

A Taxonomy of Upper-Mantle Stratification in the US

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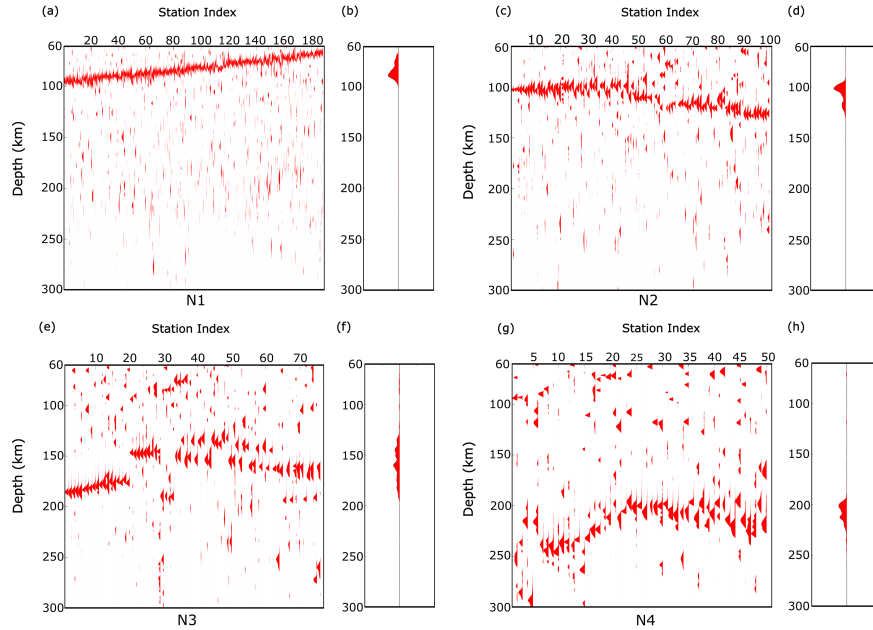
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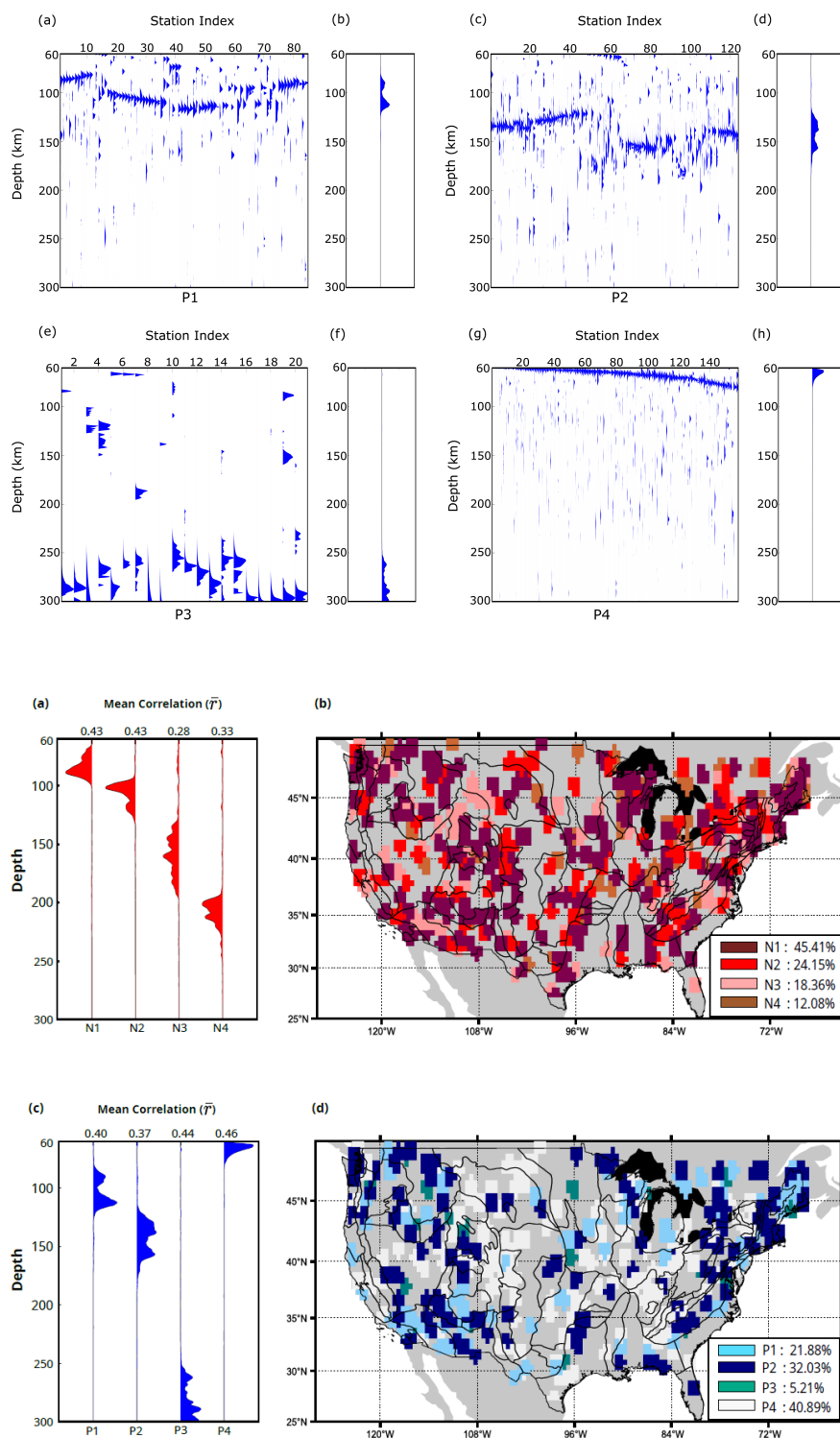
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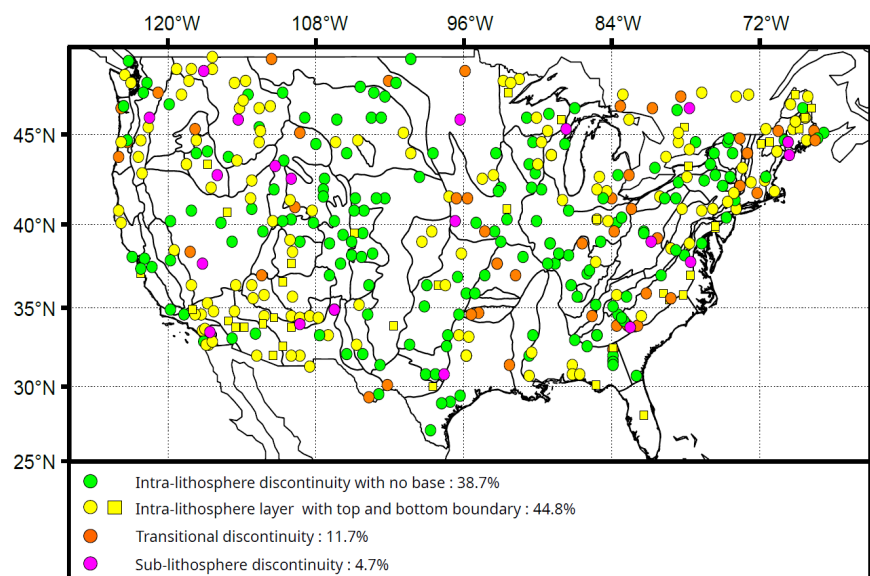
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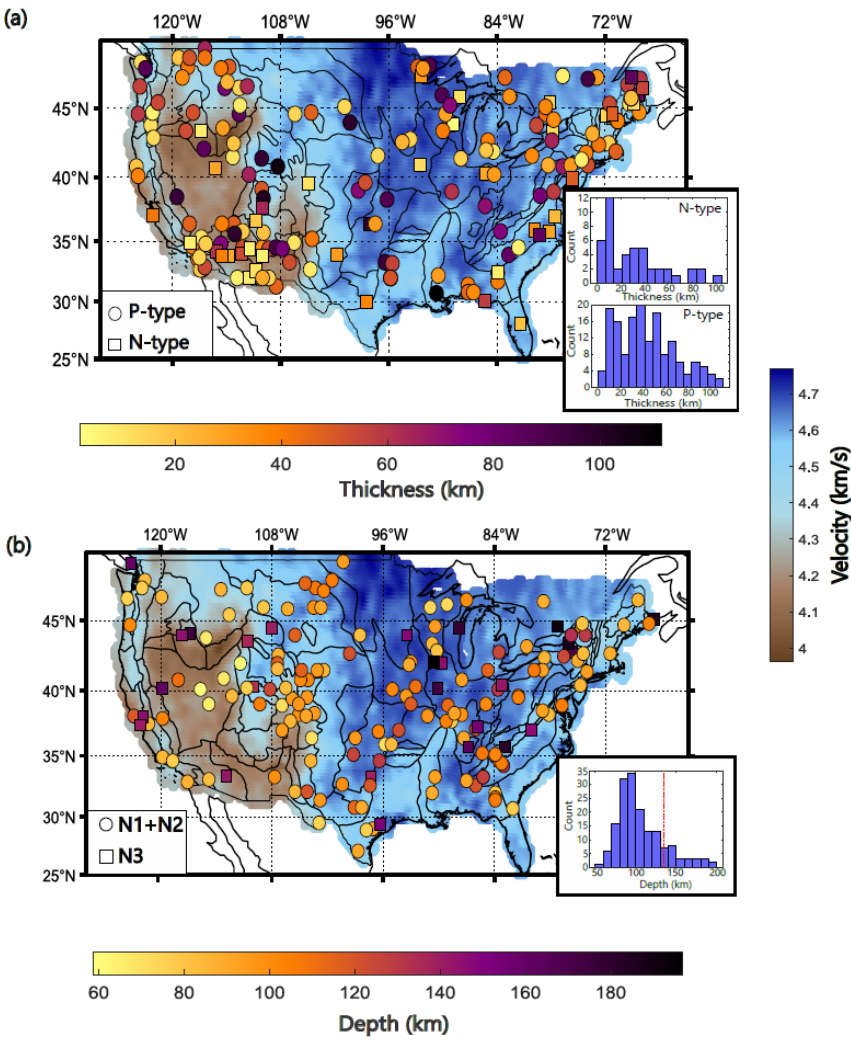
Abstract

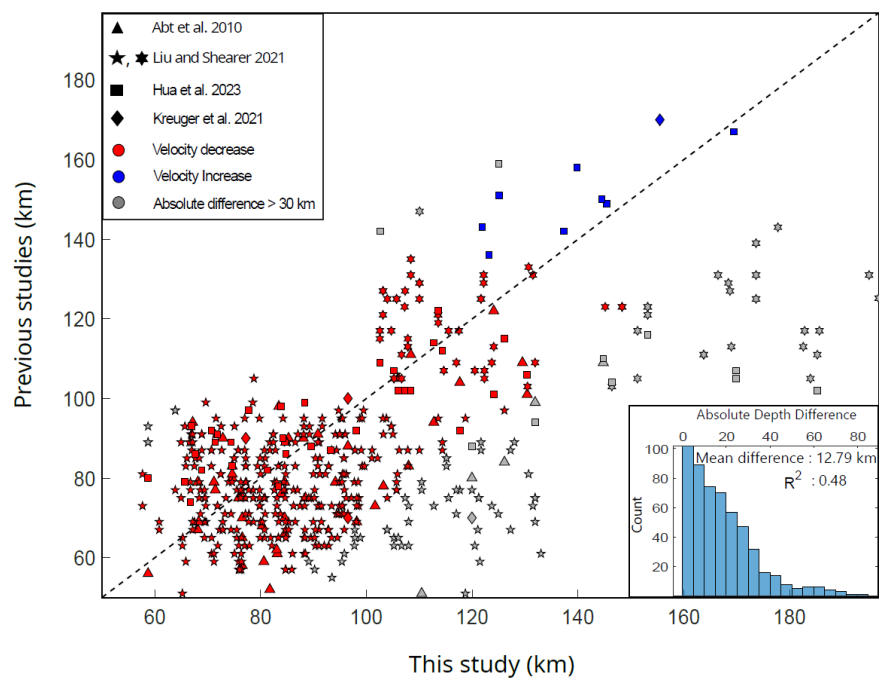
The investigation of upper mantle structure beneath the US has revealed a growing diversity of discontinuities within, across, and underneath the sub-continental lithosphere. As the complexity and variability of these detected discontinuities increase - e.g., velocity increase/decrease, number of layers and depth - it is hard to judge which constraints are robust and which explanatory models generalize to the largest set of constraints. Much work has been done to image discontinuities of interest using S-waves that convert to P-waves (or reflect back as S-waves). A higher resolution method using P-to-S scattered waves is preferred but often obscured by multiply reflected waves trapped in a shallow layer, limiting the visibility of deeper boundaries. Here, we address the interference problem and re-evaluate upper mantle stratification using filtered Ps-RFs interpreted using unsupervised machine-learning. Robust insight into upper mantle layering is facilitated with CRISP-RF: Clean Receiver-Function Imaging using Sparse Radon Filters. Subsequent sequencing and clustering of the polarity-filtered Ps-RFs into distinct depth-based clusters, clearly distinguishes three discontinuity types: (1) intra-lithosphere discontinuity with no base, (2) intra-lithosphere discontinuity with a top and bottom boundary (3) transitional and sub-lithosphere discontinuities. Our findings contribute a more nuanced understanding of mantle discontinuities, offering new perspectives on the nature of upper mantle layering beneath continents.

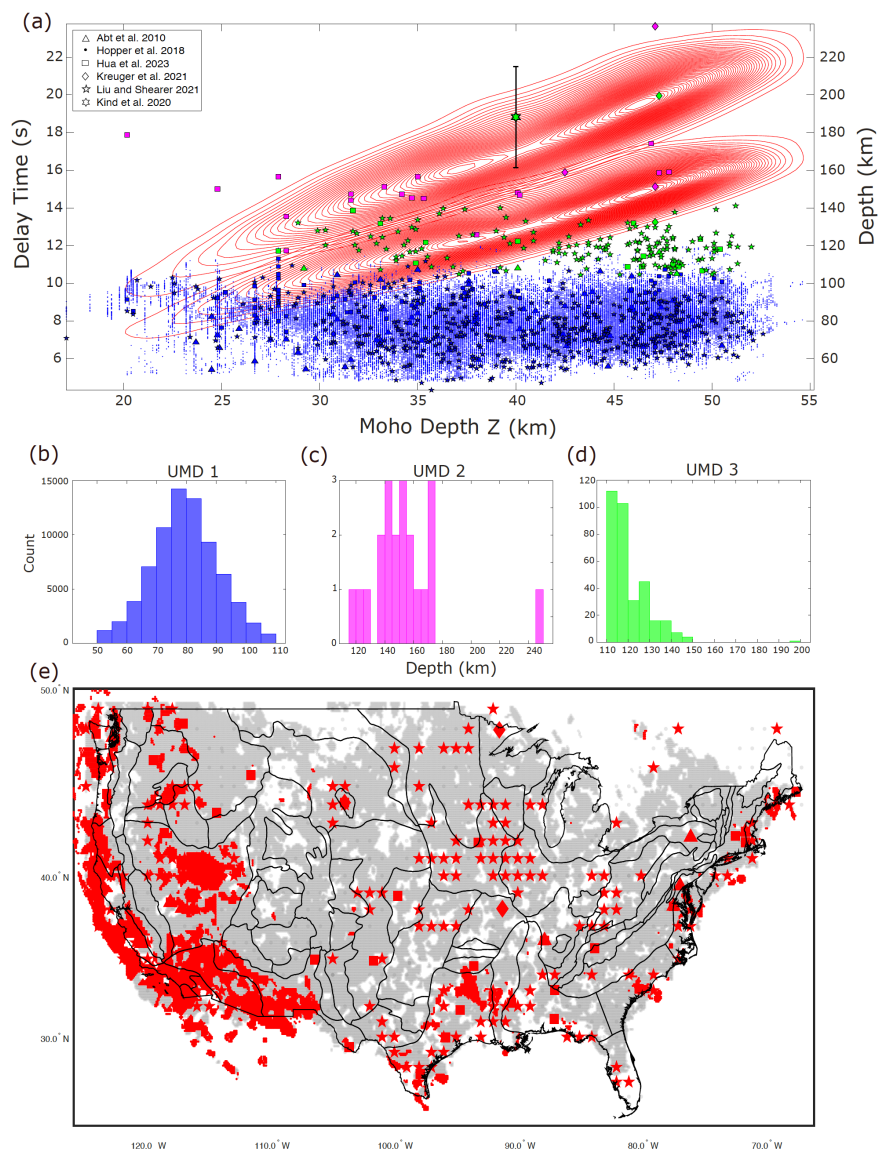


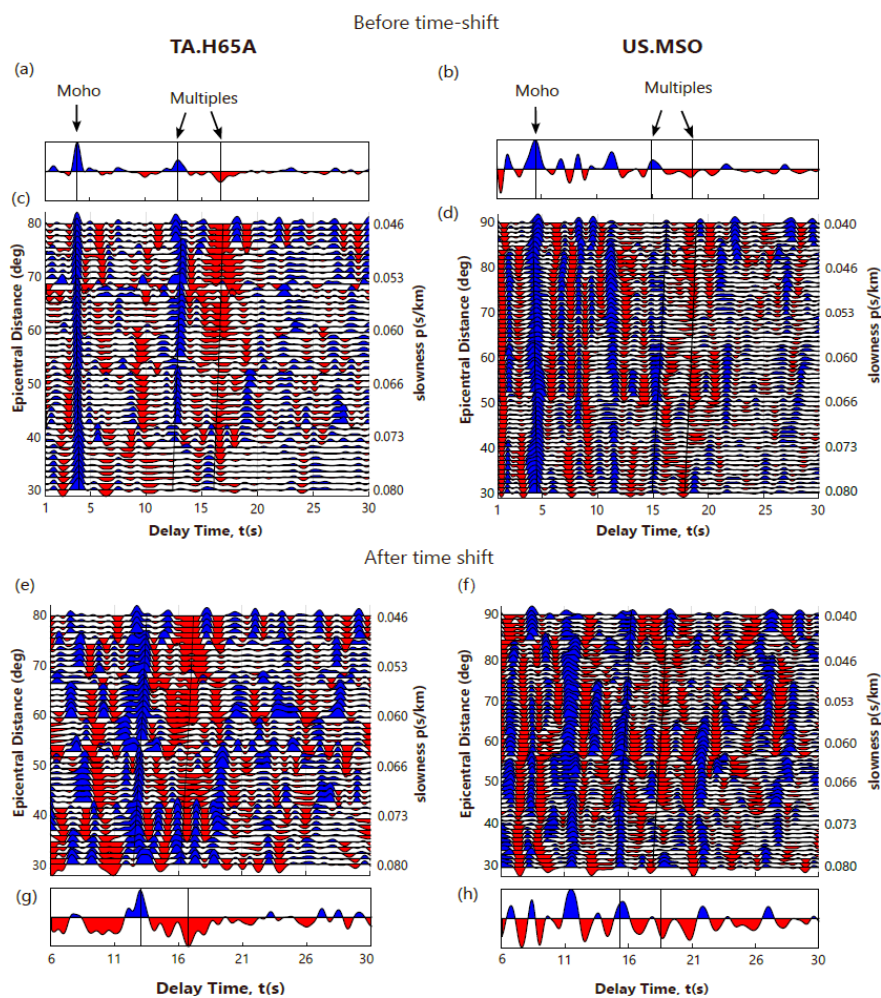
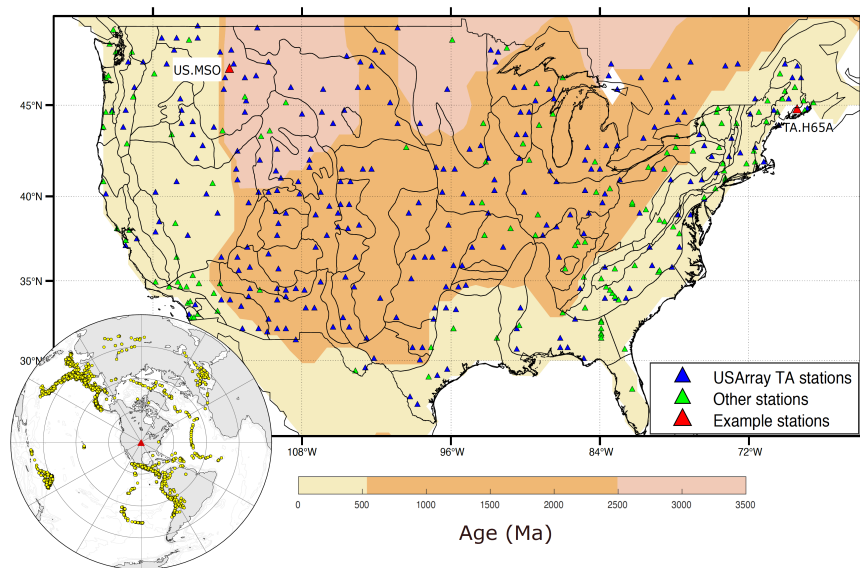


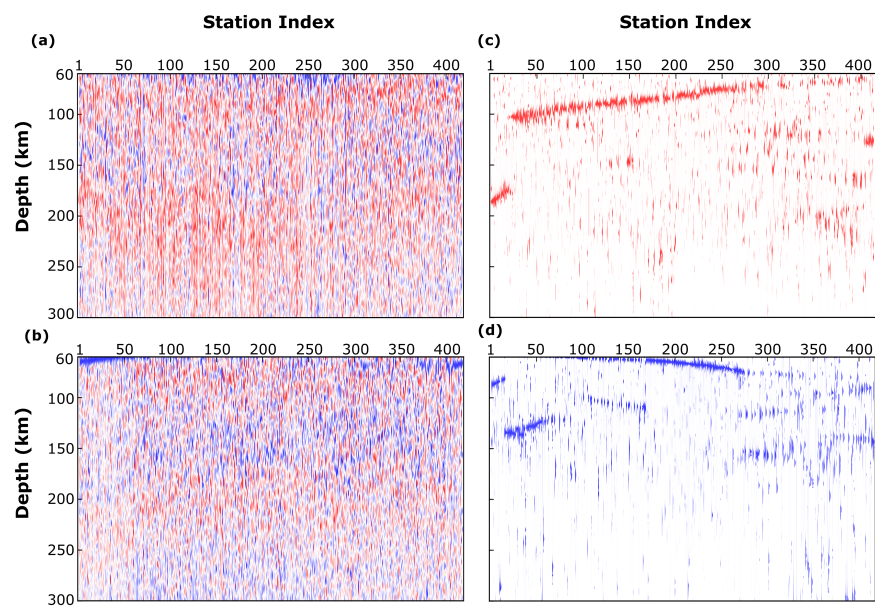
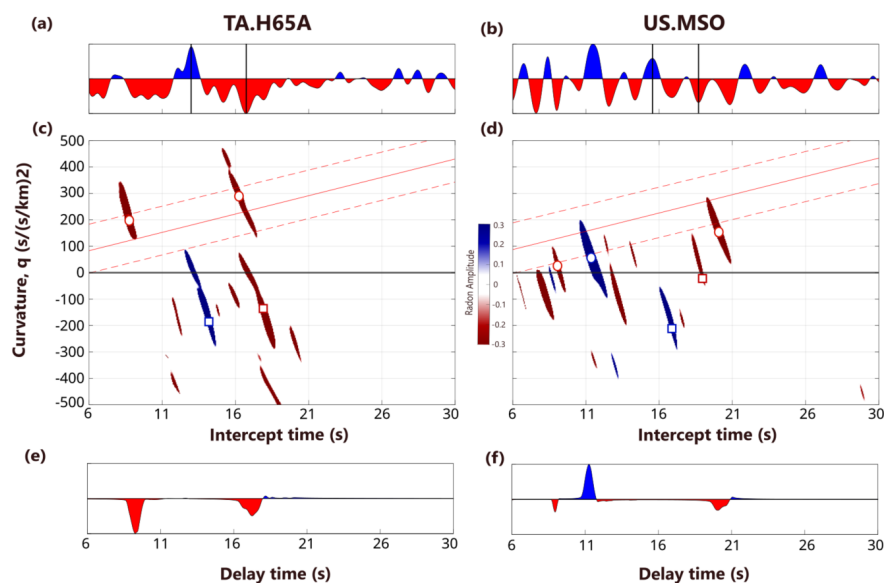












A Taxonomy of Upper-Mantle Stratification in the US

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Key Points:

- Upper mantle stratification is constrained using CRISP-RF and machine learning
- Stratification is classified into intra-lithospheric, transitional and sub-lithospheric
- High-resolution constraints allow the evaluation of different causal models.

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Abstract

The investigation of upper mantle structure beneath the US has revealed a growing diversity of discontinuities within, across, and underneath the sub-continental lithosphere. As the complexity and variability of these detected discontinuities increase - e.g., velocity increase/decrease, number of layers and depth - it is hard to judge which constraints are robust and which explanatory models generalize to the largest set of constraints. Much work has been done to image discontinuities of interest using S-waves that convert to P-waves (or reflect back as S-waves). A higher resolution method using P-to-S scattered waves is preferred but often obscured by multiply reflected waves trapped in a shallow layer, limiting the visibility of deeper boundaries. Here, we address the interference problem and re-evaluate upper mantle stratification using filtered Ps-RFs interpreted using unsupervised machine-learning. Robust insight into upper mantle layering is facilitated with CRISP-RF: Clean Receiver-Function Imaging using Sparse Radon Filters. Subsequent sequencing and clustering of the polarity-filtered Ps-RFs into distinct depth-based clusters, clearly distinguishes three discontinuity types: (1) intra-lithosphere discontinuity with no base, (2) intra-lithosphere discontinuity with a top and bottom boundary (3) transitional and sub-lithosphere discontinuities. Our findings contribute a more nuanced understanding of mantle discontinuities, offering new perspectives on the nature of upper mantle layering beneath continents.

Plain Language Summary

Early investigations of the mantle rocks in the US indicate intricate layering. However, uncertainties remain regarding the origins of these structures. Here, we re-examine rock stratification using a fine-resolution approach. We use short waves that improve our ability to identify the depth of thin layers and sharp transitions in rock properties. Until now, these methods haven't been used due to interference with waves trapped in the near-surface layers. We address this problem with machine learning and the CRISP-RF (Clean Receiver Function Images Using Sparse Radon-Filters) method. CRISP-RF filters out the waves trapped in the crust and machine learning reveals spatially coherent patterns. We find evidence for three main classes of rock layering: (1) sharp transitions with no top or bottom boundary (2) a thin layer with a clear top and bottom boundary, and (3) a rare transition across and below a depth where the rocks are expected to transition from stiff to weaker properties. Our approach enables the test of hypotheses about the origins of upper mantle layering beneath continents.

1 Introduction

Seismological constraints on upper mantle layering beneath the contiguous US have revealed evidence for negative and positive velocity discontinuities hinting at a complex layering beneath the continental US (Abt et al., 2010a; L. Liu & Gao, 2018; T. Liu & Shearer, n.d.; Hopper & Fischer, 2018b; Kind & Yuan, 2018b; Hua et al., 2023). The mid-lithosphere discontinuities (MLDs) are the most widely detected and are defined by one or more negative velocity gradients confined to depths of 60-170 km (Abt et al., 2010a; T. Liu & Shearer, n.d.; Kind & Yuan, 2018b; Krueger et al., 2021b; Hopper & Fischer, 2018a). Beneath this discontinuity, within a depth range of 120-220 km, recent, but sporadic detections of positive velocity gradients (PVGs) have been reported and interpreted as the base of the MLDs (Hua et al., 2023; Luo, Long, Karabinos, & others, 2021). Slightly deeper still, underneath Proterozoic terranes, between 220-350 km depth, a negative velocity discontinuity has been detected and attributed to the base of the lithosphere (Tauzin et al., 2013). These constraints provide improved illumination on the complex layering within the upper mantle beneath the contiguous US; however the interpretations regarding their origins and causes, e.g., melt, anisotropy, relics of subduction-related hydration, elastically accommodated grain boundary sliding and metasomatism, are still vigorously debated, confounding a unified model (Karato,

2012; Ford et al., 2015; Wirth & Long, 2014b; Selway et al., 2015b; Rader et al., 2015; Saha et al., 2021).

The most common techniques for imaging the upper mantle discontinuities are long-period body-wave methods: (1) Sp converted waves (Hopper & Fischer, 2018b; Abt et al., 2010a; Kind & Yuan, 2018b; Chen et al., 2018; Krueger et al., 2021a) and (2) the top-side S reflections (T. Liu & Shearer, n.d.; Shearer & Buehler, 2019). As the data-volume has improved, the earliest observations using Sp converted waves (Abt et al., 2010a) have been supplemented by continent-wide studies (Hopper & Fischer, 2018b; Kind et al., 2012; Kumar, Yuan, et al., 2012; Kumar, Kind, et al., 2012) with improved signal-to-noise (Krueger et al., 2021a; Hua et al., 2023; Kind et al., 2020a) and better depth resolution using S-wave reflections (L. Liu & Gao, 2018; Shearer & Buehler, 2019). Both techniques have identified multiple upper mantle discontinuities (UMDs) within the contiguous US. In the tectonically active western US, a negative discontinuity is unambiguously detected and repeatedly verified by many authors (Kumar, Yuan, et al., 2012; Kind et al., 2020a; Abt et al., 2010a; T. Liu & Shearer, n.d.; Hopper & Fischer, 2018b; Krueger et al., 2021a). In the tectonically active western US, the velocity drop is inferred to coincide with slow velocities imaged with tomography, and has been interpreted as the boundary between the lithosphere and asthenosphere (Hansen et al., 2015; Hopper & Fischer, 2018b; Abt et al., 2010a; Kind & Yuan, 2018b; Rader et al., 2015). However, this interpretation is inconsistent with the thickness of stable continental lithosphere beneath Archean and Proterozoic terranes in the central and eastern US. Here the velocity drop is detected at shallower depths (Abt et al., 2010b; T. Liu & Shearer, 2021; Hopper & Fischer, 2018b; Krueger et al., 2021b). This is a distinct discontinuity internal to the lithosphere - the MLD rather than the LAB (Abt et al., 2010b; Hopper & Fischer, 2018a; T. Liu & Shearer, 2021).

