallow mantle viscosity that is several orders of magnitude less than that of typical global average values. Furthermore, the low mantle viscosity in these regions amplifies the GIA signal associated with glacier changes during the 20th century, resulting in this signal being an important (even dominant) contributor to the modelled RSL change over the 21st century.

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References

- Austermann, J., Mitrovica, J.X., Latychev, K., and Milne, G.A.: Barbados-based estimate of ice volume at Last Glacial
Maximum affected by subducted plate, *Nat. Geosci.*, 6, 553, 2013.
- 335 Brocher, T.M., Parsons T., Tréhu A.M., Crosson, R.S., Snelson C.M., Fisher M.A.: Seismic evidence for widespread
serpentinized forearc upper mantle along the Cascadia Margin, *Geology*, 31, pp. 267-270, 2003.
- Church, J.A., Clark, P.U., Cazenave, A., Gregory, J.M., Jevrejeva, S., Levermann, A., Merrifield, M.A, Milne, G.A., Nerem,
R. S., Nunn, P.D., Payne, A.J. Pfeffer, W.T., Stammer, D., Unnikrishnan, A.S.: Sea Level Change. In *Climate Change
2013: The Physical Science Basis. Contribution of Working Group I to the Fifth Assessment Report of the
340 Intergovernmental Panel on Climate Change*, edited by T.F. Stocker, D. Qin, G.-K. Plattner, M. Tignor, S.K. Allen, J.
Boschung, A. Nauels, Y. Xia, V. Bex, and P.M. Midgley, 1137–1216. Cambridge, United Kingdom; New York, NY,
USA: Cambridge University Press, 2013.
- Clark, J.A., Farrell, W.E., and Peltier, W.R.: 1978. Global changes in postglacial sea level: a numerical calculation, *Quat. Res.*,
9, 265–287, 1978.
- 345 Dzierwonski, A.M. and Anderson, D.L.: Preliminary reference Earth model, *Phys. Earth Planet. Int.*, 25, 297–356, 1981.
- Farrell, W.E. and Clark, J.A.: On Postglacial Sea Level, *Geophys. J. Int.* 46, 647-667, 1976.
- Goldberg, S.L., Lau, H.C.P., Mitrovica, J.X., and Latychev, K.: The timing of the Black Sea flood event: Insights from
modeling of glacial isostatic adjustment, *Earth Planet. Sci. Lett.*, 452, 178-184, 2016.
- Gregory, J.M., Griffies, S.M., Hughes, C.W., Lowe, J.A., Church, J.A., Fukimori, I., Gomez, N., Kopp, R.E., Landerer, F., Le
350 Cozannet, G., Ponte, R.M., Stammer, D., Tamiseia, M.E., van de Wal, R.S.W.: Concepts and Terminology for Sea Level:
Mean, Variability and Change, Both Local and Global, *Surv. Geophys.*, 40, 1251-1289, 2019.
- Griggs, G.: *Coasts in Crisis: A Global Challenge*, Univ of California Press, 2017.
- Hay, C., Lau, H.C.P., Gomez, N., Austermann, J., Powell, E., Mitrovica, J.X., Latychev, K., and Wiens, D.A.: Sea level
fingerprints in a region of complex Earth structure: The case of WAIS, *J. Climate*, 30, 1881–1892, 2017.
- 355 Hu, Y., and Freymueller, J. T.: Geodetic observations of time-variable glacial isostatic adjustment in Southeast Alaska and its
implications for Earth rheology. *J. Geophys. Res. – Solid*, 124, 9870–9889, <https://doi.org/10.1029/2018JB017028>, 2019.
- Huss, M. and Farinotti, D.: Distributed ice thickness and volume of all glaciers around the globe, *J. Geophys. Res. – Earth*,
117, F04010, doi:10.1029/2012JF002523, 2012.