To clarify the nomenclature and avoid confusion in our interpretation we define important terms: 1) the thickness of stable continental lithosphere and 2) the depth statistics and polarity of previously detected upper mantle discontinuities. The stable continental lithosphere is that portion of the crust and upper mantle that has remained intact since the Archean and Proterozoic era. Some of its distinct geophysical signatures are: high-velocities, low attenuation, and heat loss by conduction (Dalton et al., 2017; Fischer, Rychert, Dalton, Miller, & others, 2020; Priestley et al., 2018). Its thickness, as inferred from seismology and petrology, extends to a depth ~ 200 -250 km depth (Dziewonski & Anderson, 1981; Carlson et al., 2005; Gung et al., 2003). The seismic detection of a sharp boundary with the asthenosphere in this region is elusive, in contrast with the tectonically active regions (Eaton et al., 2009). This suggests that the bottom-boundary of stable continental lithosphere is marked by velocity gradients that are broad. Second, we categorize the previously detected upper mantle discontinuities (UMDs) into three groups without any biasing interpretation on their tectonic location or the rheological strength of the rock, that is lithosphere or asthenosphere (Figure 1b - 1d). The first group (UMD1) are characterized by a velocity drop, and typically detected at consistent depths (83 ± 28 km). The second group (UMD2) are positive velocity discontinuities that are slightly deeper (150 ± 30 km, often referred to as the PVG-150 (Hua et al., 2023)). The last and final group (UMD3) are deeper negative reflectors (>110 km) that are sporadically detected in some studies (T. Liu & Shearer, n.d.; Kind et al., 2020a; Ford et al., 2015) and deeper than their shallower counterpart.

Before evaluating which of the proposed models of upper mantle structure is most consistent with the growing observations, we point out that some authors (Kind & Yuan, 2018a) have raised doubts on whether the shallowest and most prevalent discontinuity, UMD1, exists as a real geological feature, especially underneath stable continents. They argued that these discontinuities could be artifacts from the signal processing with no real geological basis (Kind & Yuan, 2018a). On the contrary, (Krueger et al., 2021b) provide compelling evidence for its visibility within cratons globally. This they do by reprocessing data with rigorous data selection and robust signal processing. Apart from the details of signal processing, some of the differences in observation may be due, in part, to the

111 varying sensitivity and data quality of different imaging techniques as well as the spatial
 112 heterogeneity of these discontinuities. One way to address these short-comings is to improve
 113 spatial resolution by using short-period high-resolution converted or reflected body-waves
 114 (Guan & Niu, 2017; Luo, Long, Karabinos, Kuiper, et al., 2021; Ford et al., 2016; Wirth &
 115 Long, 2014b; Pugh et al., 2021; Rychert et al., 2007a). However, only a few observations
 116 use short-period body waves to image the upper mantle (Luo, Long, Karabinos, & others,
 117 2021; Wirth & Long, 2014b; Guan & Niu, 2017; Ford et al., 2016; Rychert et al., 2007a).
 118 Since the long-period body waves (e.g., Sp-RFs and S-reverberations) are often processed at
 119 frequencies less than 0.5Hz, it means that our insight into mantle layering is filtered through
 120 a low resolution lens (Shearer & Buehler, 2019). This limits the resolution on sharpness and
 121 ultimately the robustness of interpretations of UMD depths, sharpness and origins (mantle
 122 composition and dynamics).

123 Here, we achieve improved vertical resolution by utilizing Ps converted waves processed
 124 at a frequency higher than Sp-RFs or S-reflections. However, when using converted Ps waves
 125 to detect upper mantle discontinuities, crustal reverberations generated at shallow bound-
 126 aries like the Moho cause unwanted interference (Abt et al., 2010a; T. Olugboji, Zhang, et
 127 al., 2023; Kind et al., 2012). This confounds the interpretation of deeper mantle discontinu-
 128 ities. We illustrate this by comparing the UMD arrival times with that calculated for waves
 129 reverberated in the crust (red clouds in Figure 1a,1e). We use a continental Moho model
 130 (Schmandt et al., 2015), and crustal velocities from (Schulte-Pelkum & Mahan, 2014). We
 131 observe that several UMDs reported in earlier studies (Abt et al., 2010a; T. Liu & Shearer,
 132 2021; Krueger et al., 2021a; Kind & Yuan, 2018b; Hopper & Fischer, 2018b) coincide with
 133 Moho multiples. In regions with thick crust, the deeper lithospheric discontinuities (UMD2
 134 and UMD3) are more likely to suffer interference. Even the shallow discontinuity (UMD1)
 135 can be affected in areas with a thin-layer crust where short reverberation paths allow mul-
 136 tiples to arrive at similar times. Therefore to make Ps-RFs suitable for mantle imaging
 137 we require a techniques that can isolate weak mantle conversions from Moho multiples
 138 that arrive at similar times. To address this issue, which has long been a challenge
 139 in global geophysics, we employ the novel CRISP-RF technique (Clean Receiver-Function
 140 Imaging using Sparse Radon Filters)(T. Olugboji, Zhang, et al., 2023). This method lever-
 141 ages sparsity-promoting Radon transforms to effectively model and isolate mantle-converted
 142 energy from crustal multiples (T. Olugboji, Zhang, et al., 2023).

143 In the rest of this paper we describe how we improve our understanding of upper mantle
 144 layering in the continental US by analysing body-wave conversions free of crustal reverber-
 145 ations and noise. We process a large dataset by scanning all available data across the con-
 146 tiguous US. We then apply CRISP-RF processing to produce high-resolution, multiple-free
 147 Ps-RFs. This enables tighter constraints on discontinuity depths and sharpness. We orga-
 148 nize the filtered Ps-RFs into depth-dependent clusters based on an unsupervised machine
 149 learning algorithm: a hybrid of the Sequencer and hierarchical k-means algorithm (Baron
 150 & Ménard, 2020). This process is crucial for revealing coherent and striking patterns in the
 151 data-space of body-wave conversions. We discuss the new insight into upper mantle strati-
 152 fication revealed by our filtered and ordered Ps converted waves: (1) tighter estimation on
 153 the depth and polarity of mantle discontinuities, (2) improved visibility of discontinuities
 154 across and beneath the stable continental lithosphere, (3) detection of mantle layering with a
 155 top and bottom-boundary and the estimation of its thickness (4) a preliminary evaluation
 156 of proposed models to explain upper mantle stratification, that is, melt, metasomatism, and
 157 elastically accommodated grain-boundary sliding.

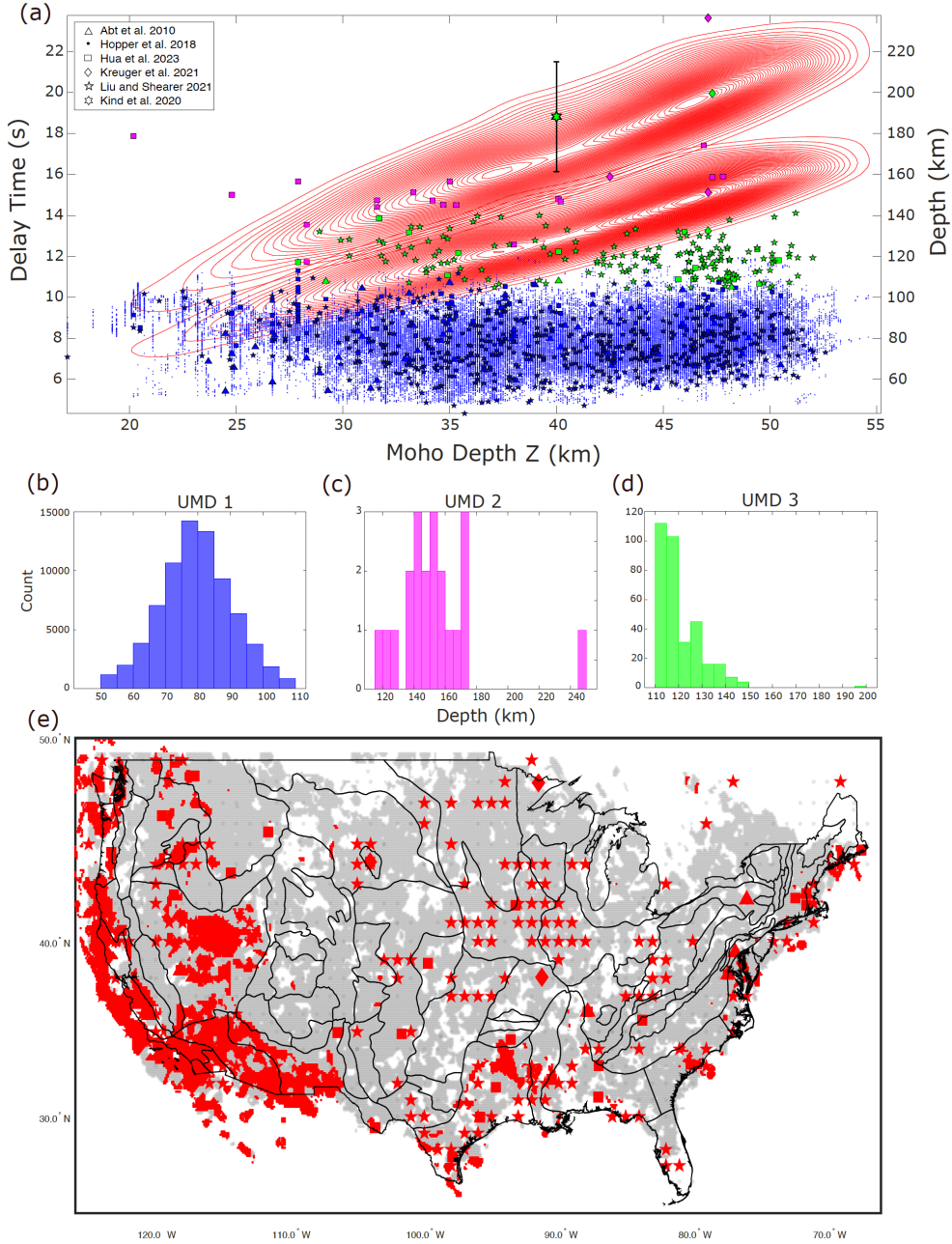


Figure 1. Compiled depths of US upper mantle discontinuities (UMD) highlighting the interference with crustal reverberation when imaging with Ps-RFs. (a) A scatter plot of UMD depth (right y-axis) overlaid on the Ps delay time (left y-axis) of Moho multiples (red contours: pPmS and pSmS arrivals). This region delineates depth-range (and timing) of crustal interference with mantle conversions. The Ps-delay of mantle conversions and crustal reverberations are calculated using a continental-scale Moho model from (Schmandt et al., 2015) and mantle velocities from (Schulte-Pelkum & Mahan, 2014). (b,c,d). Histogram of UMDs grouped by category. (e). Location where UMDs in (a) are observed anticipating locations where the Ps-RF imaging of UMDs are masked by crustal multiples (red). The symbols are same as in (a) and are from (Abt et al., 2010b; Kreuger et al., 2021a; Hopper & Fischer, 2018b; Hua et al., 2023; T. Liu & Shearer, 2021; Kind & Yuan, 2018b)

2 Data

We download and process three-component earthquake waveforms from the Incorporated Research Institution for Seismology (IRIS) database. The majority of the waveforms were recorded by stations that are part of the transportable array (TA) with additional contributions from all the major regional seismic networks within the contiguous US. The initial waveform database comprised approximately $\sim 500,000$ earthquake events recorded on $\sim 2,389$ seismic stations (Figure 2). This represents earthquakes with magnitude >5.5 spanning the period of 1989 to 2022. We select teleseismic earthquakes located at distances between 30 and 90 degrees from the recording stations. This range is specifically chosen to exclude earthquakes that may be affected by diffraction effects in the core shadow zone (Hosseini et al., 2019), as well as non-planar and triplicated waves from the mantle transition zone (Stähler et al., 2012).

We apply several data cleaning and preconditioning procedures to ensure data quality. The seismograms are rotated from the geographic (Z, N, E) to the earthquake coordinate system: vertical (Z), radial (R), and transverse (T) orientation (Rondenay, 2009). We apply an automated quality selection criteria to obtain the best data. We select records with good signal-to-noise ratio (SNR), automatically rejecting all waveforms with SNR less than 2 (calculated with a signal window of 120 s and a noise window of 25 s around the predicted P-arrival time). We ensure consistent sampling rates across all waveforms for each station. This requires resampling the waveforms to the highest frequency for each station. Through these quality control measures, a total of 83,697 earthquake waveforms passed initial quality checks. This is a total of $\sim 17\%$ of the initial preprocessed data.

After the initial quality checks, we organize the seismograms recorded at each station into discrete slowness values. In a radially symmetric earth the body-waves propagating from the hypocenter to the station travel with a distinct ray parameter (slowness values) and sample the receiver-side structure with different arrival angles. Optimal slowness-sampling and epicentral distance coverage is required for stable CRISP-RF processing (Figure S2). This restriction reduces our station catalog from 2,389 to a final set of 417 stations (17.5 % of total station inventory). This also culls the seismograms to a final selection of 20,460 of the best three-channel recordings. When compared to the discarded seismograms the final dataset comprise the highest quality (SNR > 16) seismograms. Despite this strict data-selection criteria the final set of stations are widely distributed across the contiguous US ensuring a comprehensive coverage across different tectonic domains (Figure 2).

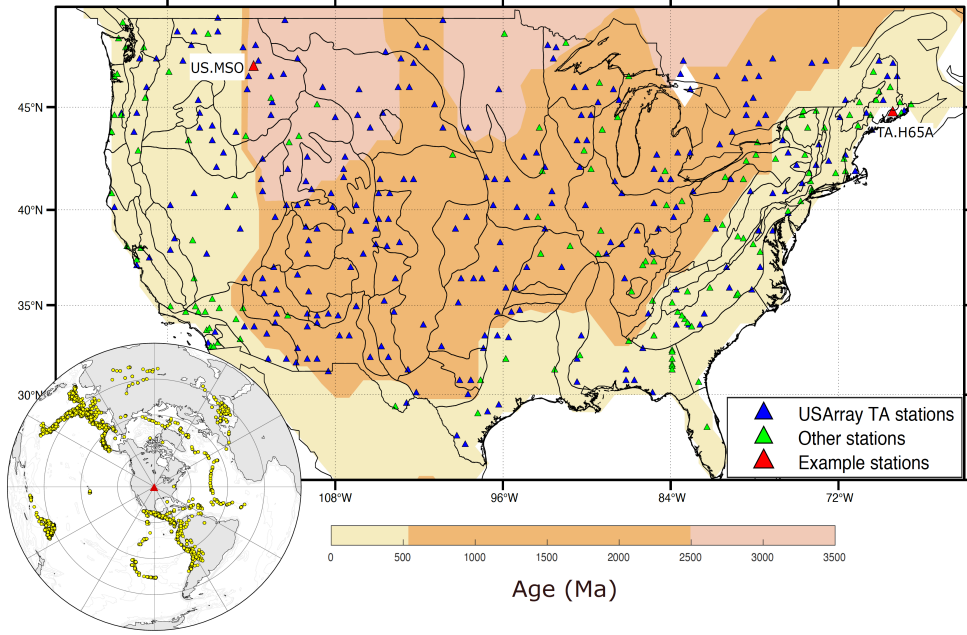


Figure 2. Distribution of seismic stations used in this study. The inset shows the distribution of teleseismic earthquakes that are used. Red triangles mark the locations of the two example stations (TA.H65A, US.MSO) used in our analysis. A full description of all 2389 stations and data statistics can be found in Figure S1 and S2

3 Methods

3.1 RFs at High-Frequency: Contaminated Radial Stacks

We image upper mantle discontinuities using high-frequency receiver functions. We analyse teleseismic P-waves for signature of conversion from seismic discontinuities beneath the stations (Langston, 1977). Radial Ps-RF traces are calculated with a cut-off frequency of 1.5 Hz using the extended-time multi-taper cross-correlation method (ETMT) (Helffrich, 2006). This approach extends the traditional cross-correlation receiver function technique (Park & Levin, n.d.) by applying multiple Slepian tapers to window the waveform data before spectral estimation and deconvolution. To improve the detection of late arriving low-magnitude sub-crustal mantle conversions, we employ a re-normalization procedure, where we implement a 6-second time-shift (τ_s) on the radial component traces to remove early arriving crustal conversions before deconvolution (Equation 1a) (Helffrich, 2006; Shibutani et al., 2008; Park & Levin, 2016d). This step ensures that high-amplitude crustal phases do not overshadow the weaker and deeper sub-Moho conversions of interest. The time-shift is implemented in the frequency domain:

$$\tilde{U}_\kappa^r(\omega, p) = W_\kappa * [U_\kappa^r(\omega, p)e^{i\omega\tau_s}] \quad (1)$$

where $U^r(\omega, p)$ is the Fourier-transformed radial seismogram and W_k are the Slepian tapers, and p is the horizontal slowness. The receiver functions are then computed by deconvolving the shifted radial seismogram from the vertical (both seismograms are tapered with W_k):

$$\tilde{\mathbf{D}}(\omega, p) = \left[\frac{\sum_{\kappa=0}^{\kappa-1} \tilde{U}_\kappa^z(\omega, p) * \tilde{U}_\kappa^r(\omega, p)}{\sum_{\kappa=0}^{\kappa-1} \tilde{U}_\kappa^z(\omega, p) * \tilde{U}_\kappa^z(\omega, p) + \zeta(\omega)} \right] \quad (2)$$

We then stack the radial receiver functions in slowness bins with one-degree spacing to enhance signal quality (Park & Levin, 2000, 2016c):

$$\mathbf{D}(\omega, p_s) = \left(\sum_{l=0}^{n_p} (1/\sigma_l^2) \right)^{-1} \left(\sum_{l=0}^{n_p} 1/\sigma_l^2 \tilde{\mathbf{D}}(\omega, p_l) \right) \quad (3)$$

where p_s are the slowness bins, p_l are the individual slowness values in each bin, and σ_l^2 are the frequency-dependent stacking weights derived from coherence (Park & Levin, 2000, 2016c). The frequency domain receiver functions are then transformed back to the time domain using the inverse Fourier transform

$$\mathbf{d}(t, p_s) = \mathcal{F}^{-1} \left[\mathbf{D}(\omega, p_s) \right] \quad (4)$$

where $\mathcal{F}^{-1}$ is the inverse Fourier transform. The Ps-RF data is a 2-D matrix in which each row represents traces stacked into slowness bins. Each row is a distinct horizontal slowness and each column is a discrete-time sample.

Since the crust-mantle boundary is often the most prominent discontinuity in the lithosphere, top-side reflections bouncing off the Moho (Ppms and Psms) are visible in most of the stacked radial receiver functions (Figure 3). This presents a significant obstacle when interpreting converted waves from sub-crustal lithosphere discontinuities (100-200 km) arriving at ~ 10 -20 secs (Figure 1 and 3). The moho multiples can be identified in the receiver function stacks by their characteristic time-distance(slowness) behavior. Earthquakes located closer to the station (and traveling with large horizontal slowness) arrive slightly earlier than those further away (Figure 3c). This is the opposite behavior for the Ps-converted waves that do not experience top-side reflections. These conversions arrive later for earthquakes located closer to the station (Shi et al., 2020; Ryberg & Weber, 2000). Depending on the station location, data quality, and depth to other discontinuities beneath a station, crustal multiples may not always be easily identified in the receiver function stacks. This makes it harder to interpret the final stacked receiver functions (Figure 3a,b,g,h). For a clear and accurate interpretation of the Ps-RFs, it is crucial to distinguish crust-mantle top-side reflections from mantle conversion. Only when these multiply reflected waves have been properly filtered out can we confidently proceed with the interpretation for upper mantle layering.

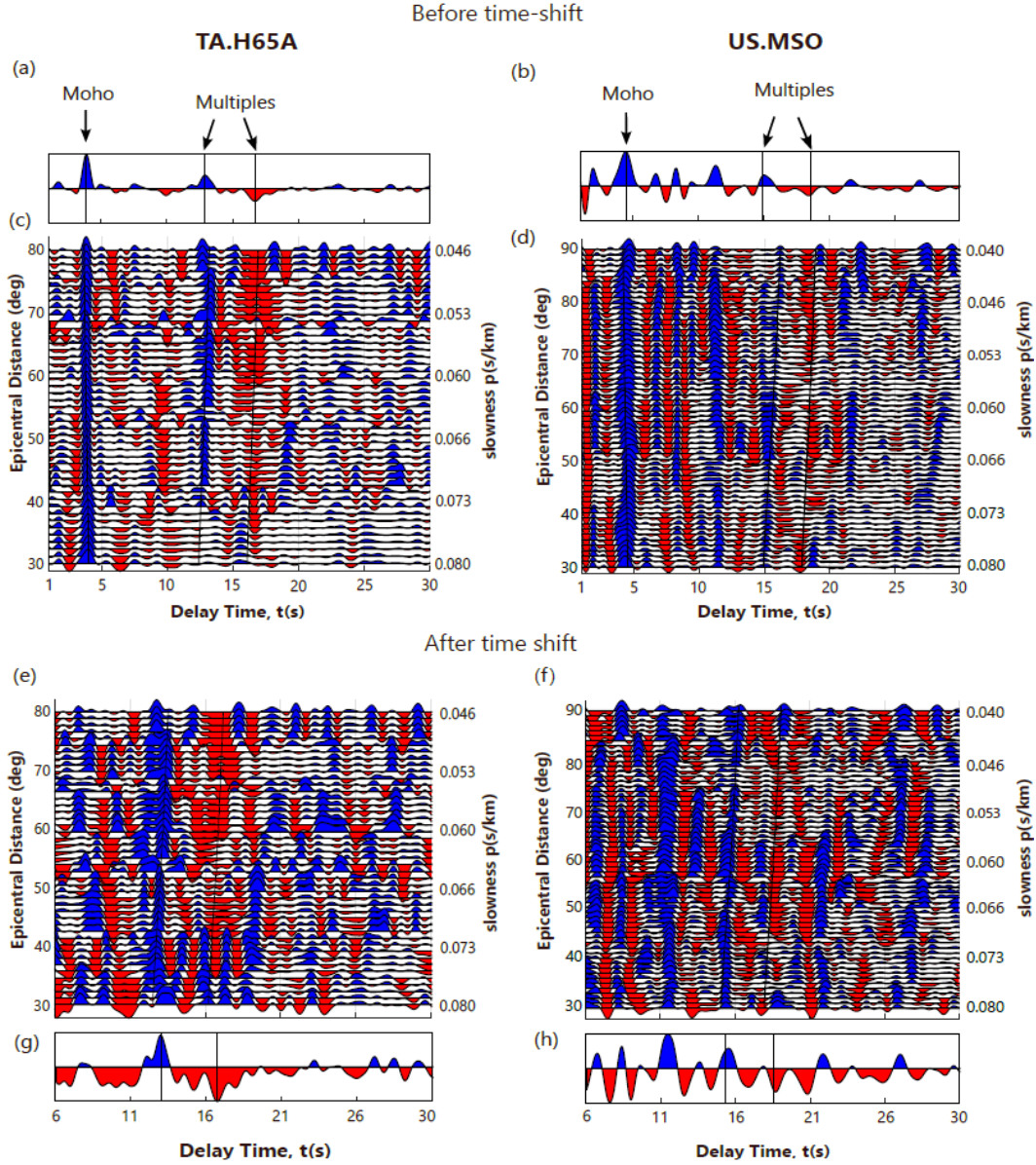


Figure 3. Radial receiver functions for two stations showing Moho arrivals and multiples - top-side reflections in the crust. (a-b) Full stack of all radial receiver functions for stations TA.H65A and US.MSO showing Moho and multiples. (c-d) The radial receiver functions for each station, sorted and stacked by station-earthquake distance in angular degrees. (e-f) Time-shifted radial receiver functions same as (c-d) but starting at 6 secs. (g-h) Full stack of the time-shifted receiver functions corresponding to (e-f). Blue and red shading indicate positive and negative amplitudes

3.2 Filtered RFs: CRISP-RF for Denoising

We briefly present our approach to removing top-side reflections and other non-coherent noise. This is the method called Clean Receiver-function Imaging using Sparse Radon Filters (CRISP-RF) (T. Olugboji, Zhang, et al., 2023). This method enhances the clarity of Ps-RFs allowing for a more accurate interpretation of sub-crustal mantle discontinuities. For a more detailed description, we refer the reader to (T. Olugboji, Zhang, et al., 2023). The

technique involves three main steps: The initial step applies the sparse Radon transform to the Ps-RF data:

$$\mathfrak{R}_{\text{sp}}(\mathbf{d}) : \underset{\mathbf{m}}{\operatorname{argmin}} \left\{ \frac{1}{2} \|\mathcal{F}^{-1}\{\mathbf{L}\mathcal{F}\{\mathbf{m}\}\} - \mathbf{d}\|_2^2 + \lambda\psi(\mathbf{m}) \right\} \quad (5)$$

where $\mathfrak{R}_{\text{sp}}(\mathbf{d})$ maps the Ps-RF data $\mathbf{d}$ to the Radon model $\mathbf{m}$. The transform can be viewed as finding a predictive Radon model, $\mathbf{m}$, using the forward operator $\mathbf{A}$ and subject to regularization $\psi(\mathbf{m})$ (recasting as $\mathbf{d} = \mathbf{A}\mathbf{m}$). Therefore the transform is an optimization problem to find $\mathbf{m}$ using a sparsity-enforcing regularization: ℓ_1 -norm $\psi(\mathbf{m}) = \|\mathbf{m}\|_1$ (Equations 5). This optimization is solved using the SRTFISTA algorithm: a fast iterative shrinkage-thresholding approach that promotes the sparsity of the Ps-RFs in both the time and frequency domains (forward and inverse fourier operators: $\mathbf{A} = \mathcal{F}^{-1}\mathbf{L}\mathcal{F}$) and yields a cleaner representation of the Ps-RF data (Beck & Teboulle, 2009; Gong et al., 2016). Here, $\mathbf{L}$, is a frequency-domain projection matrix that maps the Ps-RF arrivals in $\mathbf{d}$ from the time-slowness data-space to the Radon model, $\mathbf{m}$, which is now in the intercept-time-curvature model-space. Top-side reflections are mapped into the negative curvature while direct conversions show up in the positive curvature (Figure 4c & 4d).

The second step applies a selective masking filter, $\mathbf{K}$, to the Radon model $\mathbf{m}$. The filter is designed to extract only direct mantle conversions by removing contributions representing top-side reflections (red dashed lines in Figure 4c & 4d). By setting the amplitudes with negative curvatures (squares in Figure 4c & 4d) to zero and preserving those with positive curvatures (circles in Figure 4c & 4d), the masking filter retains only Ps-conversions from the upper mantle. The third and final step transforms the now filtered Radon model back to the data-space using the adjoint Radon transform $\mathfrak{R}_{\text{sp}}^+$. This is the required filtered Ps-RF data $\tilde{\mathbf{d}}$ free of unwanted reflections and incoherent noise (Figure 4e & 4f):

$$\mathbf{d} \xrightarrow[\text{step1}]{\mathfrak{R}_{\text{sp}}} \mathbf{m} \xrightarrow[\text{step2}]{\mathbf{K}} \mathbf{m}\mathbf{K} \xrightarrow[\text{step3}]{\mathfrak{R}_{\text{sp}}^+} \tilde{\mathbf{d}} \quad (6)$$

A comparison between the original and CRISP-RF processed Ps-RF stacks for our two example stations shows that the CRISP-RF technique has successfully isolated the mantle-converted phases by attenuating crustal multiples and noise (compare Figure 4a,b to 4e,f). This is evident in the filtered stacks, where mantle conversions are easily and unambiguously identified.

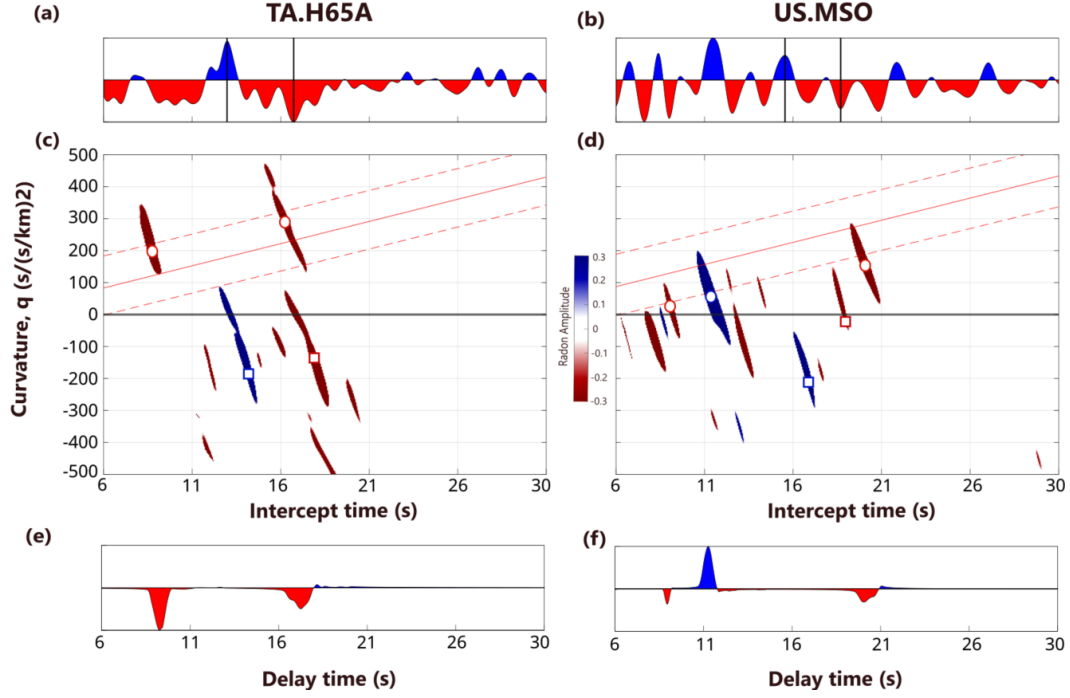


Figure 4. CRISP-RF denoising steps for filtering receiver functions obtained from stations TA.H65A and US.MSO. (a-b) Time-shifted unfiltered receiver function stacks, with predicted Moho arrival times indicated by black lines. (c-d) Radon model (after applying step 1) showing direct mantle conversions along the positive curvature axis (circles), and multiples in the negative curvature (squares). The masking filter are the red lines - they retain all arrivals between the dashed lines (step 2). (e-f) The final filtered Ps-RFs after transforming the filtered Radon model to data domain (step 3). The top-side reflections in the crust have been removed leaving only the direct conversions

3.3 Machine Learning (Sequencing & Clustering) on Filtered RFs:

Since our aim is to produce a detailed map of coherent scattering across discontinuities located in the upper mantle, we employ a two-tiered machine learning approach to find repeatable patterns in the receiver function signature of upper mantle conversions across all our 417 stations. This approach integrates the Sequencer algorithm (Baron & Ménard, 2020) with hierarchical clustering, each serving a distinct but complementary role in uncovering patterns in our denoised Ps-RFs. The sequencer algorithm is necessary for sorting the CRISP-RF filtered receiver functions before applying the correlation-based hierarchical clustering algorithm. The Sequencer algorithm is an unsupervised machine learning tool that reveals hidden sequential structures often obscured within complex multivariate datasets (Baron & Ménard, 2020). It leverages a variety of distance metrics to systematically reorder datasets based on similarity. It has shown promise in sequencing earthquake waveforms to discern spatial patterns in lower mantle scattering (Kim et al., 2020), the analysis of seismic noise to detect temporally coherent signals (Fang, n.d.), and classification of seismic velocities for guiding discovery of tectonic influences on crustal architecture (T. Olugboji, Xue, et al., 2023). In our application of the sequencer algorithm, the data objects to be sequenced are the single-station Ps-RF stacks obtained before or after CRISP-RF processing (vertical lines in the images of Figure 5).

First, we apply the Sequencer to the unfiltered single-station receiver function stacks (Figure 5a). The performance is very poor (Figure 5b). A slight improvement in the

288 detection of positive amplitude arrivals can be seen at ~ 60 km and ~ 100 km but not
 289 much information is gained from ordering the unfiltered data. This is probably due to the
 290 complex mixed-mode scattering within the highly heterogeneous crust across the US. As a
 291 result, it is hard for the sequencer algorithm to find interpretable patterns within the data.
 292 On the other hand, when we separate CRISP-RF filtered receiver function into two subsets:
 293 a set containing only negative amplitudes, and another with only positive amplitudes, the
 294 algorithm performed much better. This is possible because we have filtered out the top-side
 295 reflections in the crust as well as other incoherent noise. The additional simplification using
 296 polarity-dependent filtering also helps considerably (Figure 5c,d). We use an appropriate
 297 measure of dissimilarity (Kullback-Leibler (KL) divergence) and a scale (sixteen) to find
 298 the most optimal ordering of each of the two data subsets. The importance of filtering
 299 and de-noising with CRISP-RF before sequencing is another strong argument for why we
 300 are able to improve our detection of upper mantle layering using Ps-RFs that are clearly
 301 overprinted by a highly scattered wave-field within the continental crust (Figure 1 and 5a).

302 After sequencing the filtered Ps-RFs, we apply a hierarchical clustering algorithm that
 303 independently delineates the seismic stations into groups based on polarity-filtered receiver
 304 function signature of upper mantle layering. Hierarchical clustering starts by measuring
 305 pair-wise cross-correlation across all the filtered Ps-RFs. This measure of similarity is then
 306 used to create binary clusters in a hierarchical manner where the third object is merged
 307 into the binary cluster containing the first and second object and so on until all objects are
 308 merged sequentially until a final cluster is built. This cluster tree (a dendrogram) shows how
 309 (dis-)similar each of the Ps-RFs are compared to the others. The most similar (consistent)
 310 Ps-RFs have linkages that are short while the dissimilar ones (and large clusters of dis-
 311 similar Ps-RFs) have linkages that are longer. Through an iterative routine guided by the
 312 depth coherence, we choose a linkage threshold that separates the dendrogram into 4 final
 313 clusters one cluster each for the positively and negatively filtered Ps-RFs (Figure 6 & 7).
 314 Each cluster is a natural grouping of single-station polarity-filtered Ps-RFs whose traces are
 315 most coherent and therefore reflect the signature of scattering from coherent upper mantle
 316 structure.

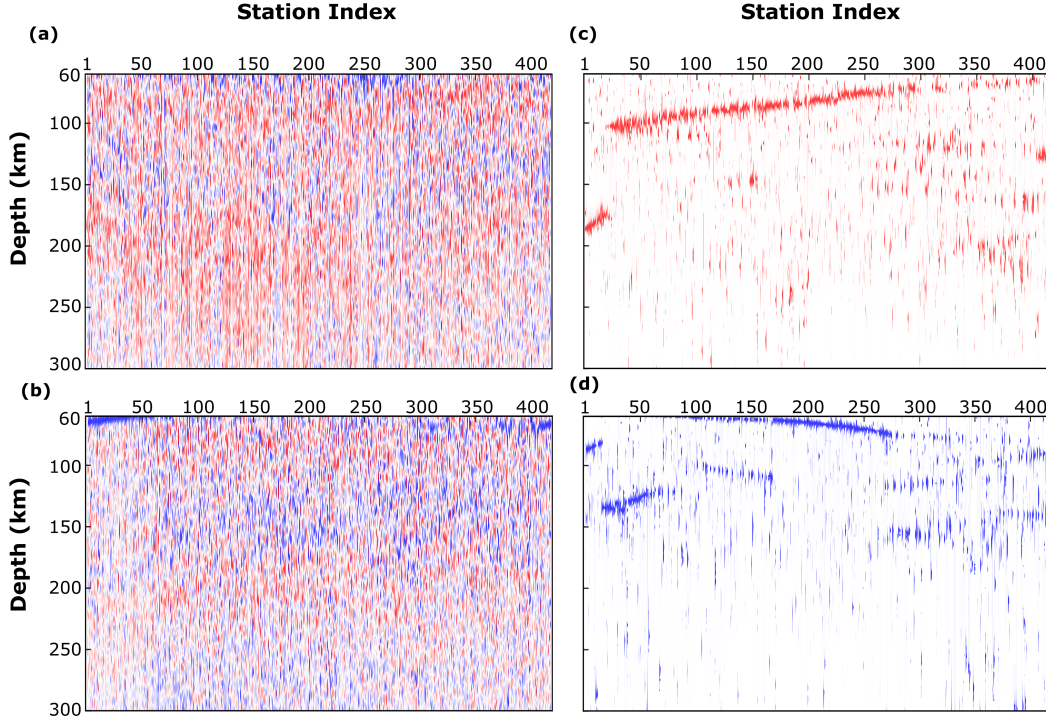


Figure 5. Enhanced pattern recognition of upper mantle discontinuities through polarity-based filtering and sequencing of Ps-RF traces. (a) Single-station radial Ps-RF stacks without CRISP-RF processing illustrating minimal interpretive content (b) Single-station radial Ps-RF traces, same as in (a), but processed through the sequencer algorithm. The image is still hard to interpret due to the presence of multi-mode scattering in a heterogeneous crust (c) Negatively filtered and sequenced Ps-RF traces (d) Positively filtered and sequenced Ps-RF traces. The CRISP-RF filtered traces in (c) and (d) show clear and coherent arrivals.

4 Results

Unsupervised machine learning, applied to Ps-RF traces that have been filtered based on polarity, offers a window into upper mantle structure beneath the contiguous US. Based on our analysis we observe a more complicated stratification of upper mantle structure. Beneath each station, three types of upper mantle discontinuities are observed, classified based on depth: (1) intra-lithospheric discontinuities (velocity drop and increase), (2) transitional discontinuities (velocity drop) and (3) sub-lithospheric discontinuities (velocity increase). This observation presents a departure from the simple view of a single uniform and ubiquitous middle lithosphere discontinuity expressed as a rapid velocity drop. Note that the relationship of the discontinuity depth to location within, across or beneath the lithosphere is only straightforward for stable continental lithosphere east of the Rocky mountain front. That said, this detailed perspective on upper mantle layering may reflect changes in composition, metasomatism, phase change, or rheology.

4.1 Transitional and Intra-lithosphere discontinuities: Velocity drop

The most striking results is the detection of phases with negative polarity visible across all the stations and within depth internal to the lithosphere (< 200 km) and at a depth that marks a transition from the lithosphere to asthenosphere (> 200 km). These phases with negative polarity on the filtered Ps-RF traces indicate discontinuities marked by a velocity

drop. After coherence-based clustering of these negative discontinuities, we observe four distinct station groupings: N1-N4 (Figure 6 % S3). The group index is sorted based on total number of stations and depth of each group's representative centroid (average Ps-RF trace in each cluster).

The first and largest cluster, N1, (45 % - 189 of 417 stations) is the one with a pronounced Ps-RF arrival at a depth between 60 to 100 km, i.e. spanning a depth of ~ 40 km (Figure 6a,6b & S3a). This intra-lithosphere discontinuity is within the depth-range traditionally associated with the mid-lithosphere discontinuity reported in previous studies (see Figure 1b) (Abt et al., 2010b; Hopper & Fischer, 2018a; Krueger et al., 2021a; Hua et al., 2023; T. Liu & Shearer, n.d.). Our independent confirmation of this discontinuity using a slightly different approach, Filtered and Sequenced Ps-RFs instead of Sp-RFs, provides extra validation that this discontinuity is real and not an artifact of deconvolution.

The second largest cluster, N2, (24 % - 101 of 417 stations) represents all stations with slightly deeper Ps arrivals compared to N1: 100 km - 135 km. This discontinuity is more depth-confined. Half of the stations see the discontinuity at a depth of 100 km and another half 35 km deeper at ~ 135 km (Figure 6c,6d & S5b). Compared to its shallower counterpart in N1 (Figure 6a), the deeper reflector lack a substantial depth variability and hints at a relatively consistent physical process across this limited depth range. While sporadic detections of such a relatively deeper intra-lithosphere discontinuity have previously been reported especially within the Achaean and Proterozoic terrains of central and eastern US, (T. Liu & Shearer, n.d.; Hua et al., 2023), the consistency of this seismic signal in a quarter of our stations implies a more widespread occurrence.

The third cluster, N3, (18% - 77 of 417 stations) represent stations with the deepest intra-lithosphere reflectors located at a depth range from ~ 150 km to ~ 190 km (Figure 6e, 6f & S3c). Coherent signals in this depth range coincide with the lowermost region of the thermal boundary layer within cratonic lithosphere (Kind et al., 2020a) and may mark the transitional zone where a non-mobile lithosphere transitions to a convection upper mantle asthenosphere. Although these group of stations are consistent in having deeper discontinuities, we observe a few stations with shallower discontinuities which are not located at a consistent depth. This complicated pattern reduces the overall correlation value across the entire group. as indicated by the smearing in the final cluster average (Figure 5f).

The fourth and final cluster, N4, (12% - 50 of 417 stations) represents stations situated above mantle that have a discontinuity that is very clearly transitional between lithosphere and asthenosphere. This is seen as a clear negative arrival on the Ps-RFs at a depth consistently between 200 to 260 km (Figure 6g). This depth range coincides with the expected base of thick depleted rigid mantle lithosphere underneath cratons (Kind et al., 2020a). As such, this cluster of stations reflect a deeper lithosphere-asthenosphere transition, and may detect a strong signature of a impedance contrast between the rigid lithospheric mantle and the weaker asthenospheric mantle. Stations that belong to these group, and in part N3, are consistent with upper mantle structure previously reported by (Kind et al., 2020a) in the central and eastern US referred to as the cratonic lithosphere-asthenosphere boundary (LABc). Here, our results show that these stations are mostly located in the Eastern US, for N4, with some stations in the western US for N3 (see Figure S5c & S5d)

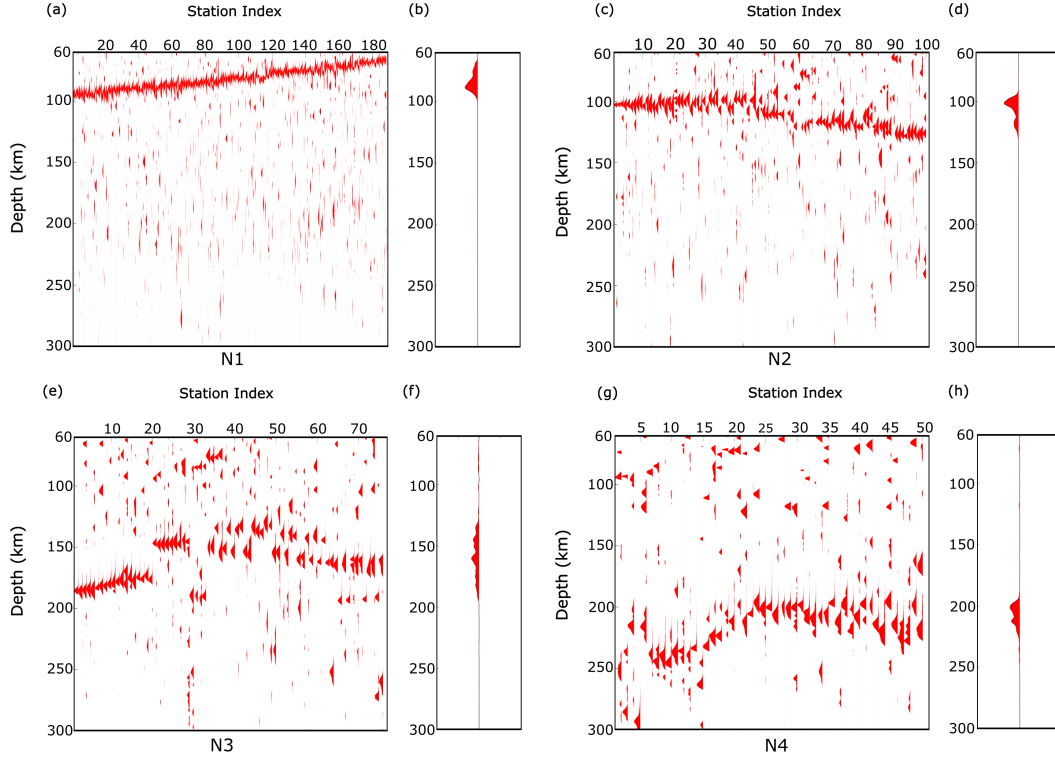


Figure 6. Stations with upper mantle discontinuities marked by a velocity drop and grouped by the hierarchical clustering of filtered and sequenced Ps-RFs (a) Shallow intra-lithospheric discontinuity (60-100 km) sorted from the deepest to shallowest station with the depth spanning 40-km. This discontinuity is similar to the previously identified mid-lithospheric discontinuities in Figure 1b. (b) Semblance-weighted stacks of the individual single-station filtered Ps-RFs (c) A relatively consistent and shallow intra-lithospheric discontinuity (100 km & 135 km) (d) Semblance-weighted stack, same as in b, showing the average Ps-RF signature across all stations in the cluster. (e) A transitional discontinuity (150-190 km) located at a depth consistent with the bottom of a thermal boundary layer. (f) The semblance weighted stack showing a more diffuse trace due to larger variance across stations in the cluster (g) A transitional discontinuity (200-250 km) located at a depth consistent with the transition from a conductive to adiabatic thermal gradient in a cold cratonic lithosphere. (h) The semblance weighted stack, is impulsive (~ 200 km) when the within-cluster variance is small and suggests that the sporadic negative amplitudes (~ 100 km) are not spatially coherent. A full statistic of the depths can be found in Figure S3. The spatial clustering can be found in S5.

4.2 Intra and Sub-lithosphere discontinuities: Velocity increase

In addition to upper mantle discontinuities marked by a velocity drop, we present results for discontinuities marked by a velocity increase. The Ps-RF signature of a velocity increase is a positive amplitude on the filtered Ps-RF traces. With the Ps-RFs filtered for positive amplitudes (Figure 5d) and processing through the hierarchical clustering algorithm, we observe two main types of upper mantle discontinuities marked by a velocity increase: (1) intra-lithospheric and (2) sub-lithospheric. The first cluster, P1, represents 22% of the stations with the shallowest intra-lithospheric discontinuity between ~ 80 to ~ 120 km (Figure 7a). This discrete jump in velocities is at a depth range overlapping with the intra-lithospheric discontinuities marked by a velocity drop in clusters N1 and N2 (Figure 6 a,c).

Slightly deeper (by ~ 40 km) is a second cluster, P2, of 32% of the stations located above a velocity increase located between ~ 120 to ~ 180 km (Figure 7c). This intra-lithosphere layer coincides with the previously reported positive velocity gradient-150km discontinuity (PVG-150) which has been hypothesized to be the base of a melt layer embedded within the lithosphere (Hua et al., 2023). When paired with the intra-lithosphere reflectors marked by a velocity drop, this discontinuity reveals a potentially stratified lithospheric mantle in some regions (Figure S6). Detection of such a top and bottom interfaces is only separable using these two-tier filtering and clustering approach.

A third cluster, P3, unlike the other two, indicates the detection of an elusive sub-lithosphere discontinuity at ~ 250 to 300 km (Figure 6e). Only a few stations ($\sim 5\%$) show clear Ps-RF arrivals at these depths (Figure 7e). This observation is consistent with the reported depth of the previously detected X-discontinuities (Pugh et al., 2021, 2023), which has remained elusive in prior studies of upper mantle layering across the contiguous US. The final and largest cluster, P4, is a null detection for lithosphere or sub-lithosphere discontinuities with a velocity drop. This is $\sim 41\%$ of the station population. In this cluster, the positive amplitudes observed at depths $< \sim 60$ km (Figure 7g and 7h) are most likely the side-lobe of a crust-mantle conversion or evidence of thickened crust or terrain sutures. Further analysis confirms this designations (Figure S7 & S8. see also 'X' discontinuity in (Kind et al., 2020a)) and therefore we categorize these stations as belonging to stations without a clear upper mantle discontinuity with a velocity increase. These structures may be associated with complexes formed during extended Paleozoic assembly of the North American continent.

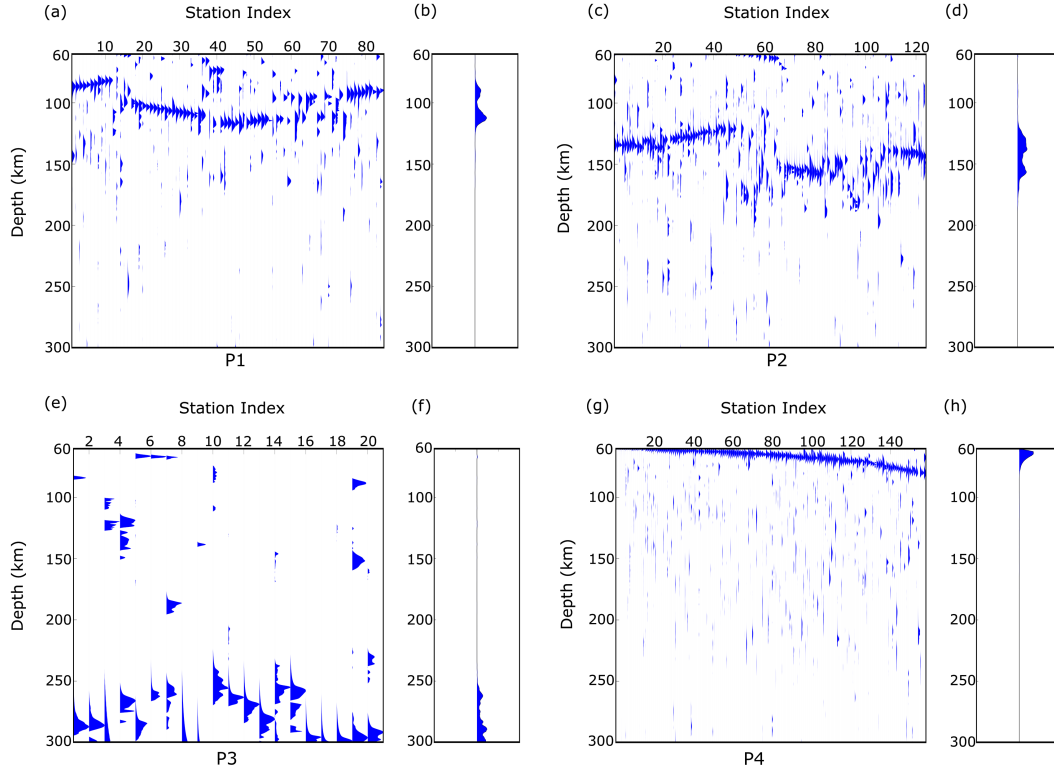


Figure 7. Similar to Figure 6 but for upper mantle discontinuities marked by a velocity increase. (a) P1: intra-lithosphere discontinuity depth of $\sim 80 - 120$ km (c) P2: intra-lithosphere discontinuity at a depth of $\sim 120 - 180$ km (e) P3: sub-lithosphere discontinuity at a depth of $\sim 250 - 300$ km (g) P4: Null detection caused by crustal side-lobes or terrane sutures. (b,d,f,h) Semblance-weighted stacks summarizing mean Ps-RF signal for P1-P4. A full statistic of the depths can be found in Figure S4. The spatial clustering can be found in S6.

4.3 Spatial Clustering of Stations and Ps-RF Centroids

Up until now, we've grouped our filtered Ps-RF results by looking at the data-similarity without any concern for geology or tectonics. Now, we examine how the stations belonging to each cluster are distributed in space. We do this by color-coding each station by the cluster index it belongs to using a color-coding scheme that interpolates stations into a 1-degree bin (Figure 8b and 8d). The mantle-discontinuity structure (velocity increase or decrease) beneath each station is then best described by the representative Ps-RF centroid for each group. The centroid is a semblance-weighted stack for all the polarity-filtered Ps-RFs for all the stations in the group. This summarizes the data variance in each group to a set of archetype receiver function reflecting the depth-dependent discontinuity structure across the US (Figure 8a and 8c). This spatial analysis of the station clustering reveals a striking diversity in upper mantle layering. It shows a mosaic of negative and positive seismic structures distributed in a largely stochastic fashion (Figures 8b, 8d). We observe that no single boundary or transition predominates continent-wide. Instead, a spectrum of seismic discontinuities emerges, segmented across variable depths. This random distribution does not conform to simple geographical or tectonic boundaries.

Despite this broad characterization, we observe that the most prevalent mantle discontinuity is the *intra-lithospheric discontinuity with a velocity drop* which is observed at $\sim 70\%$ of our stations (N1+N2). The semblance-weighted mean stacks reflect a discontinuity

at ~ 100 km for both clusters. In the first cluster, N1, the precursory arrival reflects the systematic depth variation across the individual Ps-RFs and for the second cluster, N2, the post-cursor arrival represents the slight depth offset for half of the station. Regardless these two clusters represent most of the data-variance for a negative-amplitude Ps-RFs. The filtered Ps-RF traces from these stations show a high correlation coefficient which is visually confirmed in the data grouping (compare Figures 6a and 6c). Beneath 18.36% of our stations we observe that the deepest intra-lithosphere discontinuity, N3 is less coherent (Figure 8a). The last group of stations, only 12 %, provide evidence for a discontinuity that is transitional between the lithosphere and asthenosphere - N4 - with a representative Ps-RF that is ~ 200 km (Figure 8a). The inter-station coherence for this group is lightly better than that of N2 but less than N1 and N2. The stations detecting this deeper transitional discontinuity are more prevalent in the stable continental lithosphere of the eastern US (Figure S5d) .

For upper mantle marked by a velocity increase, we observe only intra-lithospheric and sub-lithospheric discontinuities. We do not observe velocity increases at depths transitional between lithosphere and asthenosphere. While the station distribution shows no clear separation by geology or tectonics, we observe that the largest cluster (41 %), P4, is a null detection for upper mantle discontinuities (Figure 7h and 8d).. This means that intra-lithosphere discontinuities ($P1 + P2 = 53\%$) are only half as less likely than the counterpart velocity drop ($N1+N2 = 70\%$). The discontinuity structure beneath stations in cluster P1 is slightly shallower (~ 100 km $\pm$ 20 km), more self-similar (higher correlation) than those in P2 (~ 150 km $\pm$ 30 km), which are deeper. Unlike the intra-lithosphere discontinuity the detections of sub-lithospheric discontinuity is rare. Only 5.21% of stations belonging to cluster 3 (Figure 7e). The depth range is confined to (~ 270 km $\pm$ 30 km). The detection of upper mantle discontinuities with variable depth and spatial distribution reflects a complexity inconsistent with a simple view of a laterally continuous boundary. This complexity underscores their detection by higher resolution Ps-RFs after appropriate filtering and sorting.

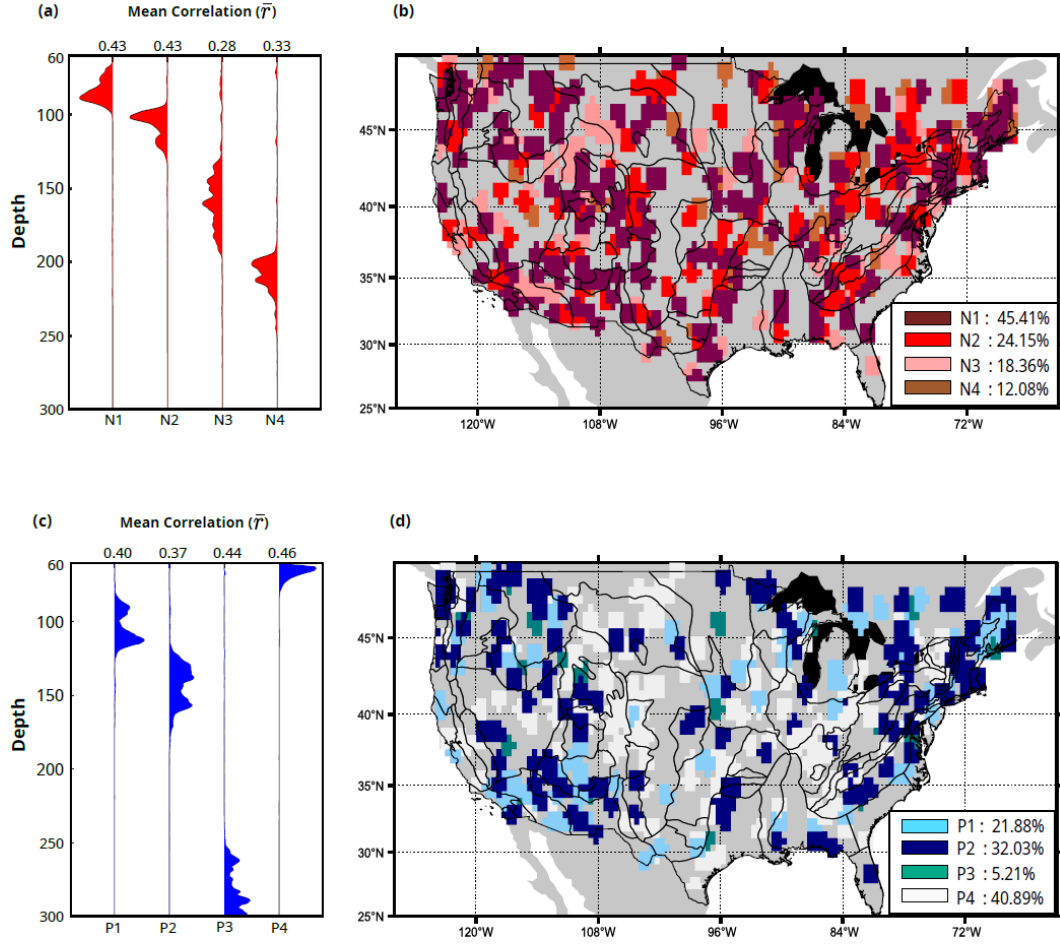


Figure 8. Station location, cluster index, centroid, and statistics for each Ps-RF filtered by polarity. (a) Semblance-weighted stacks for negative Ps-RF traces (N1-N4) representing discontinuities within and across the lithosphere (b) Location of stations (and counts) belonging to cluster N1-N4 (c) Semblance-weighted stacks for positive Ps-RF traces (P1-P3) representing discontinuities within and beneath the lithosphere. P4 represents null detections unrelated to upper mantle structure (d) Location of stations (and counts) belonging to cluster P1-P4

4.4 Synthesis: Architecture of Upper Mantle Stratification

The analysis of polarity-filtered single-station Ps-RF traces resulted in their classification based on the upper mantle structure beneath the station. When each individual station was processed through the CRISP-RF filter and sorted into an exclusive group: N1-N4 or P1-P4 based on similarity to other stations, we were able to distinguish depth and type of the discontinuity (e.g. shallow, deep, velocity drop or intra-lithospheric). However, it is important to note that each station can belong to either an ‘N-type’ cluster, a ‘P-type’ cluster, or both. Therefore looking beneath each station and identifying the ‘N-type’ or ‘P-type’ discontinuity structure leads to a view of upper mantle architecture across the US. The first class is the *intra-lithosphere discontinuities without a discernable base* (green circles in Figure 9). These are stations whose Ps-RFs belong to the shallow ‘N-type’ (N1-N3) but do not indicate a deeper discontinuity marked by a velocity increase and so do not have a ‘P-type’ signature (do not belong to P1-P3). Crucially, these stations are coincident with the P4-type (null detection), where deep crustal reflectors and no positive intra-lithosphere

discontinuities are observed. The absence of a velocity increase below the velocity drop indicates that this is a strict discontinuity rather than a layering with a discernible top and bottom base. This type of upper mantle structure is prevalent and widespread (38.7%) suggesting a ubiquitous feature of the lithosphere.