- Huss, M. and Hock, R.: A new model for global glacier change and sea-level rise, *Front. Earth Sci.*, 3:54.doi: 10.3389/feart.2015.00054, 2015.
- Ivins, E., James, T.: Simple models for late Holocene and present-day Patagonian glacier fluctuations and predictions of a geodetically detectable isostatic response. *Geophys. J. Int.*, 138, 601–624, 1999.
- Ivins, E., James, T.: Bedrock response to Llanquihue Holocene and present-day glaciation in southernmost South America. *Geophys. Res. Lett.*, 31, L24613, <http://dx.doi.org/10.1029/2004GL021500>, 2004.
- James, T.S., Gowan, E.J., Wada, I., and Wang, K.: Viscosity of the Asthenosphere from Glacial Isostatic Adjustment and Subduction Dynamics at the Northern Cascadia Subduction Zone, British Columbia, Canada, *J. Geophys. Res. – Solid*, 114, B04405, doi:10.1029/2008JB006077, 2009.
- Jin, S., Zhang, T.Y., and Zou, F.: Glacial Density and GIA in Alaska Estimated from ICESat, GPS and GRACE Measurements, *J. Geophys. Res. – Earth*, 122, 76–90, 2017.
- Kendall, R.A., Mitrovica, J.X., and Milne, G.A.: On Post-Glacial Sea Level–II. Numerical Formulation and Comparative Results on Spherically Symmetric Models, *Geophys. J. Int.*, 161, 679–706, 2005.
- Klemann, V., Ivins, E., Martinec, Z., Wolf, D.: Models of active glacial isostasy roofing warm subduction: case of the South Patagonian Ice field. *J. Geophys. Res.* 112, B09405, <http://dx.doi.org/10.1029/2006JB004818>, 2007.
- Kopp, R. E., Horton, R. M., Little, C. M., Mitrovica, J. X., Oppenheimer, M., Rasmussen, D. J., et al.: Probabilistic 21st and 22nd century sea-level projections at a global network of tide gauge sites. *Earth’s Futur.* 2, 383–406, doi:10.1002/2014EF000239, 2014.
- Lambeck, K., Rouby, H., Purcell, A., Sun, Y., and Sambridge, M.: Sea level and global ice volumes from the Last Glacial Maximum to the Holocene. *Proc. Natl. Acad. Sci.*, 201411762, doi:10.1073/pnas.1411762111, 2014.
- Lange, H., Casassa, G., Ivins, E.R., Schröder, L., Fritsche, M., Richter, A., Groh, A., Dietrich, R.: Observed crustal uplift near the Southern Patagonian Icefield constrains improved viscoelastic Earth models. *Geophys. Res. Lett.*, 41, <http://dx.doi.org/10.1002/2013GL058419>, 2014.
- Larour, E., Ivins, E. R., and Adhikari, S.: Should coastal planners have concern over where land ice is melting? *Sci. Adv.* 3, e1700537, 2017.
- Larsen, C.F., Motyka, R.J., Freymueller, J.T., Echelmeyer, K.A., Ivins, E.R.: Rapid viscoelastic uplift in southeast Alaska caused by post-little Ice Age glacial retreat. *Earth Planet. Sci. Lett.*, 237, 548–560, <http://dx.doi.org/10.1016/j.epsl.2005.06.032>, 2005.
- Latychev, K., Mitrovica, J.X., Tromp, J., Tamisiea, M.E., Komatitsch, D. and Christara, C.C.: Glacial Isostatic Adjustment on 3-D Earth Models: A Finite-Volume Formulation, *Geophys. J. Int.*, 161, 421–44, 2005.
- Marzeion, B., Leclercq, P.W., Cogley, J.C. and Jarosch, A.H.: Global reconstructions of glacier mass change during the 20th century are consistent. *Cryosphere*, 2399–2404, 2015.
- Milne, G.A. and Mitrovica, J.X.: Postglacial Sea-Level Change on a Rotating Earth, *Geophys. J. Int.*, 133, 1–19, 1998.

- Milne, G., Gehrels, W., Hughes, C., and Tamisiea, M.E.: Identifying the causes of sea-level change. *Nat. Geosci.*, 2, 471–478, <https://doi.org/10.1038/ngeo544>, 2009.
- 395 Mitrovica, J.X., Wahr, J., Matsuyama, I., and Paulson, A.: The Rotational Stability of an Ice-Age Earth, *Geophys. J. Int.*, 161, 491–506, 2005.
- Mitrovica, J.X., Gomez, N., Morrow, E., Hay, C., Latychev, K., and Tamisiea, M.E.: On the Robustness of Predictions of Sea Level Fingerprints, *Geophys. J. Int.*, 187, 729–42, 2011.
- Mitrovica, J.X. and Milne, G.A.: On post-glacial sea level, I: General theory, *Geophys. J. Int.*, 154, 253–267, 2003.
- Mitrovica, J.X. and Forte, A.M.: A new inference of mantle viscosity based upon joint inversion of convection and glacial
400 isostatic adjustment data, *Earth Planet. Sci. Lett.*, 225, 177–189, 2004.
- Mitrovica, J.X., Tamisiea, M.E., Davis, J.L., and Milne, G.A.: Polar ice mass variations and the geometry of global sea level change, *Nature*, 409, 1026–1029, 2001.
- Oppenheimer, M., B.C. Glavovic, J. Hinkel, R. van de Wal, A.K. Magnan, A. Abd-Elgawad, R. Cai, M. Cifuentes-Jara, R.M. DeConto, T. Ghosh, J. Hay, F. Isla, B. Marzeion, B. Meyssignac, and Z. Sebesvari, 2019: Sea Level Rise and Implications
405 for Low-Lying Islands, Coasts and Communities. In: IPCC Special Report on the Ocean and Cryosphere in a Changing Climate [H.-O. Pörtner, D.C. Roberts, V. Masson-Delmotte, P. Zhai, M. Tignor, E. Poloczanska, K. Mintenbeck, A. Alegría, M. Nicolai, A. Okem, J. Petzold, B. Rama, N.M. Weyer (eds.)]. In press.
- Palmer, M. D., Gregory, J. M., Bagge, M., Calvert, D., Hagedoorn, J. M., Howard, T., et al. (2020). Exploring the drivers of global and local sea-level change over the 21st century and beyond. *Earth's Future*, 8, e2019EF001413.
410 <https://doi.org/10.1029/2019EF001413>
- Peltier, W.R.: The impulse response of a Maxwell Earth, *Rev. Geophys.*, 12, 649–669, 1974.
- Peltier, W.R.: Global Glacial Isostasy and the Surface of the Ice-Age Earth: The ICE-5G (VM2) Model and GRACE, *Ann. Rev. Earth Planet. Sci.*, 32, 111–149, 2004.
- Pfeffer, W., Arendt, A., Bliss, A., Bolch, T., Cogley, J., Gardner, A., . . . Sharp, M.: The Randolph Glacier Inventory: A
415 globally complete inventory of glaciers. *J. Glaciol.*, 60(221), 537–552, doi:10.3189/2014JoG13J176, 2014.
- Pollitz, F.F.: Transient rheology of the upper mantle beneath central Alaska inferred from the crustal velocity field following the 2002 Denali earthquake, *J. Geophys. Res.*, B08407, doi:10.1029/2005JB003672, 2005.
- Richter, A., Ivins, E., Lange, H., Mendoza, L., Schröder, L., Hormaechea, J.L., Casassa, G., Marderwald, E., Fritsche, M., Perdomo, R., Horwath, M. and Deitrich, R.: Crustal Deformation Across the Southern Patagonian Icefield Observed by
420 GNSS, *Earth Planet. Sci. Lett.*, 452, 206–215, 2016.
- Sato, T., Larsen, C.F., Miura, S. Ohta, Y., Fujimoto, H., Sun, W., Motyka, R.J., and Freymuller, J.T.: Re-evaluation of the viscoelastic and elastic responses to the past and present-day ice changes in Southeast Alaska, *Tectonophysics*, 511, 79–88, doi:10.1016/j.tecto.2010.05.009, 2011.
- Shepherd, A., Ivins, E., Rignot, E. et al. Mass balance of the Antarctic Ice Sheet from 1992 to 2017. *Nature* 558, 219–222,
425 <https://doi.org/10.1038/s41586-018-0179-y>, 2018.