In contrast, we observe a second class of upper mantle architecture which can be described as *intra-lithosphere layering with a top and a base*. This type of upper mantle stratification is as prevalent as the previous type (44.8% of recording sites). This upper mantle architecture is observed for stations that belong to both an ‘N-type’ (N1-N3) and a ‘P-type’ (P1-P3) cluster. Therefore beneath these stations the mantle has both an upper and lower impedance contrast as you cross through an intra-lithosphere layer. It is important to note that two potential stratifications can arise in this conjunction of ‘N-type’ and ‘P-type’ discontinuities: (i) a layer bounded by a velocity drop on top and a velocity increase below (yellow circles in Figure 9), and (ii) the reverse, a layer bounded by a velocity increase on top and a velocity drop below (yellow squares in Figure 9). The latter is a special case of mid-lithosphere stratification that has not previously been resolved.

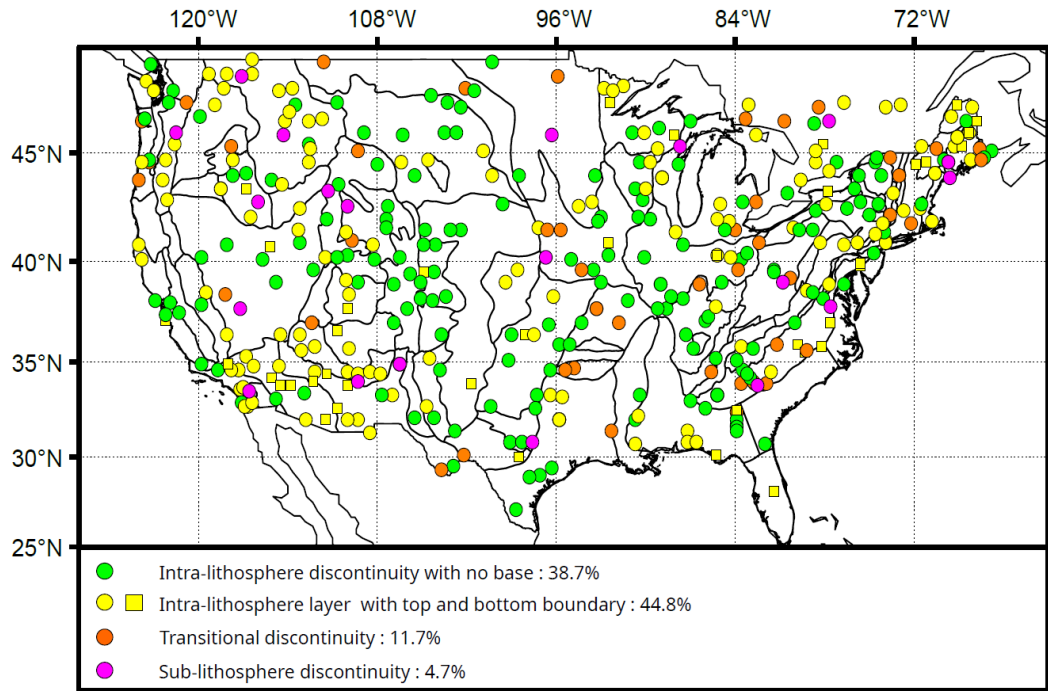


Figure 9. Upper mantle stratification beneath the US. Green circles represent stations with intra-lithosphere discontinuities without a discernable base. Yellow circles represent stations detecting a negative reflector with a deeper positive reflector. Yellow squares represent stations detecting a deeper negative reflector beneath a shallower positive reflector. Magenta-colored stations denote observed transitional discontinuities while orange stations mark sub-lithospheric positive reflectors

The two last classes of upper mantle stratification is: *transitional discontinuities* (across the lithosphere and asthenosphere) and *sub-lithosphere discontinuities*. Both types are not widespread - only 12 % show the detection of transitional discontinuities within the upper mantle. These can either be deeper ‘N-type’ clusters (N3 and N4) which lack a corresponding shallow ‘P-type’ Ps-RF signature (P1 or P2) at the same station (magenta-colored stations in Figure 9). Additionally, these stations lack any deep prominent positive reflectors from sub-lithosphere ‘P-type’ (P3) discontinuities. We therefore classify

these clusters as transitional discontinuities. Lastly, sporadic detection of sub-lithosphere discontinuities (4.7% of stations) with cluster ‘P-type’ (P3) signature constitutes the final class of upper mantle stratification. These are velocity increases confined to a depth of ~ 280 km $\pm$ 30 km .

5 Discussions and Interpretations

Our results, using filtered Ps-RFs, show that the upper mantle beneath the US is stratified. In the broadest sense, this view of the upper mantle’s stratification, particularly within and across the lithosphere, is consistent with previous regional and continent-wide (Abt et al., 2010b; Hopper & Fischer, 2018b; Kind et al., 2020a; Lekic et al., 2011; Lekić & Fischer, 2014; Levander & Miller, 2012; T. Liu et al., 2023) and single-station observations) (Ford et al., 2016; Hua et al., 2023; Krueger et al., 2021a; Long et al., 2017; Luo, Long, Karabinos, & others, 2021; Rychert et al., 2005, 2007b). However, our work differs in some specific details, especially across and below the lithosphere. First, our results refine the sharpness, depth variation, and complexity of intra-lithosphere discontinuities. Second, we show that some of these discontinuities have a top and bottom boundary, while others do not. Lastly, we can show a rare detection of a class of discontinuity transitional between the upper mantle lithosphere and asthenosphere (Kind et al., 2020b) and an elusive sub-lithosphere discontinuity that might be consistent with the X-discontinuity (Pugh et al., 2021). In what follows, we: (1) provide a justification for a new taxonomy of upper mantle stratification, (2) summarize our revised constraints providing the reasoning for why our approach to mantle imaging enables a refined view of upper mantle stratification (in contrast with S-wave conversions or reflections), and (3) discuss the implications of our revised constraints for causal models for upper mantle stratification.

5.1 A New Taxonomy and its Justification

In describing upper mantle structure, we introduce a new taxonomy – a way of organizing and describing how upper mantle stratification varies across the US. This new taxonomy is informed by the descriptive patterns visible in the cluster analysis (Figure 10). We observe that most of the variability in the upper mantle stratification can be organized in three main ways: (1) intra-lithosphere discontinuities with no base, (2) intra-lithosphere layering with a top and bottom-boundary (P-type and N-type), and (3) transitional and sub-lithosphere discontinuities. In previous work by (Abt et al., 2010b; Fischer et al., 2010a; Fischer, Rychert, Dalton, Miller, Beghein, & Schutt, 2020; Kind et al., 2015; Kumar, Yuan, et al., 2012; L. Liu & Gao, 2018; T. Liu & Shearer, 2021) much effort has focused on detecting the mid-lithosphere discontinuities (MLD) using S-wave conversions or S-reverberations. Much of these observations belong to the class of mantle stratification we are calling the intra-lithosphere discontinuity with no base. This discontinuity, which is marked by a velocity drop, has initially been disputed to be an artifact of deconvolution by (Kind et al., 2020a). Here, we confirm this to be a robust detection consistent with the re-analysis of (Krueger et al., 2021b) but now verified across a wider footprint of stations. Apart from the MLD, we observe other discontinuities internal to the lithosphere, some of which look more like layering, hence introducing a new naming scheme that captures this diversity.

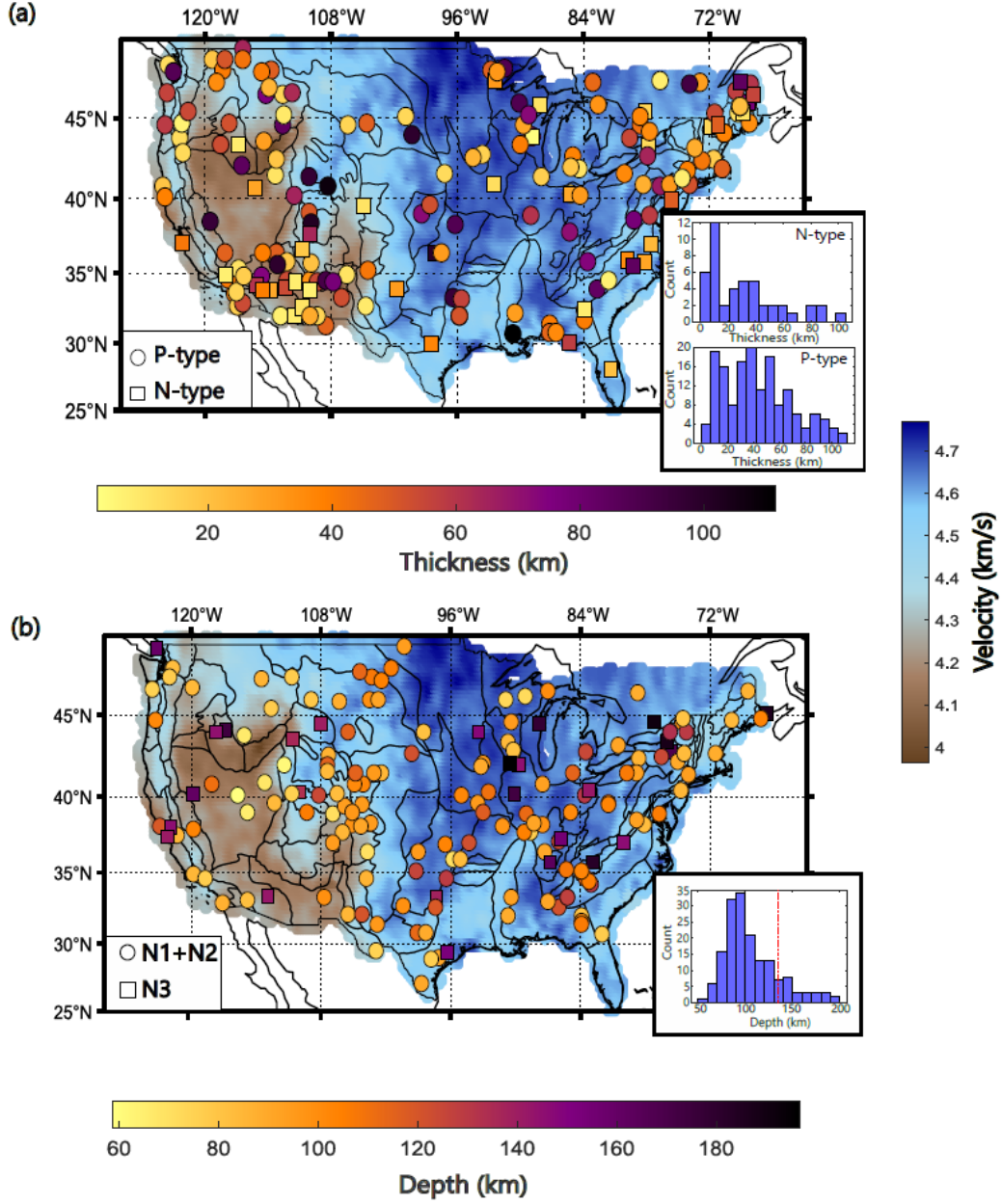


Figure 10. The most common upper mantle stratification across the US. (a) Stations located above mantle with an intra-lithosphere layer with a top or bottom boundary. Inset histogram shows layer thickness and symbols denote P-type and N-type layering (b) Stations located above mantle with an intra-lithosphere discontinuities with no detectable base. Inset histogram shows depth and symbols for N1+N2 and N3 discontinuities (compare with Figure 8). The red line marks the minimum depth for N3 discontinuities

For example, a recent global study conducted by (Hua et al., 2023) revealed a positive velocity gradient located at 150 km. They interpret this to be the base of a global molten asthenosphere layer. In our survey of the continental upper mantle, such a discontinuity is detected across the US, but this type of upper mantle stratification is more likely to be the base of an intra-lithosphere layer (P-type). Our taxonomy here is justified because when ob-

served in the eastern US, this P-type base is within the cold continental lithosphere and cannot be associated with the base of an asthenosphere layer (Figures 9 and 10a). In some rare cases, in the western US, which is more tectonically active, the thermal and shear-velocity structure may argue for a thinner lithosphere with a P-type base reflecting the bottom of an asthenosphere layer (Hansen et al., 2015; Hopper et al., 2014; Priestley et al., 2018). Our final classification – the transitional and sub-lithosphere discontinuities – could be the same discontinuities as that called the lithosphere-asthenosphere boundary in (Kind et al., 2020b) or the X-discontinuity in (Pugh et al., 2021; Srinu et al., 2021). Here, we choose to use the term transitional discontinuity because it does not impose a rheological interpretation to a seismological observation without a clear model. The term sub-lithospheric discontinuity encompasses all possibilities: the Lehmann, the X-discontinuity, and other types of upper mantle stratification.

5.2 Revised Constraints on Upper Mantle Stratification

Re-evaluation of UMD1+3 (Intra-lithosphere discontinuity with no base):

The detection of an intra-lithosphere discontinuity with no base is most consistent with the previous observation of a mid-lithosphere discontinuity (MLD) in the eastern US, often referred to as the lithosphere-asthenosphere boundary (LAB) in the west (Hopper & Fischer, 2018b; Krueger et al., 2021b; T. Liu & Shearer, 2021). Across the US, this discontinuity has previously been reported at a depth of 100 - 140 km (UMD1 and UMD3 in Figures 1b). As pointed out, our new results confirm those obtained using reflected and S-p converted body waves: SP-RFs, SS reflections (Figure 11). The confirmation of this discontinuity with our newly improved Ps-RF technique demonstrates that this type of mantle stratification is a feature that varies little with depth and is sharp enough to be visible at different wavelengths (Figure 6a,6b & 10b). Higher-resolution Ps-RF imaging provides the following revised constraints on this discontinuity: (1) it is more likely to be observed east of the Rockies, (2) the depth varies systematically, over 40 km, with the shallowest discontinuities (60 km) in the west and the deepest (~135 km) to the east (3) the velocity gradient is as sharp as 10 km regardless of region (Figure 10b). These constraints are important for evaluating causal models. Note also that to the west of the US the intra-lithosphere discontinuities are mostly marked by a bottom boundary, unlike to the east (Figure 10a). This observation rules out the need for a distinction between MLD and LAB and suggests that intra-lithosphere discontinuities with no base are a clear feature of cold continental lithosphere that has not been thermally modified over much of the US's tectonic history and yet can maintain a near-universal discontinuity that seems to be unrelated to the history of continental formation.

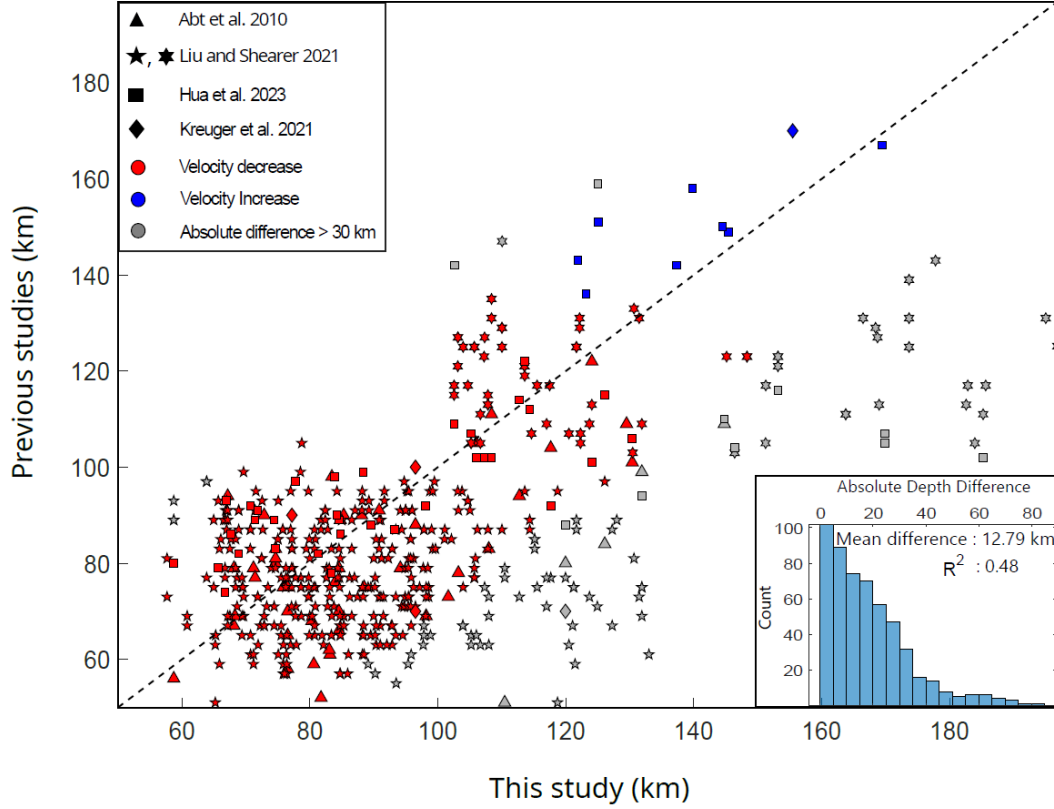


Figure 11. A comparison of previous body-wave studies of upper mantle discontinuities and this study. The scatter plot shows depth estimates for negative and positive discontinuities for similar locations. A one-to-one line (black dashed line) means that our results are consistent with previous work. Outliers are indicated in grey. Sample filtered Ps-RFs for two stations US.ECSD and IU.RSSD previously studied by (Krueger et al., 2021b; T. Liu et al., 2023) can be seen in Figure S9.

Re-evaluation of UMD2 (Intra-lithospherelayering): The observation of an intra-lithospheric layering with a discernible top and bottom boundary may be consistent with the PVG-150 km detected by (Hua et al., 2023). However, this interpretation is only consistent for stations located to the west of the Rockies. The spatial clustering along regions with recent magmatic activity – south of the Colorado Plateau and within the Columbia River basalt suggests that in these regions alone – not in the eastern US – do you have a lithosphere that may be thermally modified in such a way as to produce a partial molten layer that results in a shallow velocity drop with a discernable velocity increase at the bottom boundary of a rheological weak asthenosphere layer. In the eastern US, however, such an interpretation is not consistent with the observations, and a new model is required. Also, in a few locations we observe an even puzzling layering that is opposite of the partial melt interpretation—a velocity increase above a velocity increase (N-type).

5.3 Improved Visibility of the Transitional and X-Discontinuity

As we have seen, discontinuities internal to the lithosphere are easily detectable. However, the high-frequency body-wave signature of the boundary between a lithosphere and an asthenosphere has proved elusive, especially beneath the Archean or Proterozoic lithosphere in the eastern US. This is probably due to the gradual thermal and compositional structure

leading to the lack of a sharp boundary at a depth of 250 km (Dalton et al., 2017; Fischer, Rychert, Dalton, Miller, Beghein, & Schutt, 2020; Priestley et al., 2018). In the continent-wide and single-station studies (Kind et al., 2020a; Krueger et al., 2021b; Mancinelli et al., 2017) the detections of a transitional discontinuity marked by a velocity drop are referred to as the craton LAB and are most clearly observed by (Kind et al., 2020a) in the southeastern region of the US and on craton boundaries by (Krueger et al., 2021b). In our case, the detection of a deep discontinuity is rare and spatially variable (Figure 9, S5c, S5d, and S6c, S6d). As a result, we hesitate to make any inference on the driving mechanisms for its visibility.

Similarly, positive velocity gradients have previously been detected within and beneath the lithosphere. For detections within the lithosphere, the favored interpretation is the signature of paleo-subduction beneath the Superior craton, craton assembly through imbrication and underplating (Kind et al., 2020a). Although we observe these discontinuities in the lithosphere, the spatial resolution is not high enough to place constraints on their tectonic drivers. Most of our detections are associated with the top or bottom boundary of a lithospheric layer rather than a structural feature of continental assembly. The most compelling observation is the rare detections of sub-lithosphere discontinuities at 250–300 km (Figures 7c and S4c). We interpret these as an X-discontinuity similar to that seen globally by (Pugh et al., 2021). The correspondence between the location of our detection and the yellow-stone hotspot lends further strength to this interpretation (Figure S6c). We note that the interpretation of a shallower positive discontinuity as the Lehmann discontinuity is not supported by our results. Future work is needed to evaluate if this discontinuity is preferably associated with anisotropy (Ford et al., 2016; Gaherty & Jordan, 1995; Gung et al., 2003).

5.4 A Case for Models consistent with Revised Constraints

Based on our new constraints we re-evaluate the different models proposed to explain intra-lithosphere and transitional discontinuities (Karato & Park, 2018; H. Yuan & Romanowicz, 2018). They include partial melting (Hua et al., 2023; Rader et al., 2015) chemical stratification or metasomatism (Krueger et al., 2021b; T. Liu et al., n.d.; Rader et al., 2015; Saha et al., 2021; Selway et al., 2015a), variable anisotropy (Wirth & Long, 2014a; H. Yuan & Levin, 2014; H. Yuan & Romanowicz, 2010), and elastically accommodated grain-boundary sliding (Karato et al., 2015). Many of these models were proposed shortly after the early detection of lithosphere discontinuities when a detailed view of upper mantle stratification was unavailable (Saha et al., 2021; Saha & Dasgupta, 2019). The new observations suggest that some models are more consistent with discontinuities without a base while others are more consistent with those with a base.

5.4.1 *Intra-Lithosphere Discontinuities with no Base*

The simplest class of mantle stratification is the intra-lithospheric discontinuity with no base. This discontinuity, more likely to be observed in cold continental lithosphere, has a very systematic behavior that makes it hard to reconcile with models that prescribe a unique tectonic history – e.g., metasomatism or imbrication and underplating during craton assembly. For example, a discontinuity that is relatively sharp with no bottom boundary and is more likely to be observed east of the Rockies at a depth that varies systematically: the shallowest discontinuities (60 km) to the west and deepest (135 km) to the east. This near-universal discontinuity in the cold continental lithosphere leads us to prefer the attenuation-related model of (Karato et al., 2015) for this class of mantle stratification. As conceived, this model can reduce velocities across the US at sub-solidus temperatures either through thermal relaxation or hydration, without the need for a deeper increase in velocities, ruling out the need for a bottom base. The depth dependence of temperature and hydration in the grain-boundary sliding model can explain the deepening of this discontinuity. It is hard to reconcile this observation with the metasomatic model.

5.4.2 *Intra-Lithosphere Layering with a Top and Bottom Boundary*

The second class of mantle stratification is the intra-lithospheric discontinuity with a top and bottom boundary. In this class, the easiest to explain is the P-type boundary – a velocity increase below a velocity decrease. Because this discontinuity is more likely to be observed in the tectonically active and recently magmatic regions or along the Appalachians, we are inclined to prefer the partial melt or metasomatic model to explain this class of mantle stratification. If the lithosphere is significantly thermally perturbed, with the infusion, into the mantle, of low-velocity iron-rich or fluid-rich minerals, partial melting or metasomatism might lead to a reduction in velocity, below which an increase in velocity, detected as a bottom base, will be observed (Karato & Park, 2018; Saha et al., 2021). The reason why this bottom base has gone undetected until now might be related to the low-frequency content of Sp-RFs with or without deconvolution (Kind & Yuan, 2018b; X. Yuan et al., 2006) compared to the higher-resolution Ps-RFs (T. M. Ougboji et al., 2013; T. Ougboji, Zhang, et al., 2023). Also, in the S-reflection technique used by (T. Liu & Shearer, 2021; T. Liu et al., 2023) the resolution is limited to shallow discontinuities (< 150 km) due to the ambiguity of distinguishing source-side and receiver-side reflections. The N-type boundary – velocity decrease below a velocity increase is harder to explain. One simple model is that this reflects relics of craton assembly or crustal underplating. A thickened crust, or subducted lithosphere embedded within a lower velocity layer is one way to explain this observation. The geological preference for regions where such a tectonic scenario can be envisioned is another reason for our preference for this model.

5.4.3 *Transitional Discontinuities and the X*

The final class of mantle stratification is transitional and sub-lithosphere discontinuities. Strictly speaking, these discontinuities are of different types and are rare: negative velocity gradients for the transition across a lithosphere to asthenosphere transition and a positive velocity gradient for the sub-lithosphere discontinuity. For the discontinuity associated with the lithosphere-asthenosphere transition, the current statistics suggest that this discontinuity is more likely to be observed in the cold continental lithosphere in the eastern US (Figures 9 and S6d). The sparsity of observations should be related to the small velocity drop at these depths due to weak thermal and compositional gradients at these depths (Fischer et al., 2010b). The rarity of the sub-lithosphere X-discontinuity at 300 km is also a clear indication that phase transformations or recycling of basalts at hotspots are very unlikely across the US (Figure S6c).

5.5 *Current Limits, Next Steps: Hales, Lehmann and Anisotropy*

In our current assessment of upper mantle stratification, the CRISP-RF approach has produced a higher-resolution and improved view of upper mantle stratification. This success is due to improvements in frequency content as well as the availability of long-running stations that allow for wavefield separation of deep mantle conversions from shallow crustal reverberations. Despite these improvements, our taxonomy of upper mantle stratification does not yet explore anisotropy as do some recent studies using anisotropic Ps-RFs (Abt et al., 2010b; Ford et al., 2016; Park & Levin, 2016a; Wirth & Long, 2014a; H. Yuan & Levin, 2014). This is because the radon-transformed Ps-RFs we use assume isotropic layering. A generalization of the CRISP-RF methodology to investigate anisotropy is a natural next step. We do argue that in future generalization of our methodology to investigating anisotropy, back-azimuthal harmonic decomposition, as described in (Levin & Park, 1998; Park & Levin, 2016b; Bostock, 1997, 1998) should be applied only after isotropic layer-stripping and attenuation of crustal reverberations using CRISP-RF. An improved method for investigating anisotropy not contaminated by shallow crustal reverberations will allow us to evaluate models that invoke anisotropy for both intra-lithosphere and sub-lithosphere discontinuities, e.g. Lehmann, Hales, and Gutenberg discontinuities (Ford et al., 2016; Gaherty & Jordan, 1995; Gung et al., 2003; Deuss, 2009; Deuss & Woodhouse, 2004)

6 Conclusions

The stratification of the upper mantle beneath the US is investigated using high-resolution Ps-converted waves after filtering out shallow crustal reverberations. After careful data curation, using 417 of the best stations that span a diversity of physiographic provinces, followed by polarity-dependent filtering, sequencing, and clustering, we obtain a new and improved taxonomy of upper mantle stratification. We observe that the most dominant type of upper mantle stratification (84% of station inventory) is within the lithosphere – about half of which are discontinuities without a base and the other half are layers with a top and bottom boundary. A re-evaluation of causal models based on our revised constraints suggests that some class of models better explain the former than they do the latter. The remainder of our stations (16%) show rare detections of discontinuities transitional between the lithosphere and the asthenosphere and an X-type sub-lithosphere discontinuity. This suggests a limited role of such discontinuities in explaining upper mantle stratification. Future work should evaluate our taxonomy on a global scale and revisit the evaluation of causal models, especially with regards to anisotropy.

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8 Open Research

The dataset used in this study can be retrieved from IRIS using Obspy’s routines for mass download. The codes and results for waveform processing is accessible in the Github repository linked to the <https://doi.org/10.5281/zenodo.10452228>. The repository contains all metadata information, Ps-RF results and station classification.

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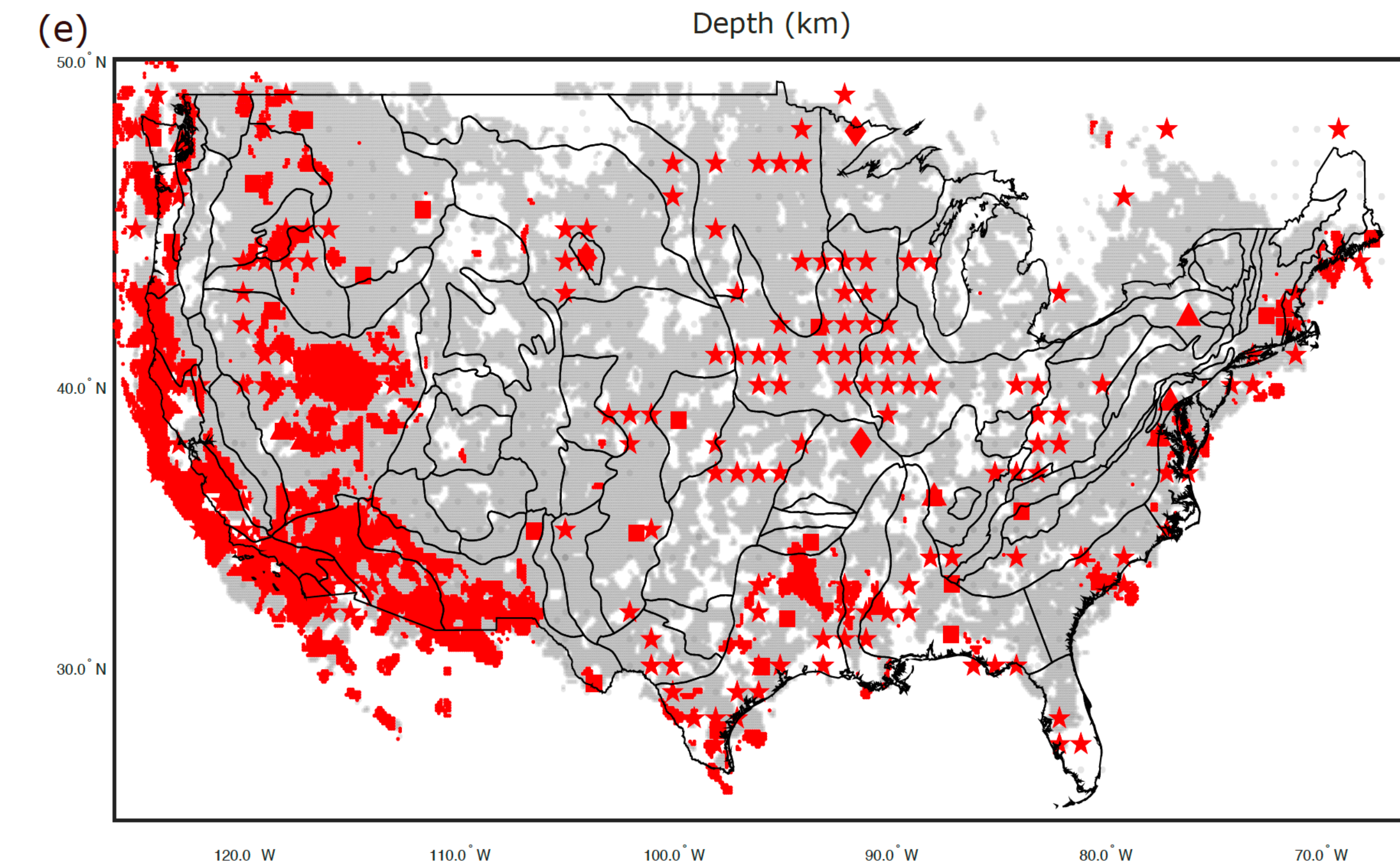
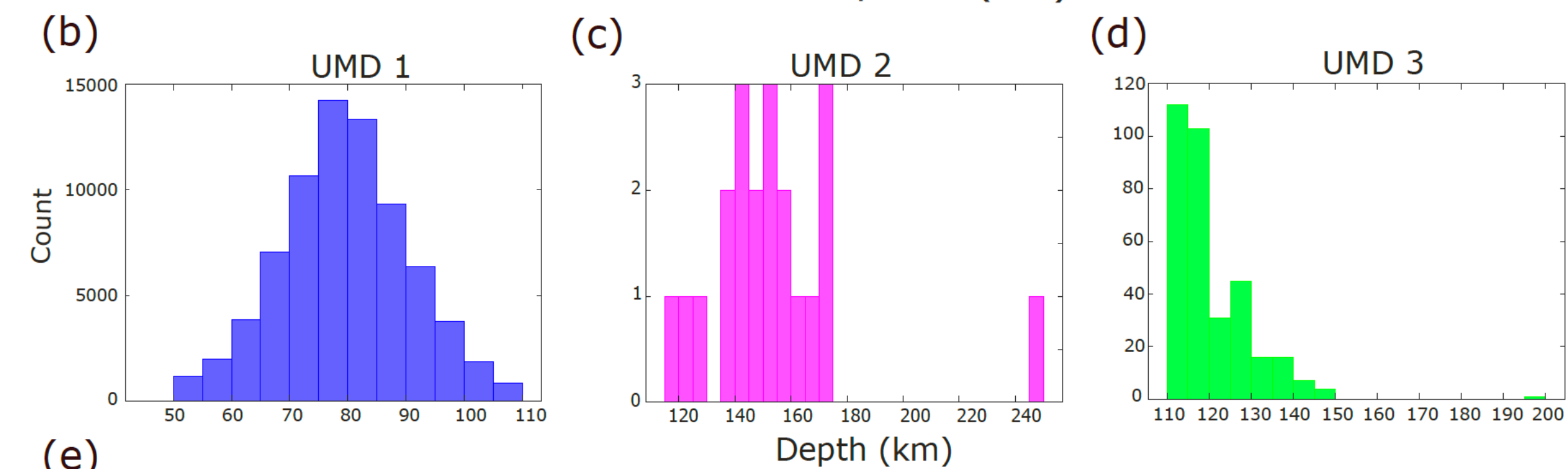
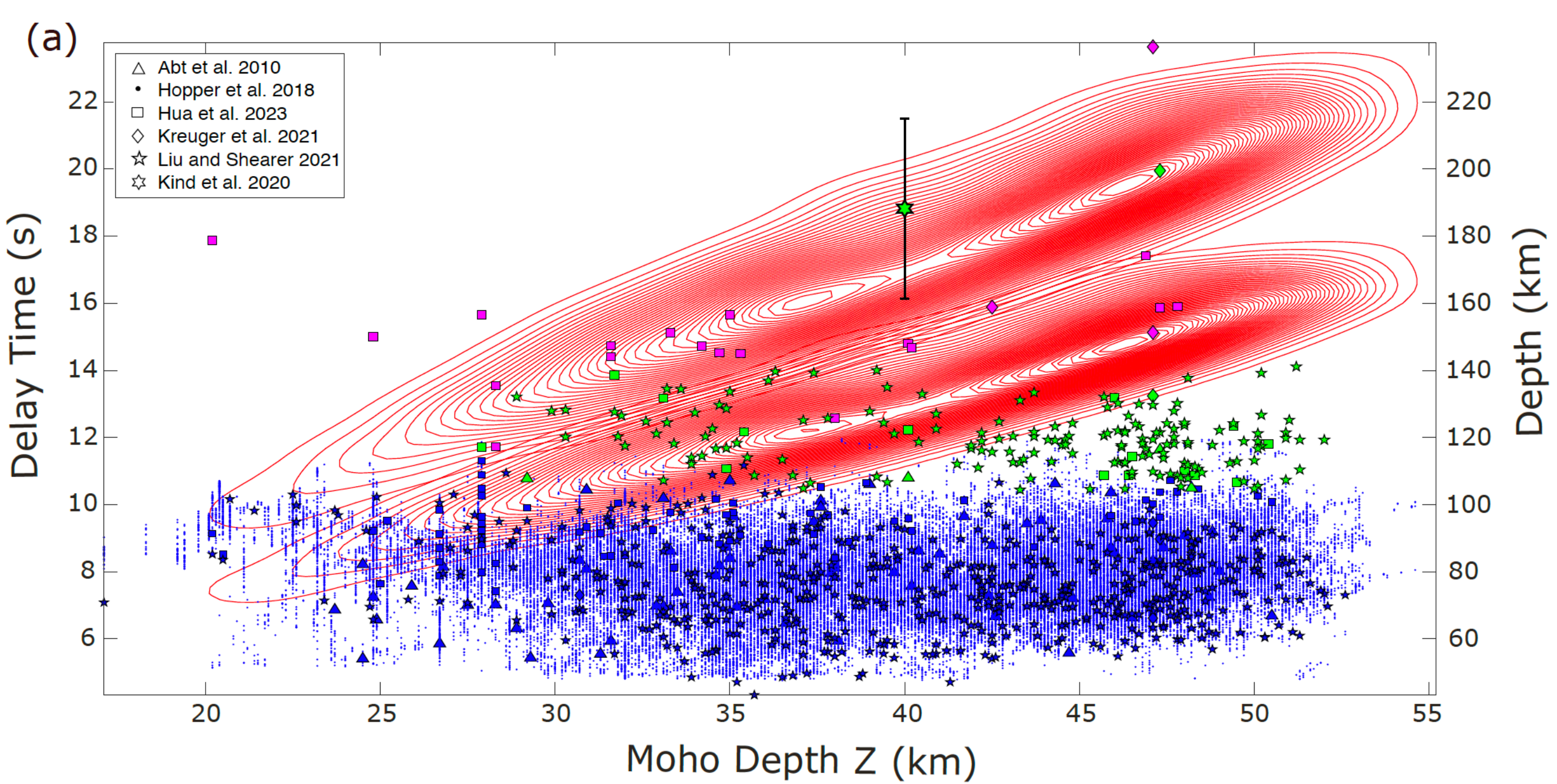
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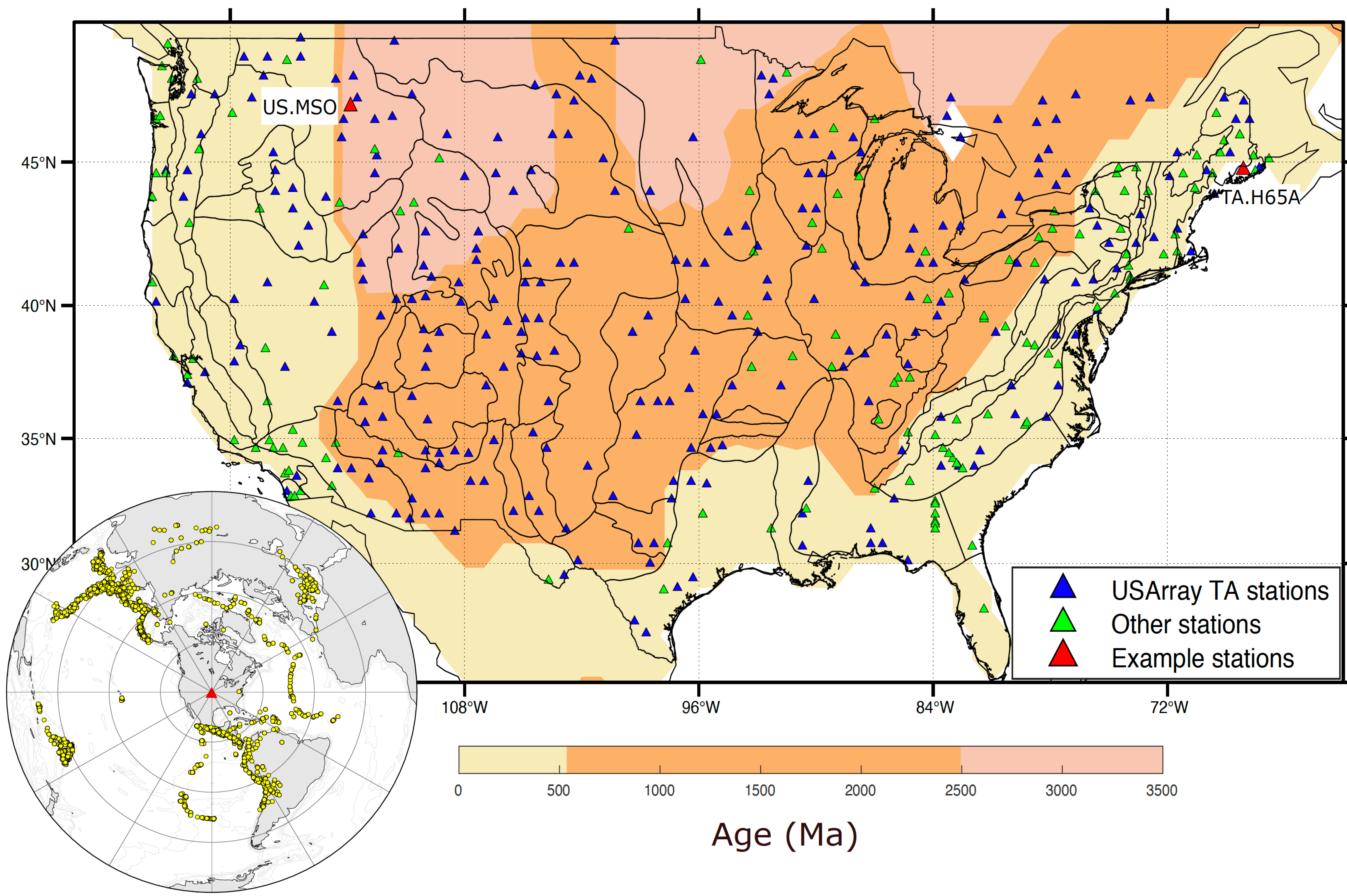
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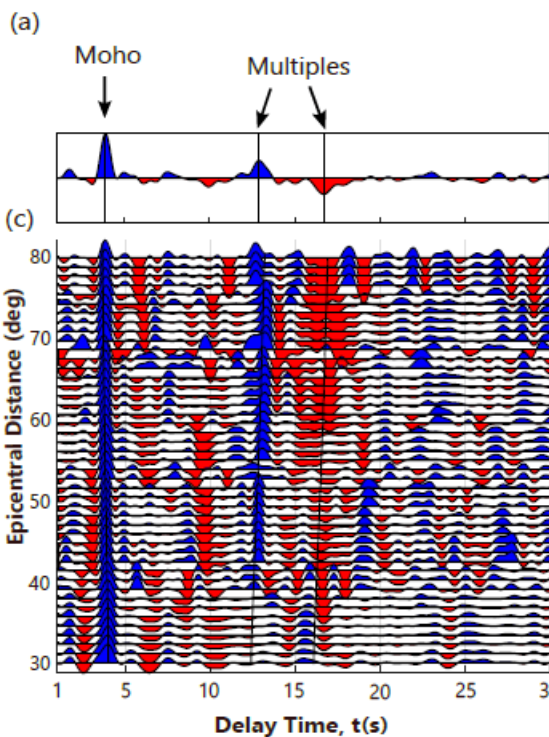
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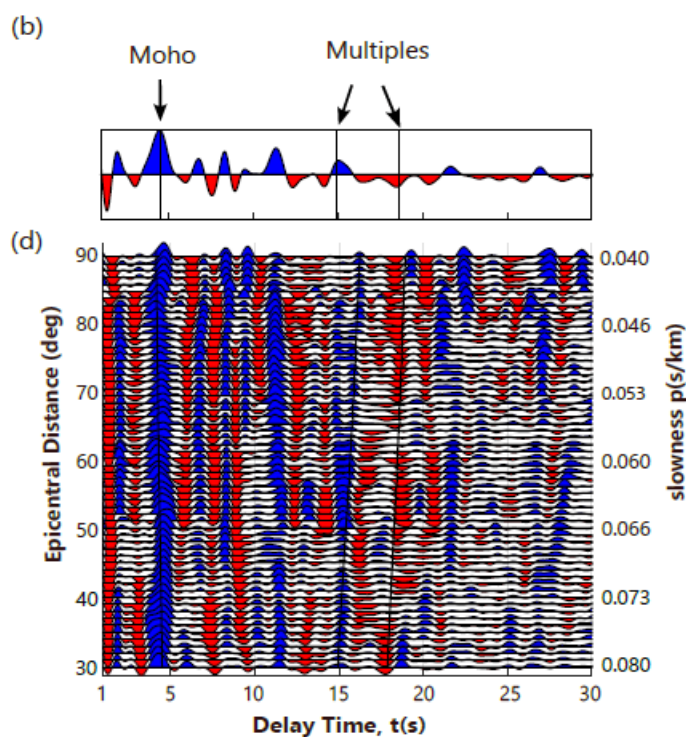


Before time-shift

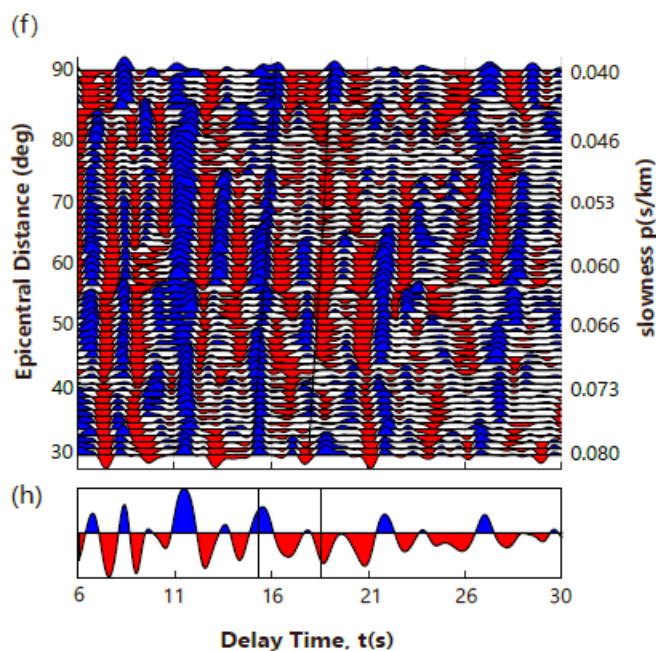
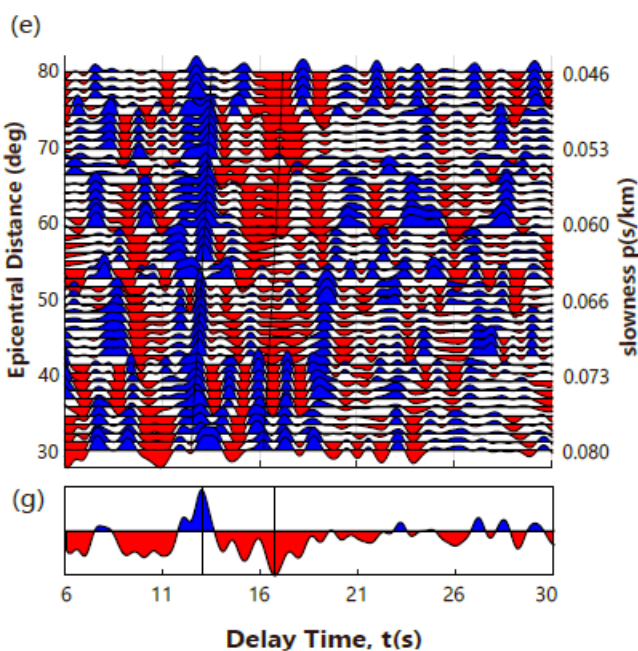
TA.H65A

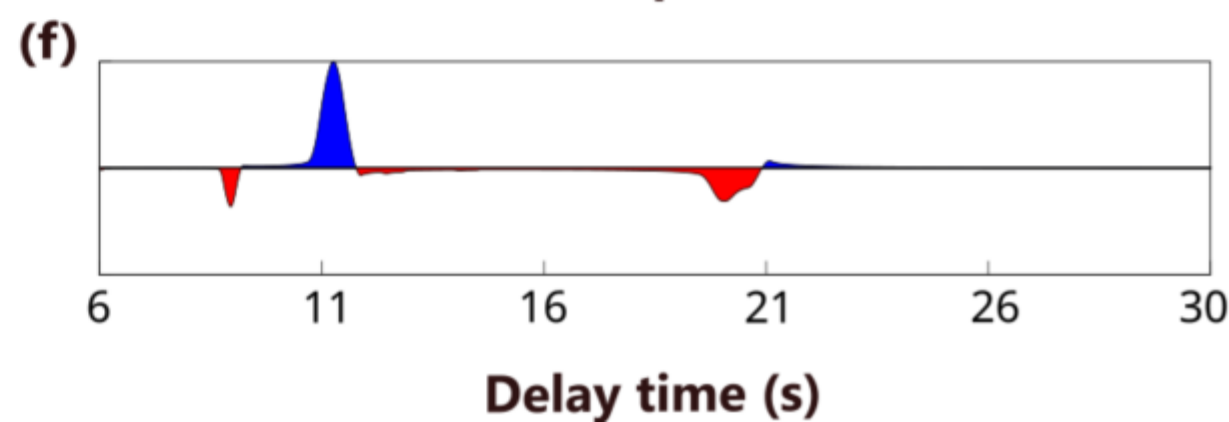
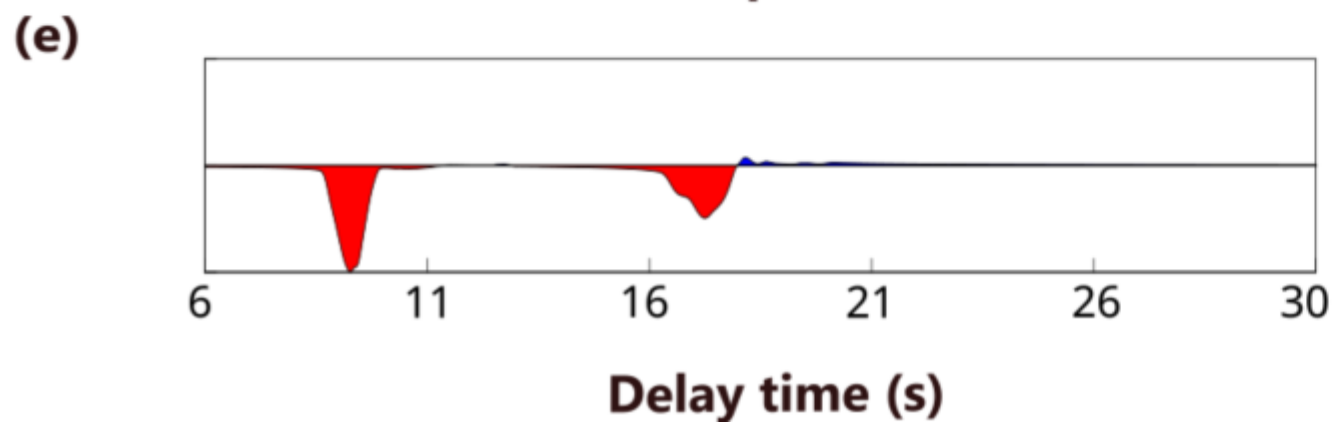
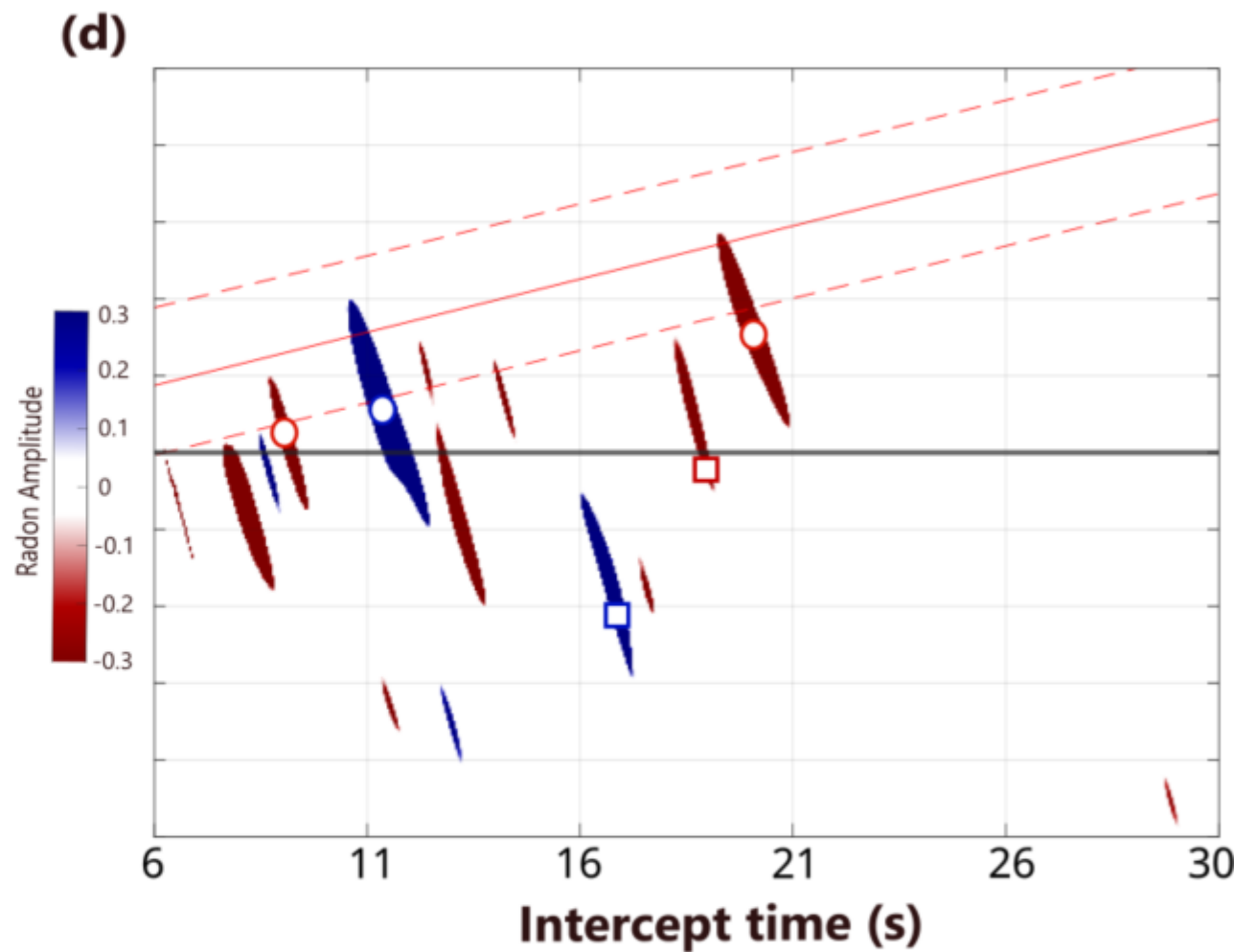
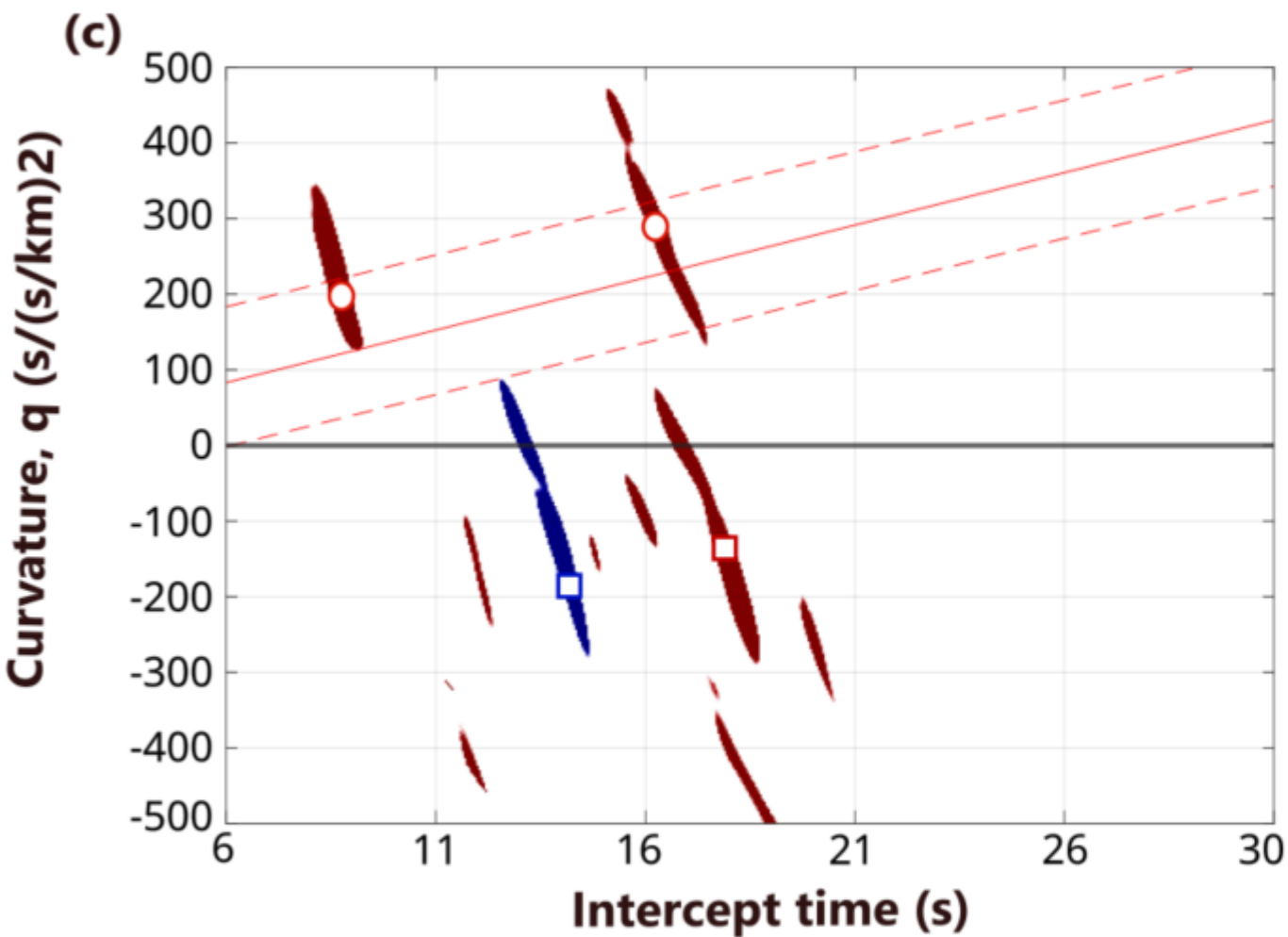
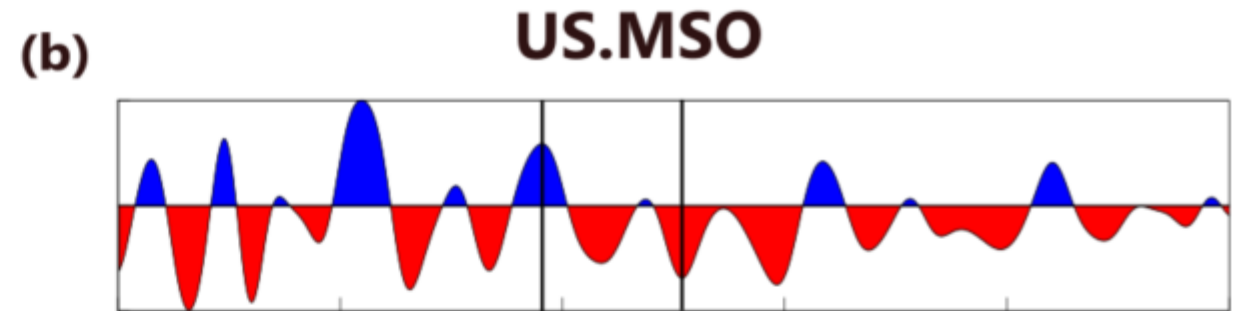
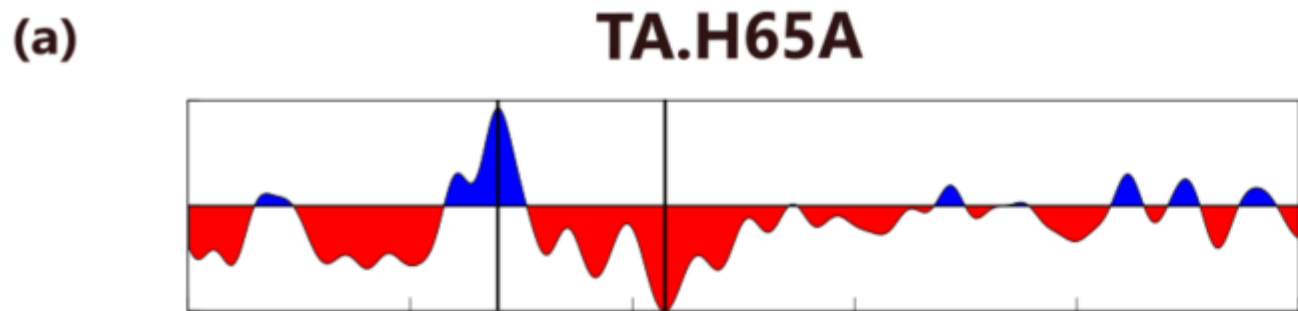