- Shepherd, A., Ivins, E., Rignot, E. et al. Mass balance of the Greenland Ice Sheet from 1992 to 2018. *Nature* 579, 233–239, <https://doi.org/10.1038/s41586-019-1855-2>, 2020.
- Slangen, A. B. A., Katsman, C. A., van de Wal, R. S. W., Vermeersen, L. L. A., and Riva, R. E. M.: Towards regional projections of twenty-first century sea-level change based on IPCC SRES scenarios, *Clim. Dyn.*, 38, 1191–1209. doi:10.1007/s00382-011-1057-6, 2012.
- Slangen, A. B. A., Carson, M., Katsman, C. A., van de Wal, R. S. W., Köhl, A., Vermeersen, L. L. A., et al.: Projecting twenty-first century regional sea-level changes, *Clim. Change*, 124, 317–332, doi:10.1007/s10584-014-1080-9, 2014.
- Spada, G.: Glacial Isostatic Adjustment and Contemporary Sea Level Rise: An Overview, *Surv. Geophys.*, 38, 153–185, <https://doi.org/10.1007/s10712-016-9379-x>, 2017.
- van der Wal, W., Barnhoorn, A., Stocchi, P., Gradmann, S., Wu, P., Drury, M., and Vermeersen, B.: Glacial isostatic adjustment model with composite 3-D Earth rheology for Fennoscandia, *Geophys. J. Int.*, 194, 61–77, <https://doi.org/10.1093/gji/ggt099>, 2013.
- Vaughan, D.G., J.C. Comiso, I. Allison, J. Carrasco, G. Kaser, R. Kwok, P. Mote, T. Murray, F. Paul, J. Ren, E. Rignot, O. Solomina, K. Steffen and T. Zhang, 2013: Observations: Cryosphere. In: *Climate Change 2013: The Physical Science Basis. Contribution of Working Group I to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change* [Stocker, T.F., D. Qin, G.-K. Plattner, M. Tignor, S.K. Allen, J. Boschung, A. Nauels, Y. Xia, V. Bex and P.M. Midgley (eds.)]. Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.
- Whitehouse, P.L.: Glacial isostatic adjustment modelling: historical perspectives, recent advances, and future directions, *Earth Surf. Dynam.*, 6, 401–429, <https://doi.org/10.5194/esurf-6-401-2018>, 2018.
- Whitehouse, P.L., Gomez, N., King, M.A., and Wiens, D.A.: Solid Earth Change and the Evolution of the Antarctic Ice Sheet, *Nat. Comm.*, 10, 1–14, 2019.
- Wouters, B., Gardner, A. S., and Moholdt, G.: Global Glacier Mass Loss During the GRACE Satellite Mission (2002-2016), *Front. Earth Sci.*, 7, doi:10.3389/feart.2019.00096, 2019.
- Wu, P. and Wang, H.: Postglacial isostatic adjustment in a selfgravitating spherical Earth with power-law rheology, *J. Geodyn.*, 46, 118–130, 2008.
- Yousefi, M., Milne, G.A., and Latychev, K.: Glacial isostatic adjustment of the pacific coast of North America: The Influence of lateral earth structure, *Geophys. J. Int.*, <https://doi.org/10.1093/gji/ggab053>, 2021.
- Yousefi, M., Milne, G.A., Love, R., and Tarasov, L.: Glacial Isostatic Adjustment Along the Pacific Coast of Central North America, *Quat. Sci. Rev.*, 193, 288–311.
- Yuen, D. A., Sabadini, R. C. A., Gasperini, P., and Boschi, E.: On Transient Rheology and Glacial Isostasy, *J. Geophys. Res.*, 91, 1420–1438, <https://doi.org/10.1029/JB091iB11p11420>, 1986.
- Zemp, M., Huss, M., Thibert, E., Eckert, N., McNabb, R., Huber, J., et al.: Global glacier mass changes and their contributions to sea-level rise from 1961 to 2016, *Nature*, 568, 382–386. doi:10.1038/s41586-019-1071-0, 2019.