US.MSO



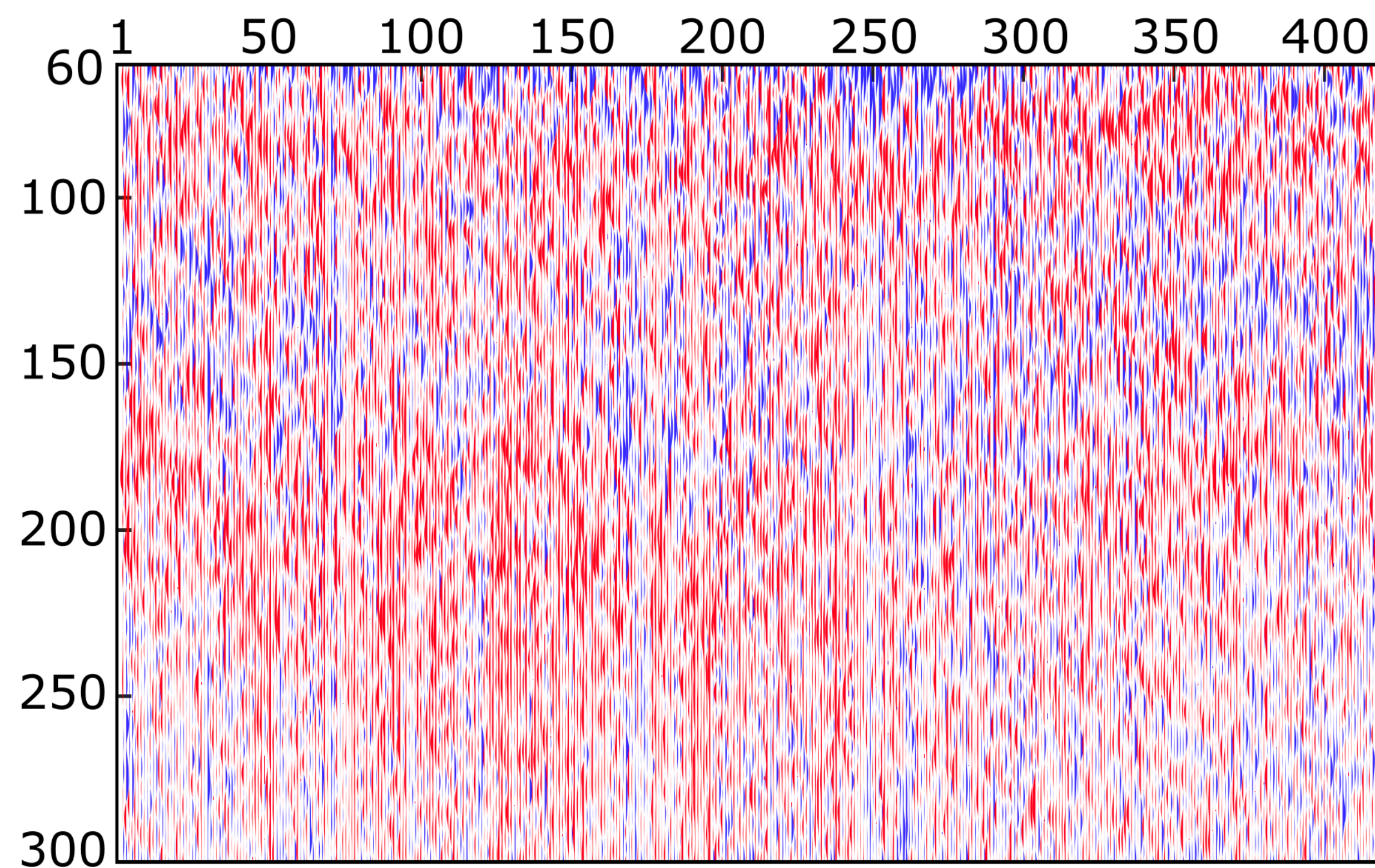
After time shift



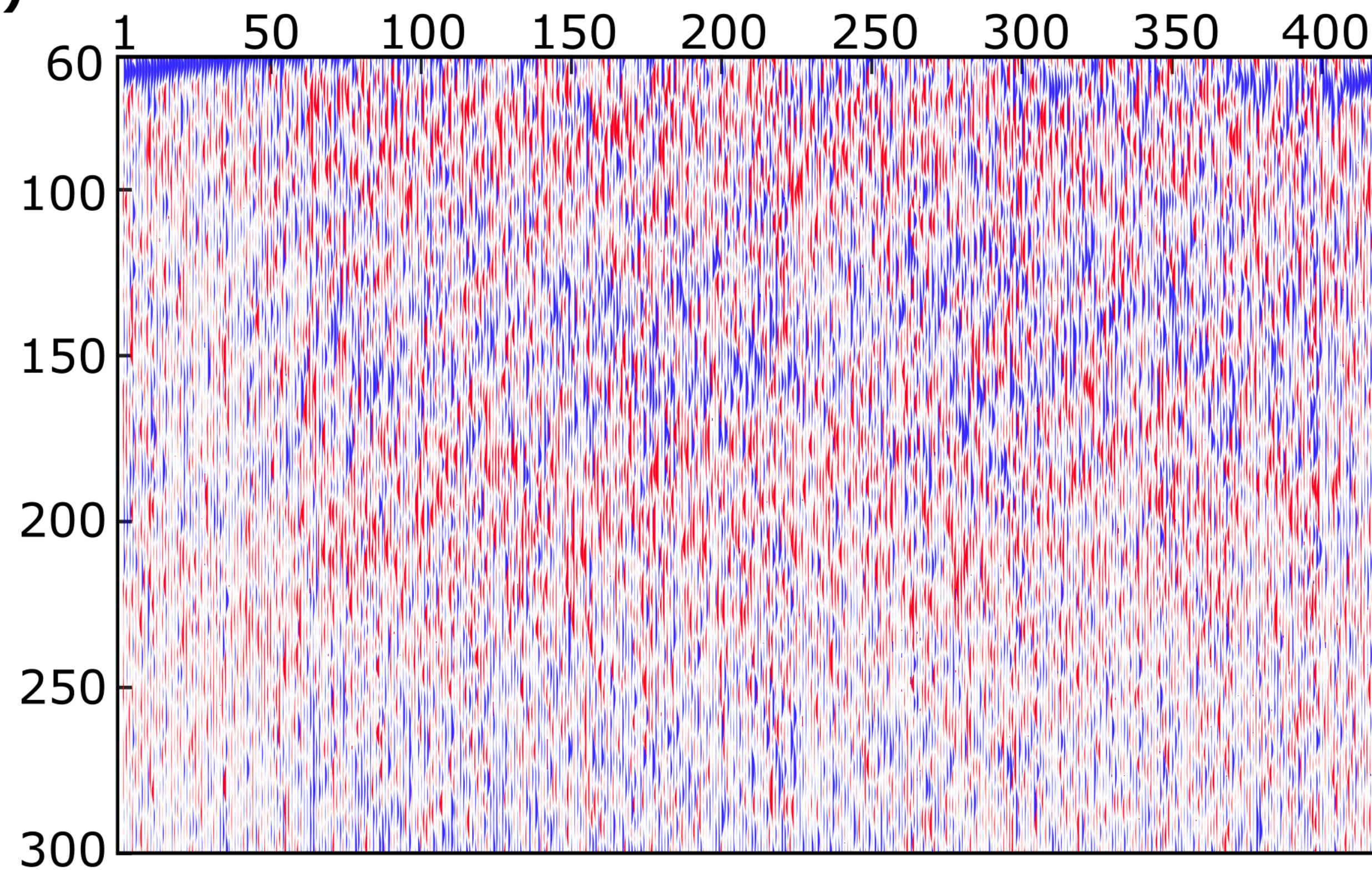


Station Index

(a)

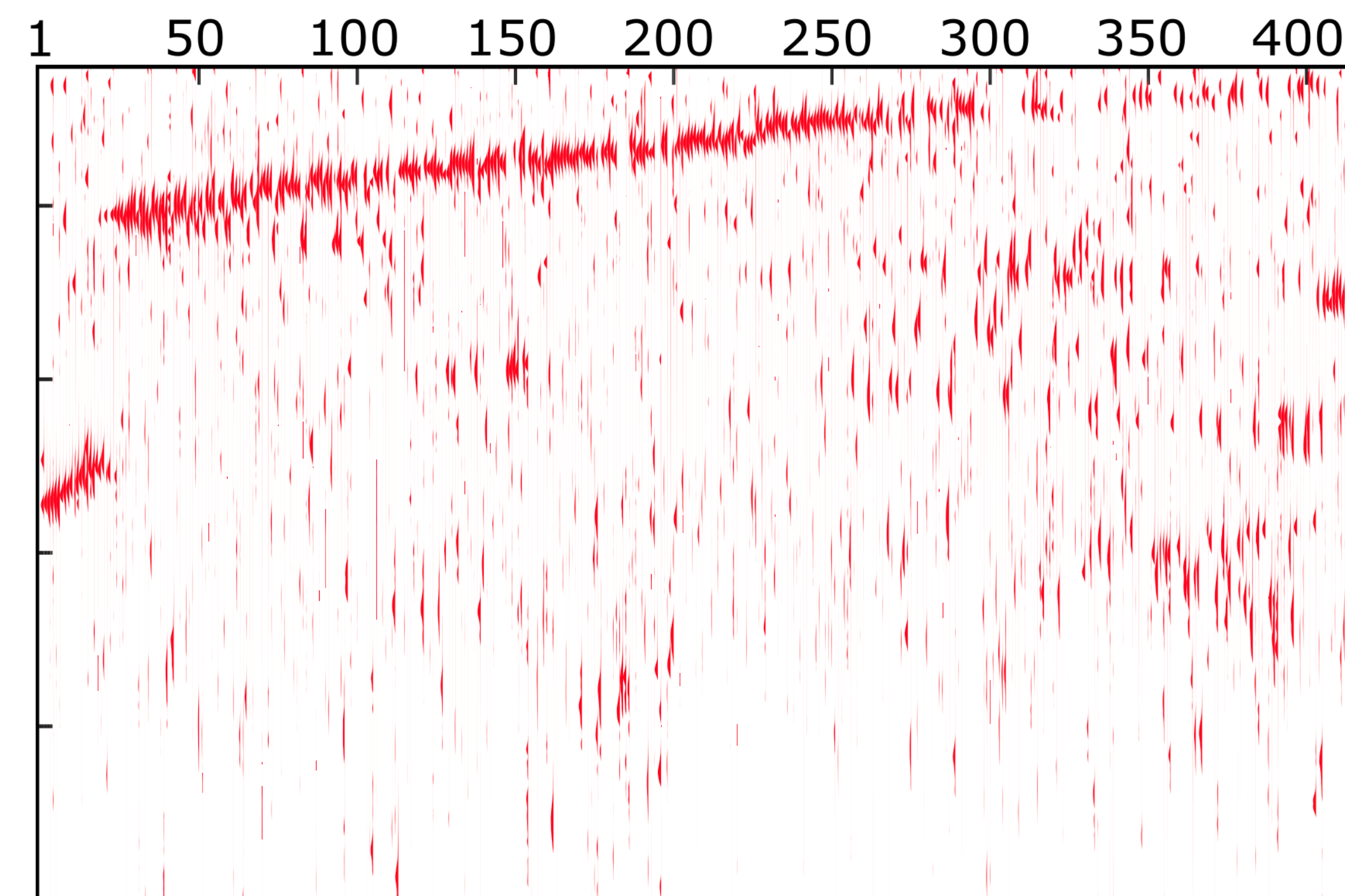


(b)

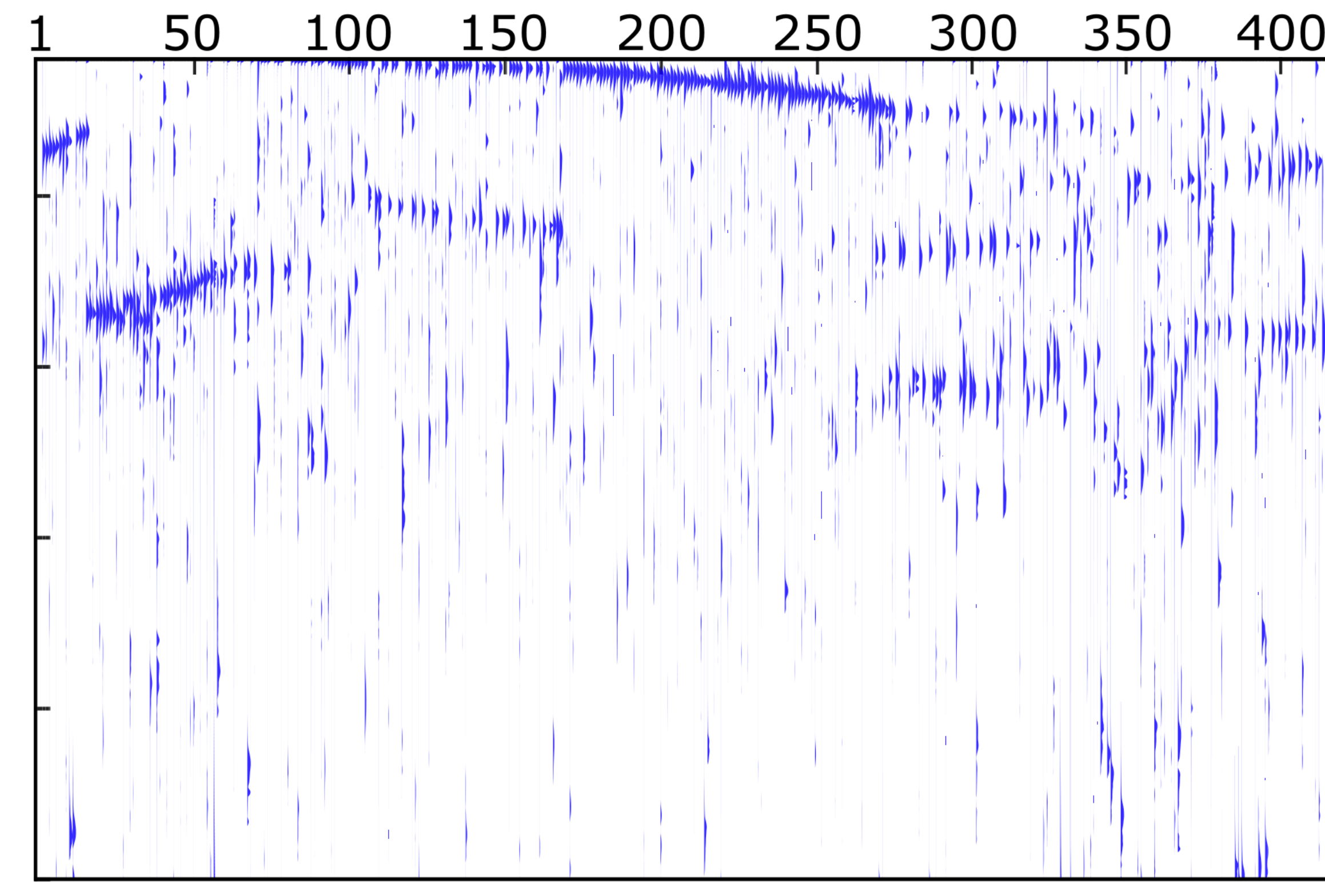


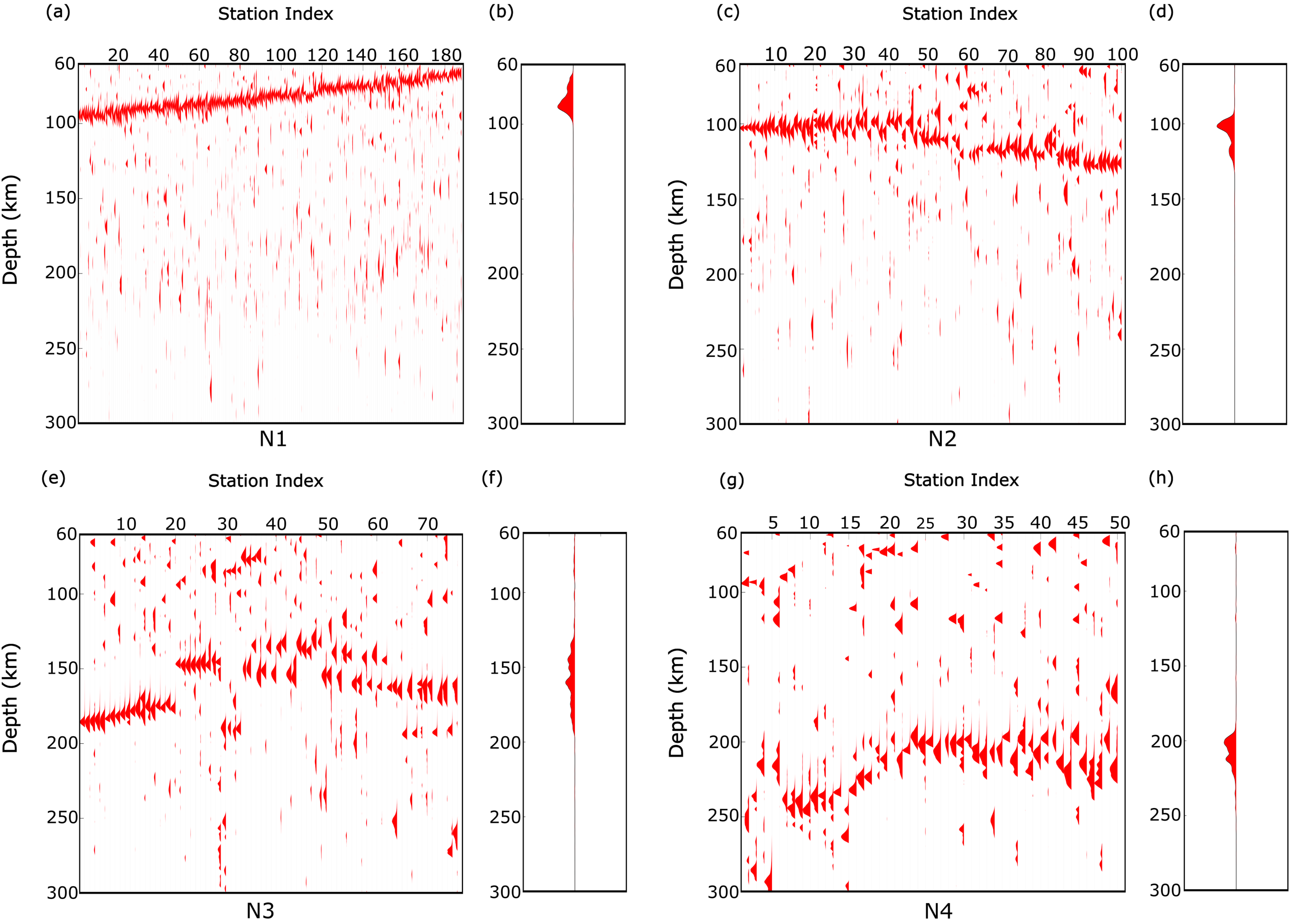
Station Index

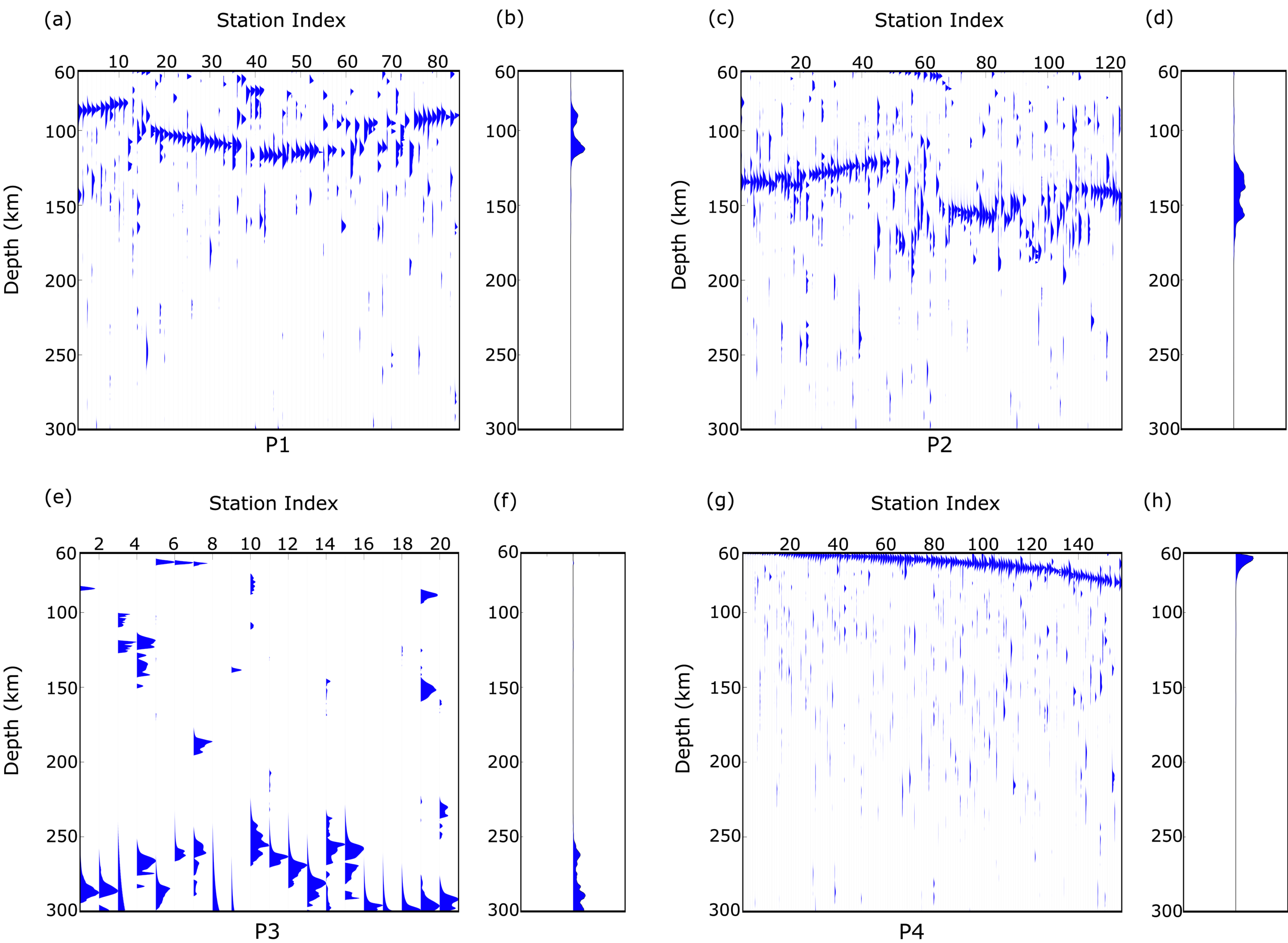
(c)