Zemp, M., Frey, H., Gärtner-Roer, I., Nussbaumer, S.U., Hoelzle, M., Paul, F., Haeberli, W., et al.: Historically Unprecedented
460 Global Glacier Decline in the Early 21st Century, J. Glaciol., 61, 745–762, 2015.

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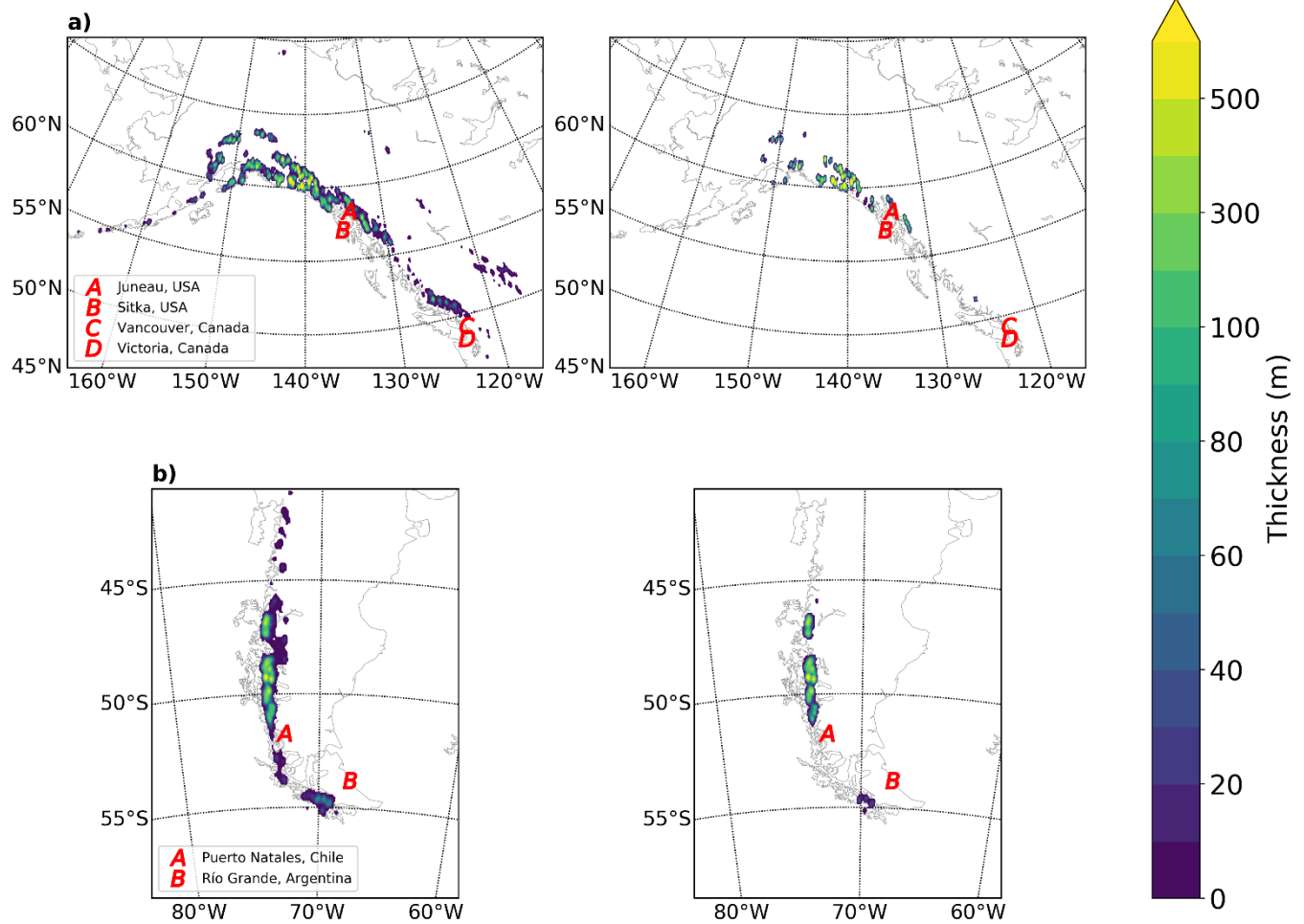


Figure 1. Estimated spatial distribution in ice thickness in RGI regions 1 & 2 (a) and 17 (b) at the beginning (2010 CE, left) and end (2100 CE, right) of the time period considered. The locations of population centres for which relative sea-level curves are calculated (see Figs 5 & 6) are indicated by the red letters.

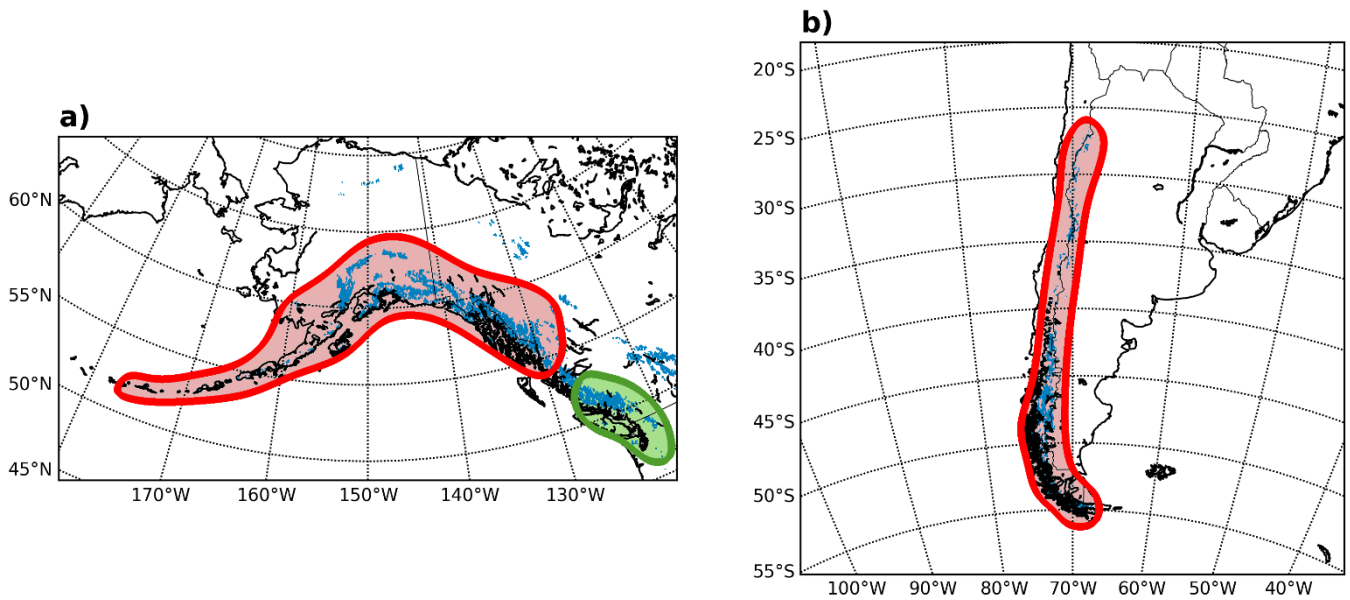


Figure 2. Surface lateral extent of the regions for which the underlying Earth structure (lithospheric thickness and sub-lithosphere viscosity profile) deviate from the adopted global values: (a) shows the extent for RGI regions 1 (red) and 2 (green) while frame (b) shows the extent for region 17.