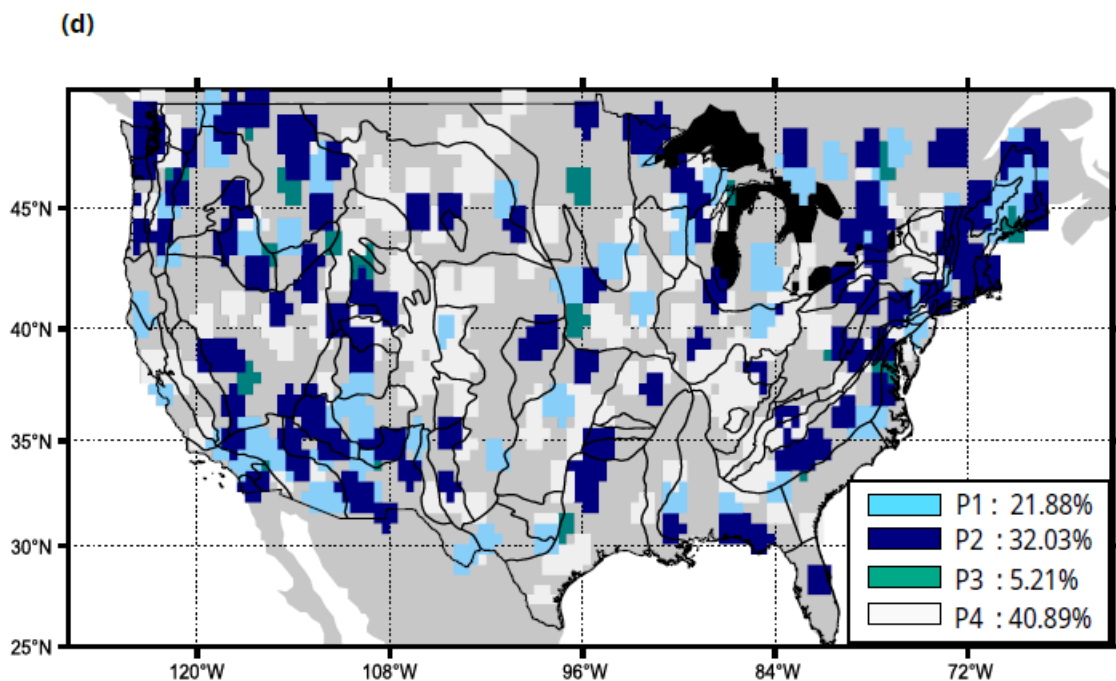
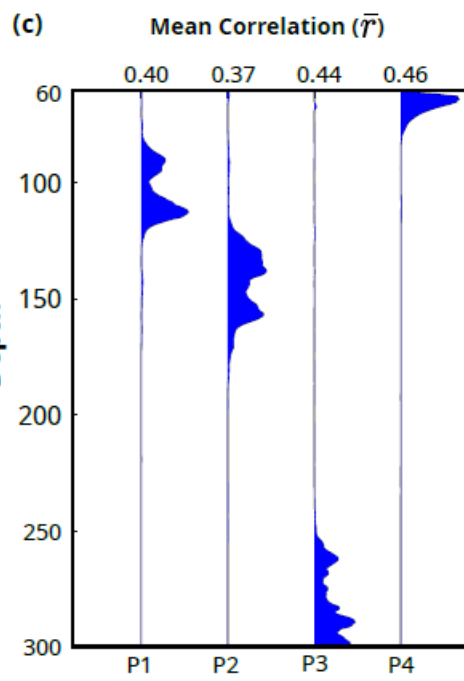
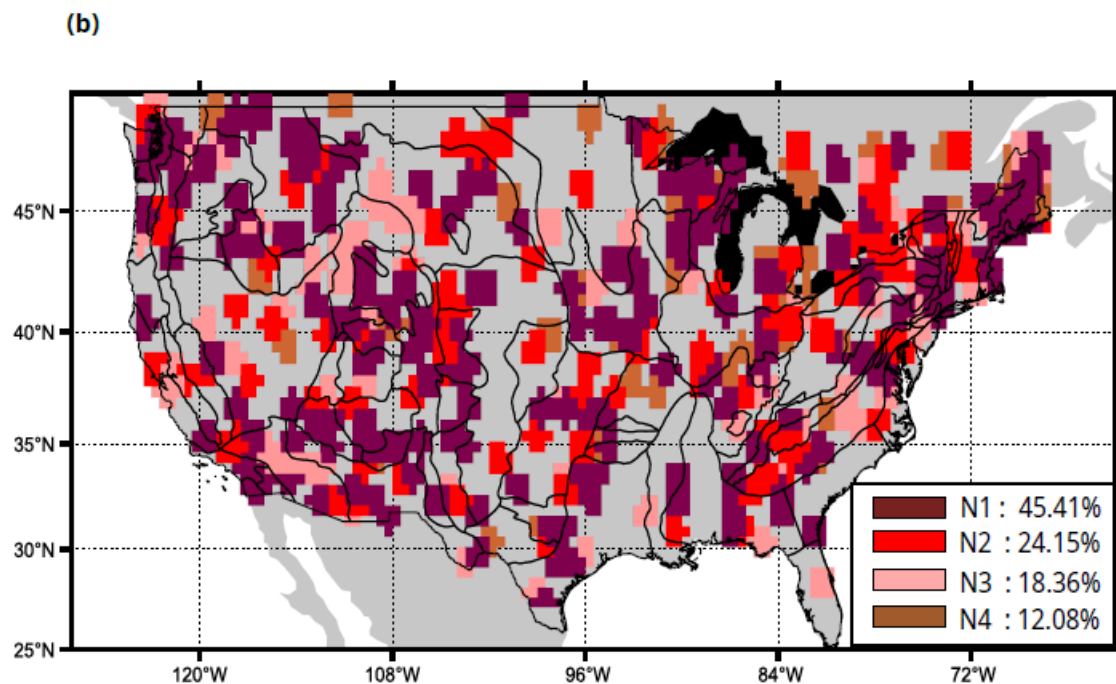
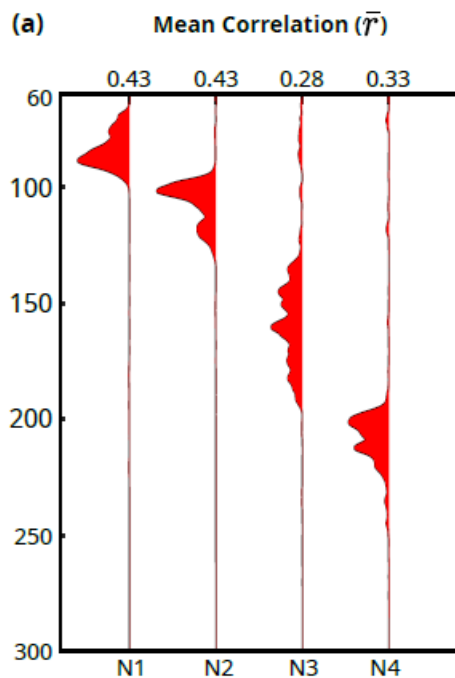


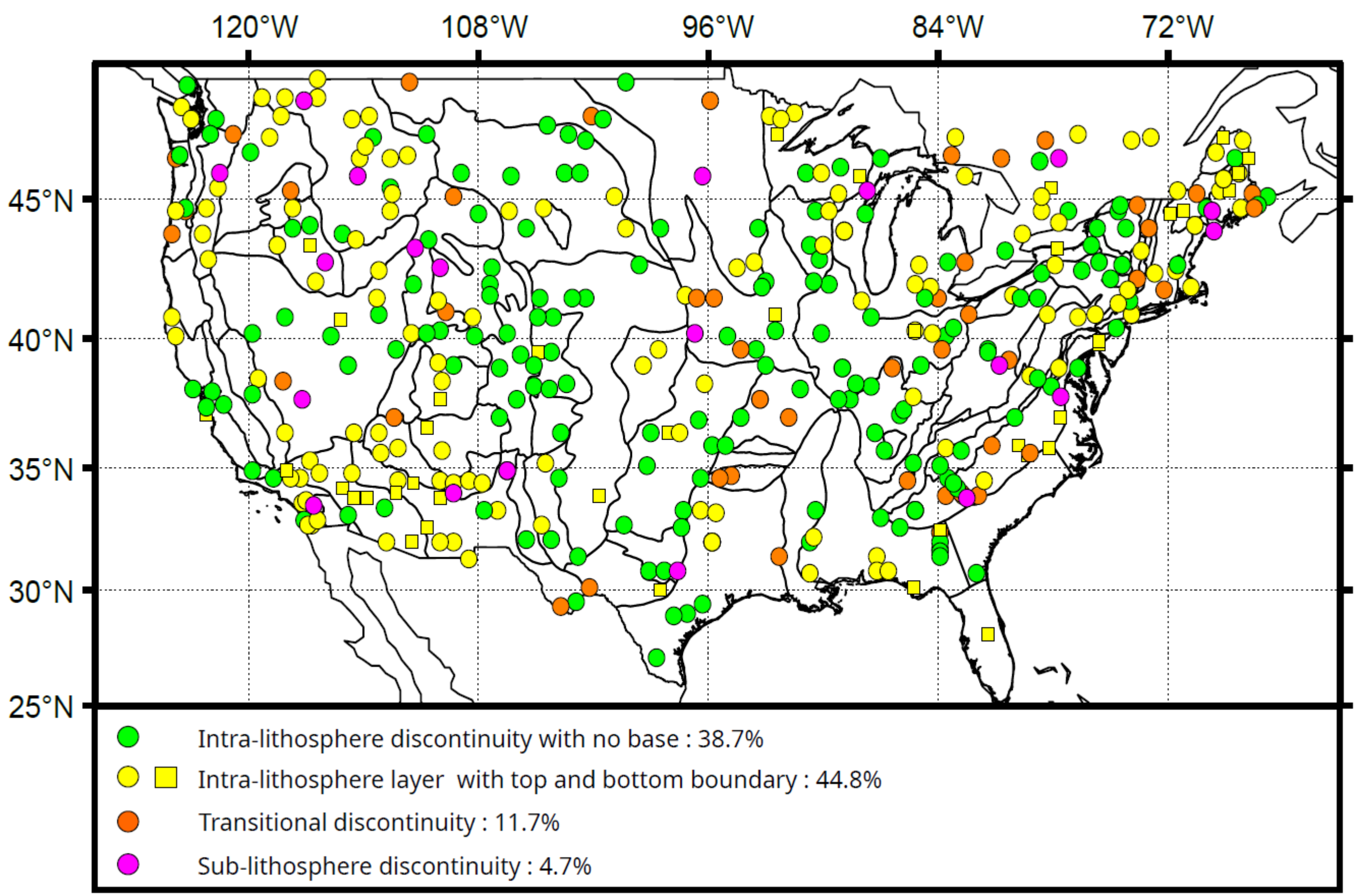
(d)



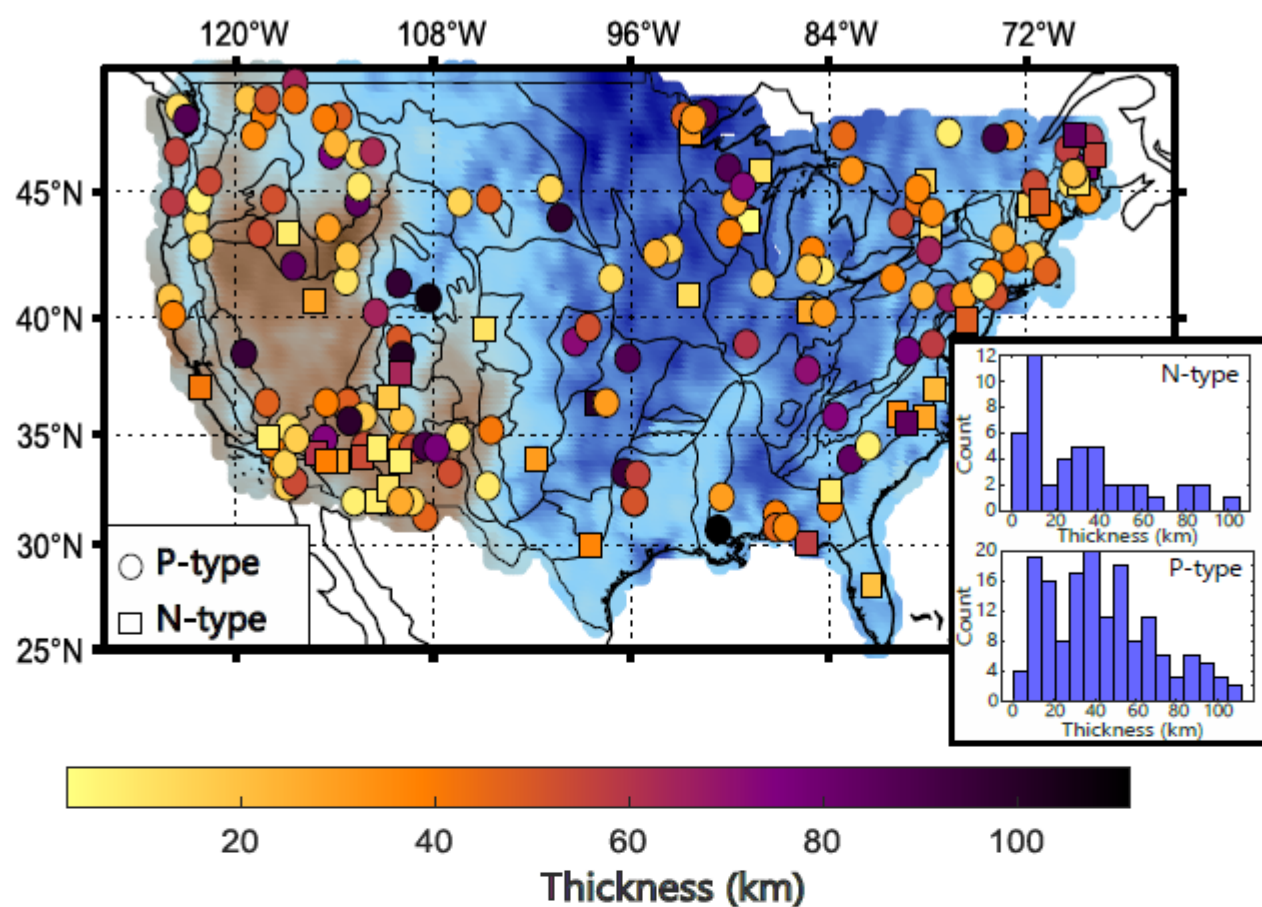




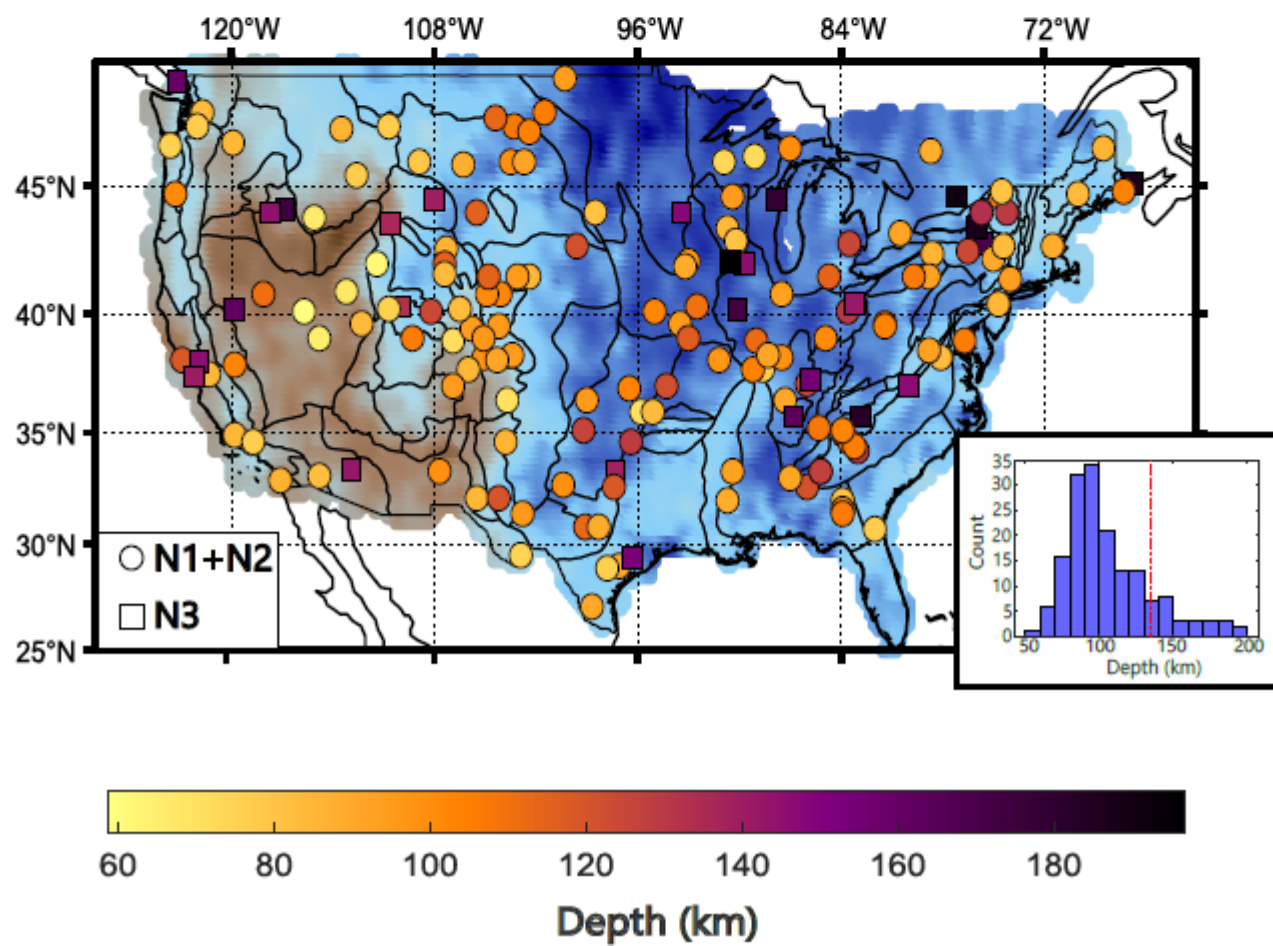




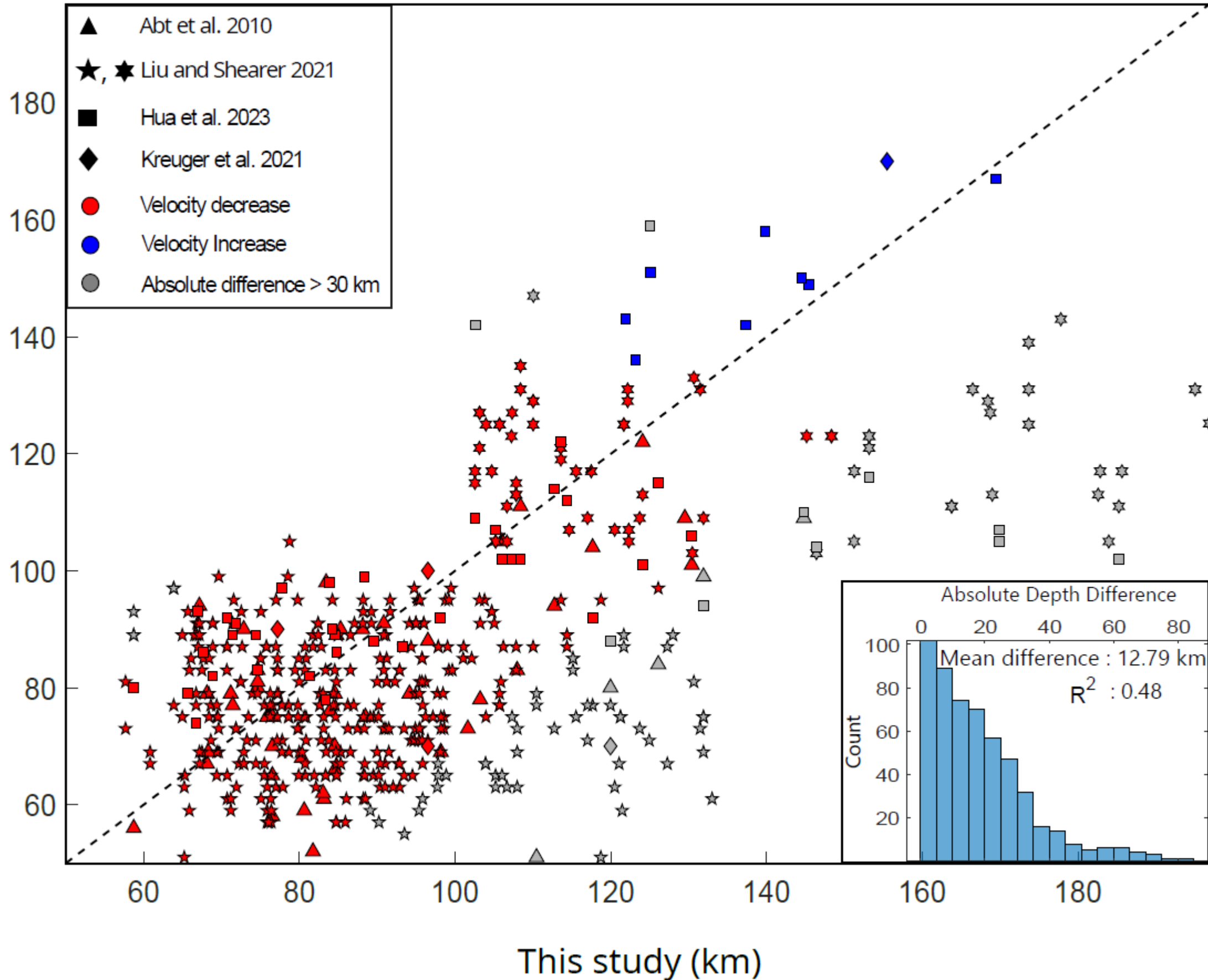
(a)



(b)



Previous studies (km)



A Taxonomy of Upper-Mantle Stratification in the US

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Key Points:

- Upper mantle stratification is constrained using CRISP-RF and machine learning
- Stratification is classified into intra-lithospheric, transitional and sub-lithospheric
- High-resolution constraints allow the evaluation of different causal models.

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Abstract

The investigation of upper mantle structure beneath the US has revealed a growing diversity of discontinuities within, across, and underneath the sub-continental lithosphere. As the complexity and variability of these detected discontinuities increase - e.g., velocity increase/decrease, number of layers and depth - it is hard to judge which constraints are robust and which explanatory models generalize to the largest set of constraints. Much work has been done to image discontinuities of interest using S-waves that convert to P-waves (or reflect back as S-waves). A higher resolution method using P-to-S scattered waves is preferred but often obscured by multiply reflected waves trapped in a shallow layer, limiting the visibility of deeper boundaries. Here, we address the interference problem and re-evaluate upper mantle stratification using filtered Ps-RFs interpreted using unsupervised machine-learning. Robust insight into upper mantle layering is facilitated with CRISP-RF: Clean Receiver-Function Imaging using Sparse Radon Filters. Subsequent sequencing and clustering of the polarity-filtered Ps-RFs into distinct depth-based clusters, clearly distinguishes three discontinuity types: (1) intra-lithosphere discontinuity with no base, (2) intra-lithosphere discontinuity with a top and bottom boundary (3) transitional and sub-lithosphere discontinuities. Our findings contribute a more nuanced understanding of mantle discontinuities, offering new perspectives on the nature of upper mantle layering beneath continents.

Plain Language Summary

Early investigations of the mantle rocks in the US indicate intricate layering. However, uncertainties remain regarding the origins of these structures. Here, we re-examine rock stratification using a fine-resolution approach. We use short waves that improve our ability to identify the depth of thin layers and sharp transitions in rock properties. Until now, these methods haven't been used due to interference with waves trapped in the near-surface layers. We address this problem with machine learning and the CRISP-RF (Clean Receiver Function Images Using Sparse Radon-Filters) method. CRISP-RF filters out the waves trapped in the crust and machine learning reveals spatially coherent patterns. We find evidence for three main classes of rock layering: (1) sharp transitions with no top or bottom boundary (2) a thin layer with a clear top and bottom boundary, and (3) a rare transition across and below a depth where the rocks are expected to transition from stiff to weaker properties. Our approach enables the test of hypotheses about the origins of upper mantle layering beneath continents.

1 Introduction

Seismological constraints on upper mantle layering beneath the contiguous US have revealed evidence for negative and positive velocity discontinuities hinting at a complex layering beneath the continental US (Abt et al., 2010a; L. Liu & Gao, 2018; T. Liu & Shearer, n.d.; Hopper & Fischer, 2018b; Kind & Yuan, 2018b; Hua et al., 2023). The mid-lithosphere discontinuities (MLDs) are the most widely detected and are defined by one or more negative velocity gradients confined to depths of 60-170 km (Abt et al., 2010a; T. Liu & Shearer, n.d.; Kind & Yuan, 2018b; Krueger et al., 2021b; Hopper & Fischer, 2018a). Beneath this discontinuity, within a depth range of 120-220 km, recent, but sporadic detections of positive velocity gradients (PVGs) have been reported and interpreted as the base of the MLDs (Hua et al., 2023; Luo, Long, Karabinos, & others, 2021). Slightly deeper still, underneath Proterozoic terranes, between 220-350 km depth, a negative velocity discontinuity has been detected and attributed to the base of the lithosphere (Tauzin et al., 2013). These constraints provide improved illumination on the complex layering within the upper mantle beneath the contiguous US; however the interpretations regarding their origins and causes, e.g., melt, anisotropy, relics of subduction-related hydration, elastically accommodated grain boundary sliding and metasomatism, are still vigorously debated, confounding a unified model (Karato,

2012; Ford et al., 2015; Wirth & Long, 2014b; Selway et al., 2015b; Rader et al., 2015; Saha et al., 2021).

The most common techniques for imaging the upper mantle discontinuities are long-period body-wave methods: (1) Sp converted waves (Hopper & Fischer, 2018b; Abt et al., 2010a; Kind & Yuan, 2018b; Chen et al., 2018; Krueger et al., 2021a) and (2) the top-side S reflections (T. Liu & Shearer, n.d.; Shearer & Buehler, 2019). As the data-volume has improved, the earliest observations using Sp converted waves (Abt et al., 2010a) have been supplemented by continent-wide studies (Hopper & Fischer, 2018b; Kind et al., 2012; Kumar, Yuan, et al., 2012; Kumar, Kind, et al., 2012) with improved signal-to-noise (Krueger et al., 2021a; Hua et al., 2023; Kind et al., 2020a) and better depth resolution using S-wave reflections (L. Liu & Gao, 2018; Shearer & Buehler, 2019). Both techniques have identified multiple upper mantle discontinuities (UMDs) within the contiguous US. In the tectonically active western US, a negative discontinuity is unambiguously detected and repeatedly verified by many authors (Kumar, Yuan, et al., 2012; Kind et al., 2020a; Abt et al., 2010a; T. Liu & Shearer, n.d.; Hopper & Fischer, 2018b; Krueger et al., 2021a). In the tectonically active western US, the velocity drop is inferred to coincide with slow velocities imaged with tomography, and has been interpreted as the boundary between the lithosphere and asthenosphere (Hansen et al., 2015; Hopper & Fischer, 2018b; Abt et al., 2010a; Kind & Yuan, 2018b; Rader et al., 2015). However, this interpretation is inconsistent with the thickness of stable continental lithosphere beneath Archean and Proterozoic terranes in the central and eastern US. Here the velocity drop is detected at shallower depths (Abt et al., 2010b; T. Liu & Shearer, 2021; Hopper & Fischer, 2018b; Krueger et al., 2021b). This is a distinct discontinuity internal to the lithosphere - the MLD rather than the LAB (Abt et al., 2010b; Hopper & Fischer, 2018a; T. Liu & Shearer, 2021).

To clarify the nomenclature and avoid confusion in our interpretation we define important terms: 1) the thickness of stable continental lithosphere and 2) the depth statistics and polarity of previously detected upper mantle discontinuities. The stable continental lithosphere is that portion of the crust and upper mantle that has remained intact since the Archean and Proterozoic era. Some of its distinct geophysical signatures are: high-velocities, low attenuation, and heat loss by conduction (Dalton et al., 2017; Fischer, Rychert, Dalton, Miller, & others, 2020; Priestley et al., 2018). Its thickness, as inferred from seismology and petrology, extends to a depth ~ 200 -250 km depth (Dziewonski & Anderson, 1981; Carlson et al., 2005; Gung et al., 2003). The seismic detection of a sharp boundary with the asthenosphere in this region is elusive, in contrast with the tectonically active regions (Eaton et al., 2009). This suggests that the bottom-boundary of stable continental lithosphere is marked by velocity gradients that are broad. Second, we categorize the previously detected upper mantle discontinuities (UMDs) into three groups without any biasing interpretation on their tectonic location or the rheological strength of the rock, that is lithosphere or asthenosphere (Figure 1b - 1d). The first group (UMD1) are characterized by a velocity drop, and typically detected at consistent depths (83 ± 28 km). The second group (UMD2) are positive velocity discontinuities that are slightly deeper (150 ± 30 km, often referred to as the PVG-150 (Hua et al., 2023)). The last and final group (UMD3) are deeper negative reflectors (>110 km) that are sporadically detected in some studies (T. Liu & Shearer, n.d.; Kind et al., 2020a; Ford et al., 2015) and deeper than their shallower counterpart.

Before evaluating which of the proposed models of upper mantle structure is most consistent with the growing observations, we point out that some authors (Kind & Yuan, 2018a) have raised doubts on whether the shallowest and most prevalent discontinuity, UMD1, exists as a real geological feature, especially underneath stable continents. They argued that these discontinuities could be artifacts from the signal processing with no real geological basis (Kind & Yuan, 2018a). On the contrary, (Krueger et al., 2021b) provide compelling evidence for its visibility within cratons globally. This they do by reprocessing data with rigorous data selection and robust signal processing. Apart from the details of signal processing, some of the differences in observation may be due, in part, to the

111 varying sensitivity and data quality of different imaging techniques as well as the spatial
 112 heterogeneity of these discontinuities. One way to address these short-comings is to improve
 113 spatial resolution by using short-period high-resolution converted or reflected body-waves
 114 (Guan & Niu, 2017; Luo, Long, Karabinos, Kuiper, et al., 2021; Ford et al., 2016; Wirth &
 115 Long, 2014b; Pugh et al., 2021; Rychert et al., 2007a). However, only a few observations
 116 use short-period body waves to image the upper mantle (Luo, Long, Karabinos, & others,
 117 2021; Wirth & Long, 2014b; Guan & Niu, 2017; Ford et al., 2016; Rychert et al., 2007a).
 118 Since the long-period body waves (e.g., Sp-RFs and S-reverberations) are often processed at
 119 frequencies less than 0.5Hz, it means that our insight into mantle layering is filtered through
 120 a low resolution lens (Shearer & Buehler, 2019). This limits the resolution on sharpness and
 121 ultimately the robustness of interpretations of UMD depths, sharpness and origins (mantle
 122 composition and dynamics).

123 Here, we achieve improved vertical resolution by utilizing Ps converted waves processed
 124 at a frequency higher than Sp-RFs or S-reflections. However, when using converted Ps waves
 125 to detect upper mantle discontinuities, crustal reverberations generated at shallow bound-
 126 aries like the Moho cause unwanted interference (Abt et al., 2010a; T. Ologboji, Zhang, et
 127 al., 2023; Kind et al., 2012). This confounds the interpretation of deeper mantle discontinu-
 128 ities. We illustrate this by comparing the UMD arrival times with that calculated for waves
 129 reverberated in the crust (red clouds in Figure 1a,1e). We use a continental Moho model
 130 (Schmandt et al., 2015), and crustal velocities from (Schulte-Pelkum & Mahan, 2014). We
 131 observe that several UMDs reported in earlier studies (Abt et al., 2010a; T. Liu & Shearer,
 132 2021; Krueger et al., 2021a; Kind & Yuan, 2018b; Hopper & Fischer, 2018b) coincide with
 133 Moho multiples. In regions with thick crust, the deeper lithospheric discontinuities (UMD2
 134 and UMD3) are more likely to suffer interference. Even the shallow discontinuity (UMD1)
 135 can be affected in areas with a thin-layer crust where short reverberation paths allow mul-
 136 tiples to arrive at similar times. Therefore to make Ps-RFs suitable for mantle imaging
 137 we require a techniques that can isolate weak mantle conversions from Moho multiples
 138 that arrive at similar times. To address this issue, which has long been a challenge
 139 in global geophysics, we employ the novel CRISP-RF technique (Clean Receiver-Function
 140 Imaging using Sparse Radon Filters)(T. Ologboji, Zhang, et al., 2023). This method lever-
 141 ages sparsity-promoting Radon transforms to effectively model and isolate mantle-converted
 142 energy from crustal multiples (T. Ologboji, Zhang, et al., 2023).