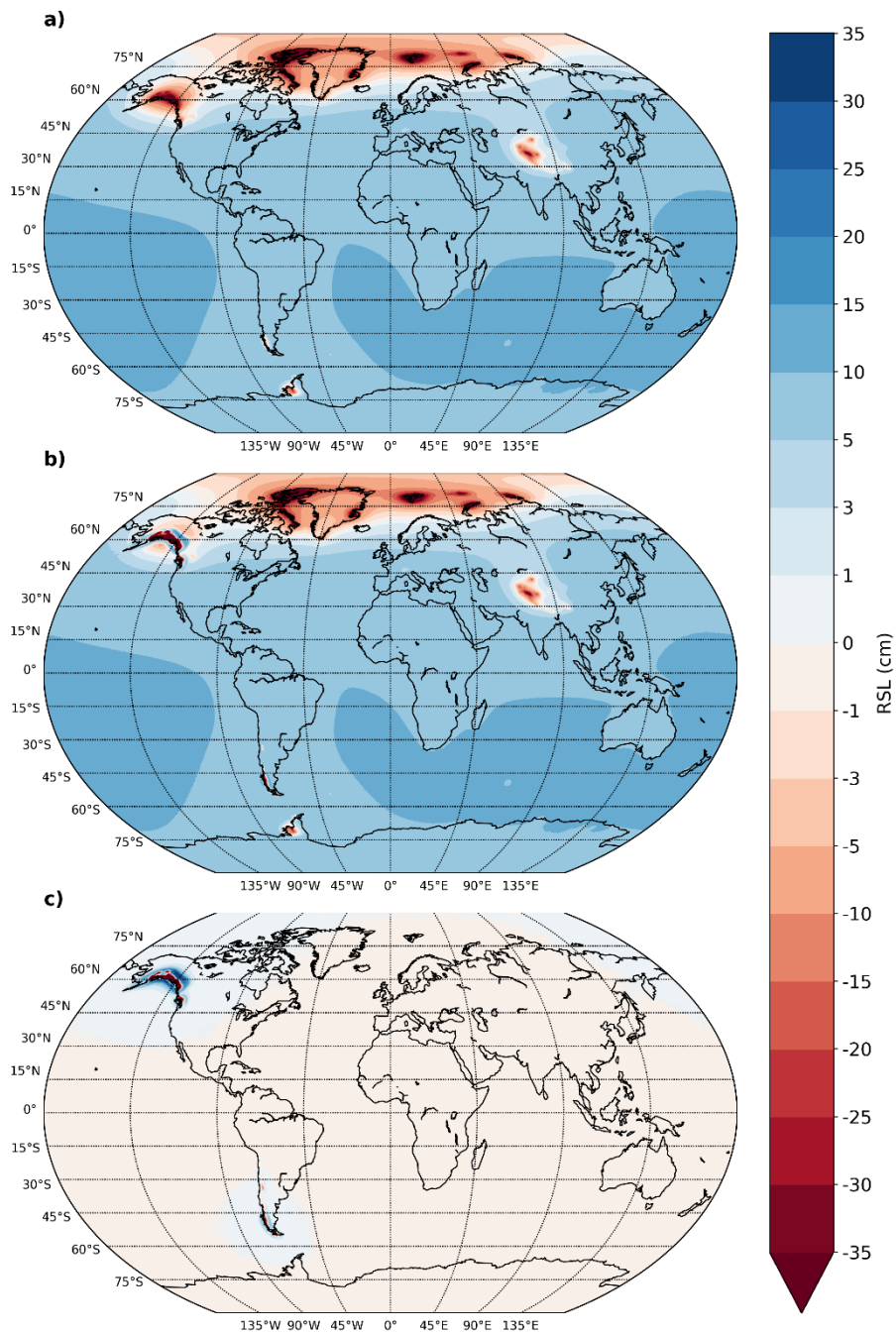


Figure 3. Calculated sea-level fingerprints for estimated changes in global glacier distribution from 2010 to 2100 CE for: (a) a 1-D (spherically symmetric) elastic Earth model and (b) a 3-D viscoelastic Earth model with low viscosity regions located as indicated in Fig. 2. (c) The difference between the viscoelastic and elastic results (i.e. (b) minus (a)).

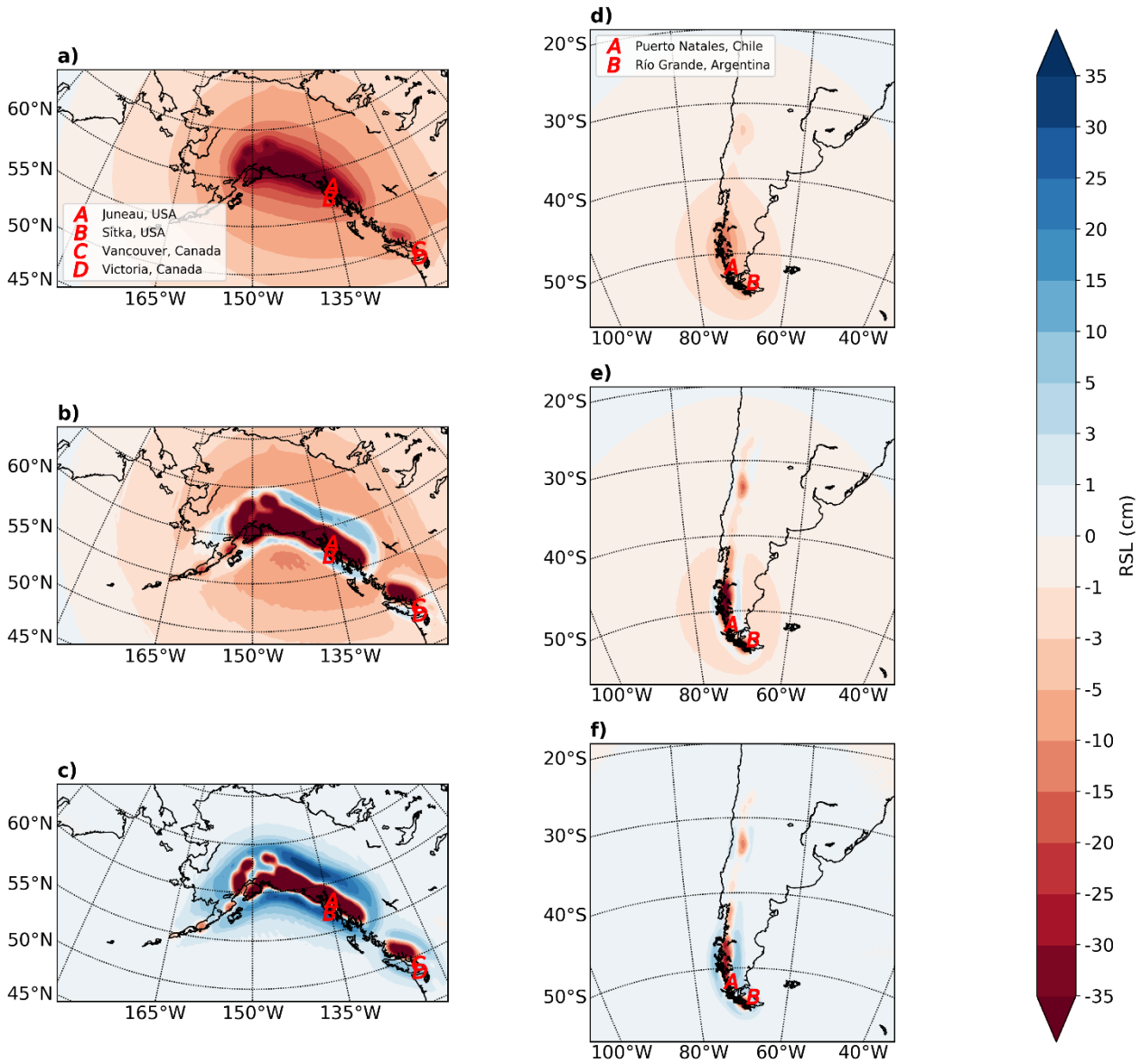


Figure 4. Calculated sea-level fingerprints for estimated changes in regional glacier distributions for RGI regions 1 & 2 (left) and region 17 (right). The different frames show results for: (a & d) a 1-D (spherically symmetric) elastic Earth model; (b & e), a 3-D viscoelastic Earth model with low viscosity regions located as indicated in Fig. 2. The results in (c) and (f) show the differences between the elastic and viscoelastic results, respectively (i.e. (b) minus (a) and (d) minus (e)). Note that these results do not include the sea-level signal associated with ice mass changes from outside of the RGI regions shown. The locations of population centres for which relative sea-level curves are calculated (see Figs 5 & 6) are indicated by the red letters.

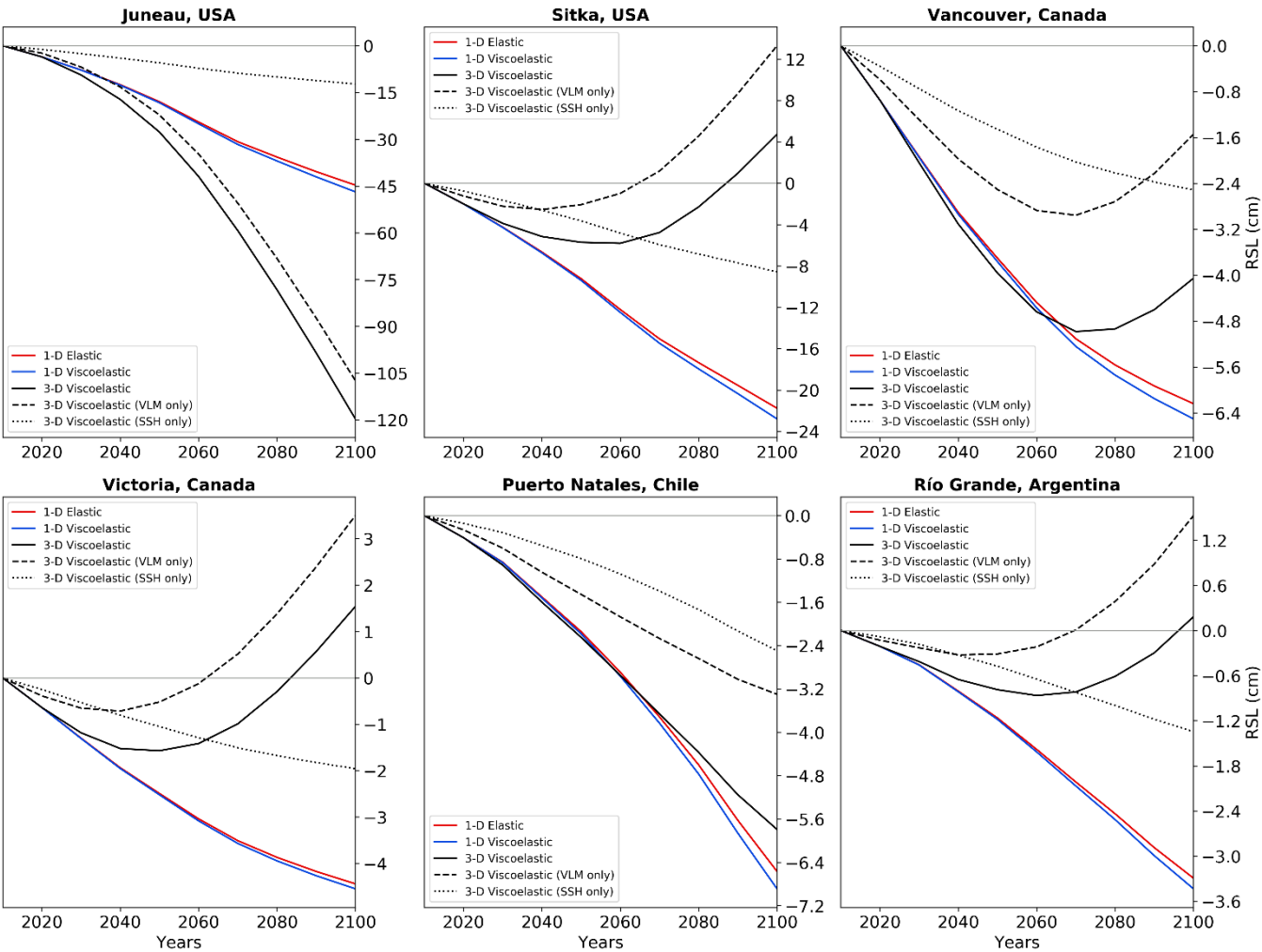


Figure 5. Calculated RSL curves showing the time variation of the spatial patterns in Fig. 4 at the locations indicated in Figs 1 and 4. The results for a 1-D viscoelastic model using our reference global viscosity profile (Section 2.2) are also included. The contributions of vertical land motion (VLM) and sea-surface height (SSH) change to RSL are also shown for the 3-D viscoelastic Earth model. As for Fig. 4, these results do not include the sea-level signal associated with ice mass changes from outside the respective RGI regions.

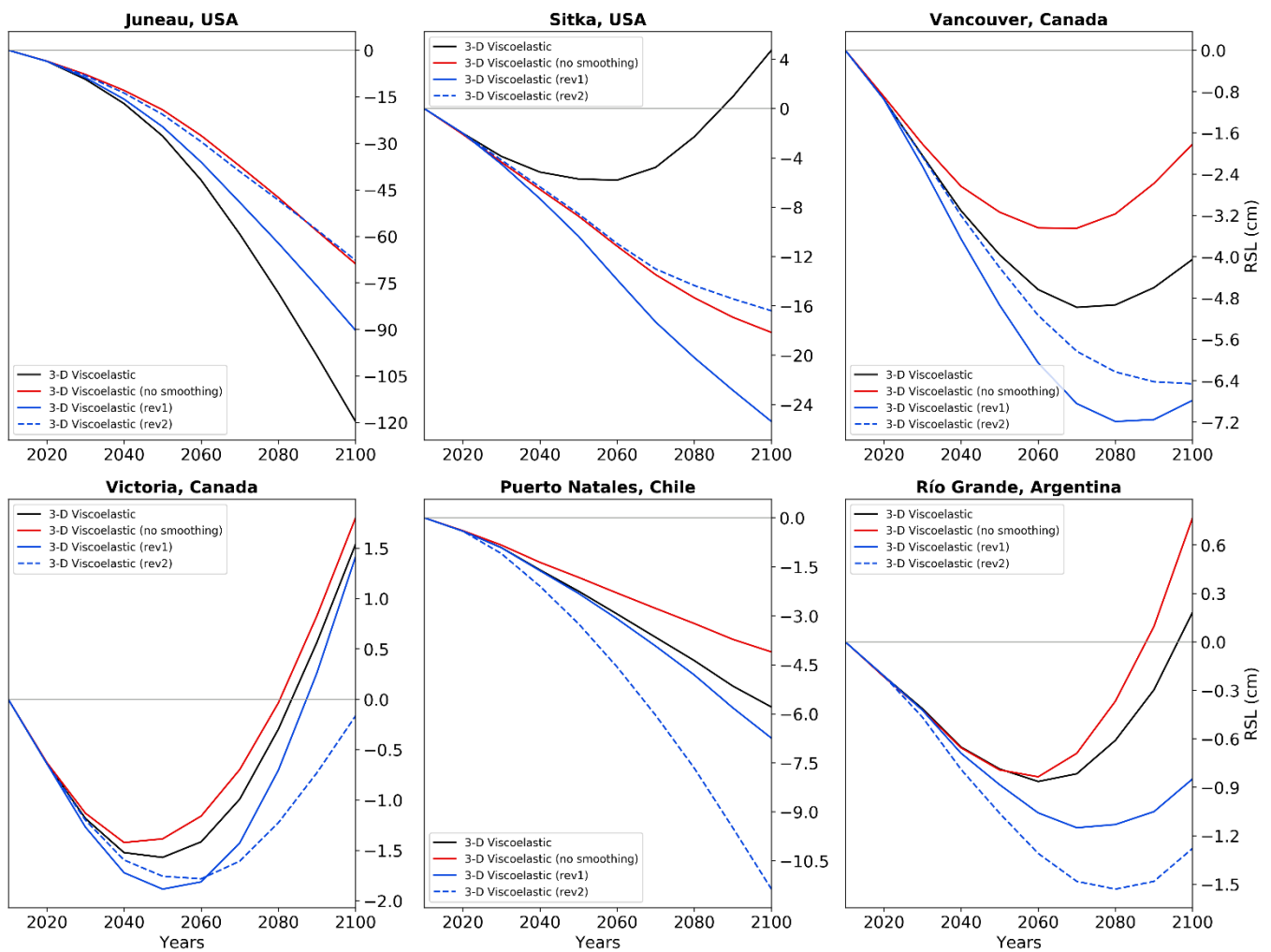


Figure 6. Calculated RSL curves showing the sensitivity of model output to changes in input parameters. The 3-D viscoelastic results (black lines) are calculated using the same model parameters used to determine the results shown in Figures 4 and 5. The coloured lines in each frame show the influence of changing the regional ice model (red line) or two different aspects of the regional Earth viscosity model (blue lines). As for Fig. 5, these results do not include the sea-level signal associated with ice mass changes from outside the respective RGI regions.