143 In the rest of this paper we describe how we improve our understanding of upper mantle
 144 layering in the continental US by analysing body-wave conversions free of crustal reverber-
 145 ations and noise. We process a large dataset by scanning all available data across the con-
 146 tiguous US. We then apply CRISP-RF processing to produce high-resolution, multiple-free
 147 Ps-RFs. This enables tighter constraints on discontinuity depths and sharpness. We orga-
 148 nize the filtered Ps-RFs into depth-dependent clusters based on an unsupervised machine
 149 learning algorithm: a hybrid of the Sequencer and hierarchical k-means algorithm (Baron
 150 & Ménard, 2020). This process is crucial for revealing coherent and striking patterns in the
 151 data-space of body-wave conversions. We discuss the new insight into upper mantle strati-
 152 fication revealed by our filtered and ordered Ps converted waves: (1) tighter estimation on
 153 the depth and polarity of mantle discontinuities, (2) improved visibility of discontinuities
 154 across and beneath the stable continental lithosphere, (3) detection of mantle layering with a
 155 top and bottom-boundary and the estimation of its thickness (4) a preliminary evaluation
 156 of proposed models to explain upper mantle stratification, that is, melt, metasomatism, and
 157 elastically accommodated grain-boundary sliding.

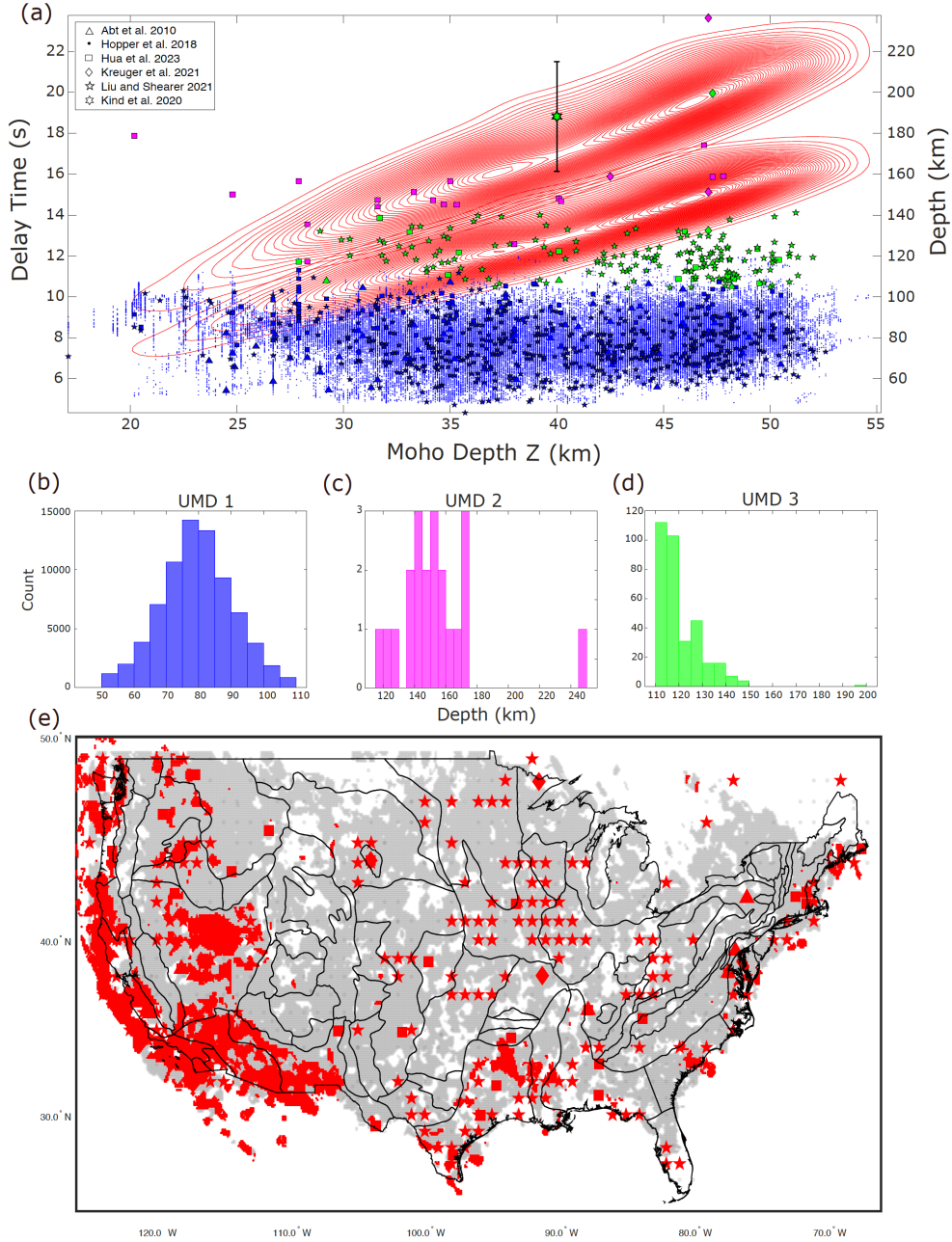


Figure 1. Compiled depths of US upper mantle discontinuities (UMD) highlighting the interference with crustal reverberation when imaging with Ps-RFs. (a) A scatter plot of UMD depth (right y-axis) overlaid on the Ps delay time (left y-axis) of Moho multiples (red contours: pPmS and pSmS arrivals). This region delineates depth-range (and timing) of crustal interference with mantle conversions. The Ps-delay of mantle conversions and crustal reverberations are calculated using a continental-scale Moho model from (Schmandt et al., 2015) and mantle velocities from (Schulte-Pelkum & Mahan, 2014). (b,c,d). Histogram of UMDs grouped by category. (e). Location where UMDs in (a) are observed anticipating locations where the Ps-RF imaging of UMDs are masked by crustal multiples (red). The symbols are same as in (a) and are from (Abt et al., 2010b; Kreuger et al., 2021a; Hopper & Fischer, 2018b; Hua et al., 2023; T. Liu & Shearer, 2021; Kind & Yuan, 2018b)

2 Data

We download and process three-component earthquake waveforms from the Incorporated Research Institution for Seismology (IRIS) database. The majority of the waveforms were recorded by stations that are part of the transportable array (TA) with additional contributions from all the major regional seismic networks within the contiguous US. The initial waveform database comprised approximately $\sim 500,000$ earthquake events recorded on $\sim 2,389$ seismic stations (Figure 2). This represents earthquakes with magnitude >5.5 spanning the period of 1989 to 2022. We select teleseismic earthquakes located at distances between 30 and 90 degrees from the recording stations. This range is specifically chosen to exclude earthquakes that may be affected by diffraction effects in the core shadow zone (Hosseini et al., 2019), as well as non-planar and triplicated waves from the mantle transition zone (Stähler et al., 2012).

We apply several data cleaning and preconditioning procedures to ensure data quality. The seismograms are rotated from the geographic (Z, N, E) to the earthquake coordinate system: vertical (Z), radial (R), and transverse (T) orientation (Rondenay, 2009). We apply an automated quality selection criteria to obtain the best data. We select records with good signal-to-noise ratio (SNR), automatically rejecting all waveforms with SNR less than 2 (calculated with a signal window of 120 s and a noise window of 25 s around the predicted P-arrival time). We ensure consistent sampling rates across all waveforms for each station. This requires resampling the waveforms to the highest frequency for each station. Through these quality control measures, a total of 83,697 earthquake waveforms passed initial quality checks. This is a total of $\sim 17\%$ of the initial preprocessed data.

After the initial quality checks, we organize the seismograms recorded at each station into discrete slowness values. In a radially symmetric earth the body-waves propagating from the hypocenter to the station travel with a distinct ray parameter (slowness values) and sample the receiver-side structure with different arrival angles. Optimal slowness-sampling and epicentral distance coverage is required for stable CRISP-RF processing (Figure S2). This restriction reduces our station catalog from 2,389 to a final set of 417 stations (17.5 % of total station inventory). This also culls the seismograms to a final selection of 20,460 of the best three-channel recordings. When compared to the discarded seismograms the final dataset comprise the highest quality (SNR > 16) seismograms. Despite this strict data-selection criteria the final set of stations are widely distributed across the contiguous US ensuring a comprehensive coverage across different tectonic domains (Figure 2).

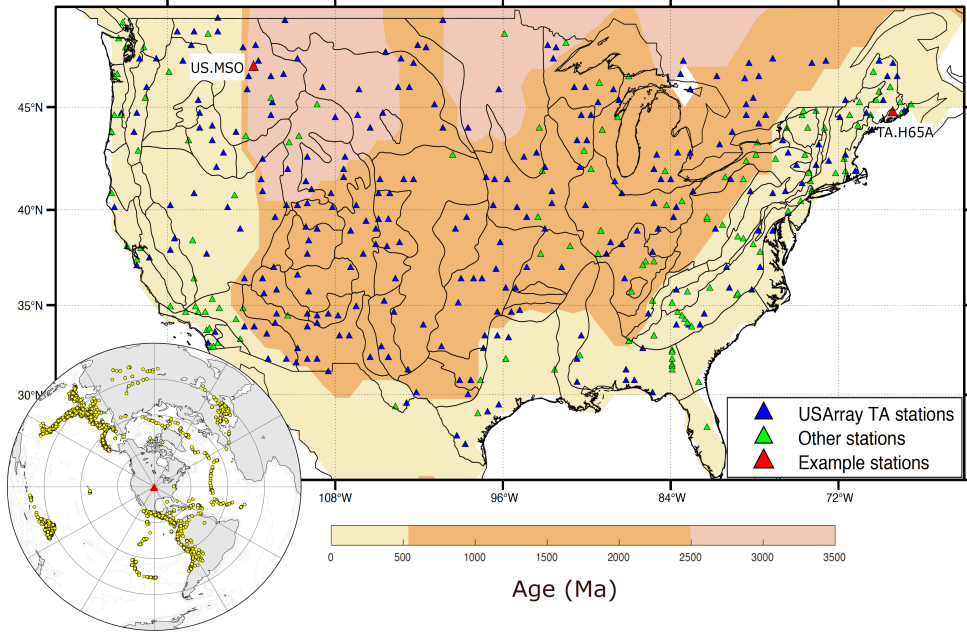


Figure 2. Distribution of seismic stations used in this study. The inset shows the distribution of teleseismic earthquakes that are used. Red triangles mark the locations of the two example stations (TA.H65A, US.MSO) used in our analysis. A full description of all 2389 stations and data statistics can be found in Figure S1 and S2

3 Methods

3.1 RFs at High-Frequency: Contaminated Radial Stacks

We image upper mantle discontinuities using high-frequency receiver functions. We analyse teleseismic P-waves for signature of conversion from seismic discontinuities beneath the stations (Langston, 1977). Radial Ps-RF traces are calculated with a cut-off frequency of 1.5 Hz using the extended-time multi-taper cross-correlation method (ETMT) (Helffrich, 2006). This approach extends the traditional cross-correlation receiver function technique (Park & Levin, n.d.) by applying multiple Slepian tapers to window the waveform data before spectral estimation and deconvolution. To improve the detection of late arriving low-magnitude sub-crustal mantle conversions, we employ a re-normalization procedure, where we implement a 6-second time-shift (τ_s) on the radial component traces to remove early arriving crustal conversions before deconvolution (Equation 1a) (Helffrich, 2006; Shibutani et al., 2008; Park & Levin, 2016d). This step ensures that high-amplitude crustal phases do not overshadow the weaker and deeper sub-Moho conversions of interest. The time-shift is implemented in the frequency domain:

$$\tilde{U}_\kappa^r(\omega, p) = W_\kappa * [U_\kappa^r(\omega, p)e^{i\omega\tau_s}] \quad (1)$$

where $U^r(\omega, p)$ is the Fourier-transformed radial seismogram and W_k are the Slepian tapers, and p is the horizontal slowness. The receiver functions are then computed by deconvolving the shifted radial seismogram from the vertical (both seismograms are tapered with W_k):

$$\tilde{\mathbf{D}}(\omega, p) = \left[\frac{\sum_{\kappa=0}^{\kappa-1} \tilde{U}_\kappa^z(\omega, p) * \tilde{U}_\kappa^r(\omega, p)}{\sum_{\kappa=0}^{\kappa-1} \tilde{U}_\kappa^z(\omega, p) * \tilde{U}_\kappa^z(\omega, p) + \zeta(\omega)} \right] \quad (2)$$

We then stack the radial receiver functions in slowness bins with one-degree spacing to enhance signal quality (Park & Levin, 2000, 2016c):

$$\mathbf{D}(\omega, p_s) = \left(\sum_{l=0}^{n_p} (1/\sigma_l^2) \right)^{-1} \left(\sum_{l=0}^{n_p} 1/\sigma_l^2 \tilde{\mathbf{D}}(\omega, p_l) \right) \quad (3)$$

where p_s are the slowness bins, p_l are the individual slowness values in each bin, and σ_l^2 are the frequency-dependent stacking weights derived from coherence (Park & Levin, 2000, 2016c). The frequency domain receiver functions are then transformed back to the time domain using the inverse Fourier transform

$$\mathbf{d}(t, p_s) = \mathcal{F}^{-1} \left[\mathbf{D}(\omega, p_s) \right] \quad (4)$$

where $\mathcal{F}^{-1}$ is the inverse Fourier transform. The Ps-RF data is a 2-D matrix in which each row represents traces stacked into slowness bins. Each row is a distinct horizontal slowness and each column is a discrete-time sample.

Since the crust-mantle boundary is often the most prominent discontinuity in the lithosphere, top-side reflections bouncing off the Moho (Ppms and Psms) are visible in most of the stacked radial receiver functions (Figure 3). This presents a significant obstacle when interpreting converted waves from sub-crustal lithosphere discontinuities (100-200 km) arriving at ~ 10 -20 secs (Figure 1 and 3). The moho multiples can be identified in the receiver function stacks by their characteristic time-distance(slowness) behavior. Earthquakes located closer to the station (and traveling with large horizontal slowness) arrive slightly earlier than those further away (Figure 3c). This is the opposite behavior for the Ps-converted waves that do not experience top-side reflections. These conversions arrive later for earthquakes located closer to the station (Shi et al., 2020; Ryberg & Weber, 2000). Depending on the station location, data quality, and depth to other discontinuities beneath a station, crustal multiples may not always be easily identified in the receiver function stacks. This makes it harder to interpret the final stacked receiver functions (Figure 3a,b,g,h). For a clear and accurate interpretation of the Ps-RFs, it is crucial to distinguish crust-mantle top-side reflections from mantle conversion. Only when these multiply reflected waves have been properly filtered out can we confidently proceed with the interpretation for upper mantle layering.

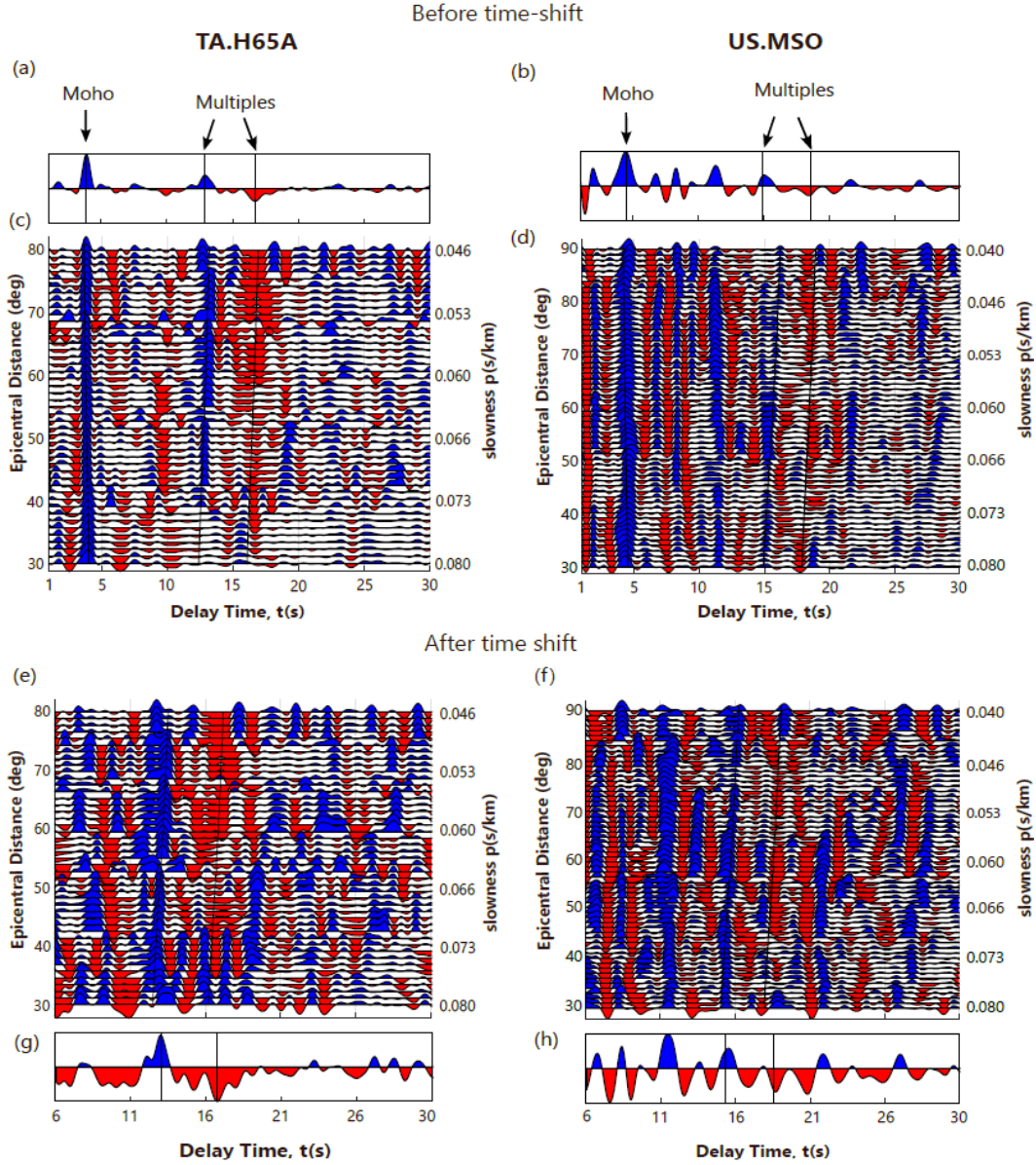


Figure 3. Radial receiver functions for two stations showing Moho arrivals and multiples - top-side reflections in the crust. (a-b) Full stack of all radial receiver functions for stations TA.H65A and US.MSO showing Moho and multiples. (c-d) The radial receiver functions for each station, sorted and stacked by station-earthquake distance in angular degrees. (e-f) Time-shifted radial receiver functions same as (c-d) but starting at 6 secs. (g-h) Full stack of the time-shifted receiver functions corresponding to (e-f). Blue and red shading indicate positive and negative amplitudes

3.2 Filtered RFs: CRISP-RF for Denoising

We briefly present our approach to removing top-side reflections and other non-coherent noise. This is the method called Clean Receiver-function Imaging using Sparse Radon Filters (CRISP-RF) (T. Olugboji, Zhang, et al., 2023). This method enhances the clarity of Ps-RFs allowing for a more accurate interpretation of sub-crustal mantle discontinuities. For a more detailed description, we refer the reader to (T. Olugboji, Zhang, et al., 2023). The

technique involves three main steps: The initial step applies the sparse Radon transform to the Ps-RF data:

$$\mathfrak{R}_{\text{sp}}(\mathbf{d}) : \underset{\mathbf{m}}{\operatorname{argmin}} \left\{ \frac{1}{2} \|\mathcal{F}^{-1}\{\mathbf{L}\mathcal{F}\{\mathbf{m}\}\} - \mathbf{d}\|_2^2 + \lambda\psi(\mathbf{m}) \right\} \quad (5)$$

where $\mathfrak{R}_{\text{sp}}(\mathbf{d})$ maps the Ps-RF data $\mathbf{d}$ to the Radon model $\mathbf{m}$. The transform can be viewed as finding a predictive Radon model, $\mathbf{m}$, using the forward operator $\mathbf{A}$ and subject to regularization $\psi(\mathbf{m})$ (recasting as $\mathbf{d} = \mathbf{A}\mathbf{m}$). Therefore the transform is an optimization problem to find $\mathbf{m}$ using a sparsity-enforcing regularization: ℓ_1 -norm $\psi(\mathbf{m}) = \|\mathbf{m}\|_1$ (Equations 5). This optimization is solved using the SRTFISTA algorithm: a fast iterative shrinkage-thresholding approach that promotes the sparsity of the Ps-RFs in both the time and frequency domains (forward and inverse fourier operators: $\mathbf{A} = \mathcal{F}^{-1}\mathbf{L}\mathcal{F}$) and yields a cleaner representation of the Ps-RF data (Beck & Teboulle, 2009; Gong et al., 2016). Here, $\mathbf{L}$, is a frequency-domain projection matrix that maps the Ps-RF arrivals in $\mathbf{d}$ from the time-slowness data-space to the Radon model, $\mathbf{m}$, which is now in the intercept-time-curvature model-space. Top-side reflections are mapped into the negative curvature while direct conversions show up in the positive curvature (Figure 4c & 4d).

The second step applies a selective masking filter, $\mathbf{K}$, to the Radon model $\mathbf{m}$. The filter is designed to extract only direct mantle conversions by removing contributions representing top-side reflections (red dashed lines in Figure 4c & 4d). By setting the amplitudes with negative curvatures (squares in Figure 4c & 4d) to zero and preserving those with positive curvatures (circles in Figure 4c & 4d), the masking filter retains only Ps-conversions from the upper mantle. The third and final step transforms the now filtered Radon model back to the data-space using the adjoint Radon transform $\mathfrak{R}_{\text{sp}}^+$. This is the required filtered Ps-RF data $\tilde{\mathbf{d}}$ free of unwanted reflections and incoherent noise (Figure 4e & 4f):

$$\mathbf{d} \xrightarrow[\text{step1}]{\mathfrak{R}_{\text{sp}}} \mathbf{m} \xrightarrow[\text{step2}]{\mathbf{K}} \mathbf{m}\mathbf{K} \xrightarrow[\text{step3}]{\mathfrak{R}_{\text{sp}}^+} \tilde{\mathbf{d}} \quad (6)$$

A comparison between the original and CRISP-RF processed Ps-RF stacks for our two example stations shows that the CRISP-RF technique has successfully isolated the mantle-converted phases by attenuating crustal multiples and noise (compare Figure 4a,b to 4e,f). This is evident in the filtered stacks, where mantle conversions are easily and unambiguously identified.

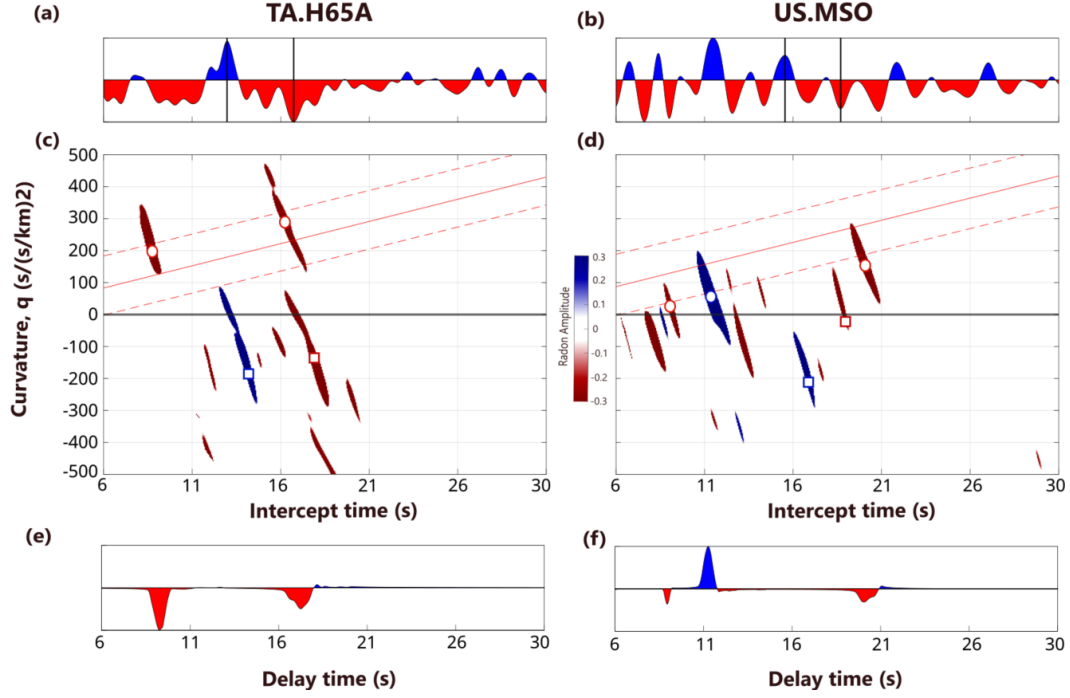


Figure 4. CRISP-RF denoising steps for filtering receiver functions obtained from stations TA.H65A and US.MSO. (a-b) Time-shifted unfiltered receiver function stacks, with predicted Moho arrival times indicated by black lines. (c-d) Radon model (after applying step 1) showing direct mantle conversions along the positive curvature axis (circles), and multiples in the negative curvature (squares). The masking filter are the red lines - they retain all arrivals between the dashed lines (step 2). (e-f) The final filtered Ps-RFs after transforming the filtered Radon model to data domain (step 3). The top-side reflections in the crust have been removed leaving only the direct conversions

3.3 Machine Learning (Sequencing & Clustering) on Filtered RFs:

Since our aim is to produce a detailed map of coherent scattering across discontinuities located in the upper mantle, we employ a two-tiered machine learning approach to find repeatable patterns in the receiver function signature of upper mantle conversions across all our 417 stations. This approach integrates the Sequencer algorithm (Baron & Ménard, 2020) with hierarchical clustering, each serving a distinct but complementary role in uncovering patterns in our denoised Ps-RFs. The sequencer algorithm is necessary for sorting the CRISP-RF filtered receiver functions before applying the correlation-based hierarchical clustering algorithm. The Sequencer algorithm is an unsupervised machine learning tool that reveals hidden sequential structures often obscured within complex multivariate datasets (Baron & Ménard, 2020). It leverages a variety of distance metrics to systematically reorder datasets based on similarity. It has shown promise in sequencing earthquake waveforms to discern spatial patterns in lower mantle scattering (Kim et al., 2020), the analysis of seismic noise to detect temporally coherent signals (Fang, n.d.), and classification of seismic velocities for guiding discovery of tectonic influences on crustal architecture (T. Olugboji, Xue, et al., 2023). In our application of the sequencer algorithm, the data objects to be sequenced are the single-station Ps-RF stacks obtained before or after CRISP-RF processing (vertical lines in the images of Figure 5).

First, we apply the Sequencer to the unfiltered single-station receiver function stacks (Figure 5a). The performance is very poor (Figure 5b). A slight improvement in the

288 detection of positive amplitude arrivals can be seen at ~ 60 km and ~ 100 km but not
 289 much information is gained from ordering the unfiltered data. This is probably due to the
 290 complex mixed-mode scattering within the highly heterogeneous crust across the US. As a
 291 result, it is hard for the sequencer algorithm to find interpretable patterns within the data.
 292 On the other hand, when we separate CRISP-RF filtered receiver function into two subsets:
 293 a set containing only negative amplitudes, and another with only positive amplitudes, the
 294 algorithm performed much better. This is possible because we have filtered out the top-side
 295 reflections in the crust as well as other incoherent noise. The additional simplification using
 296 polarity-dependent filtering also helps considerably (Figure 5c,d). We use an appropriate
 297 measure of dissimilarity (Kullback-Leibler (KL) divergence) and a scale (sixteen) to find
 298 the most optimal ordering of each of the two data subsets. The importance of filtering
 299 and de-noising with CRISP-RF before sequencing is another strong argument for why we
 300 are able to improve our detection of upper mantle layering using Ps-RFs that are clearly
 301 overprinted by a highly scattered wave-field within the continental crust (Figure 1 and 5a).

302 After sequencing the filtered Ps-RFs, we apply a hierarchical clustering algorithm that
 303 independently delineates the seismic stations into groups based on polarity-filtered receiver
 304 function signature of upper mantle layering. Hierarchical clustering starts by measuring
 305 pair-wise cross-correlation across all the filtered Ps-RFs. This measure of similarity is then
 306 used to create binary clusters in a hierarchical manner where the third object is merged
 307 into the binary cluster containing the first and second object and so on until all objects are
 308 merged sequentially until a final cluster is built. This cluster tree (a dendrogram) shows how
 309 (dis-)similar each of the Ps-RFs are compared to the others. The most similar (consistent)
 310 Ps-RFs have linkages that are short while the dissimilar ones (and large clusters of dis-
 311 similar Ps-RFs) have linkages that are longer. Through an iterative routine guided by the
 312 depth coherence, we choose a linkage threshold that separates the dendrogram into 4 final
 313 clusters one cluster each for the positively and negatively filtered Ps-RFs (Figure 6 & 7).
 314 Each cluster is a natural grouping of single-station polarity-filtered Ps-RFs whose traces are
 315 most coherent and therefore reflect the signature of scattering from coherent upper mantle
 316 structure.

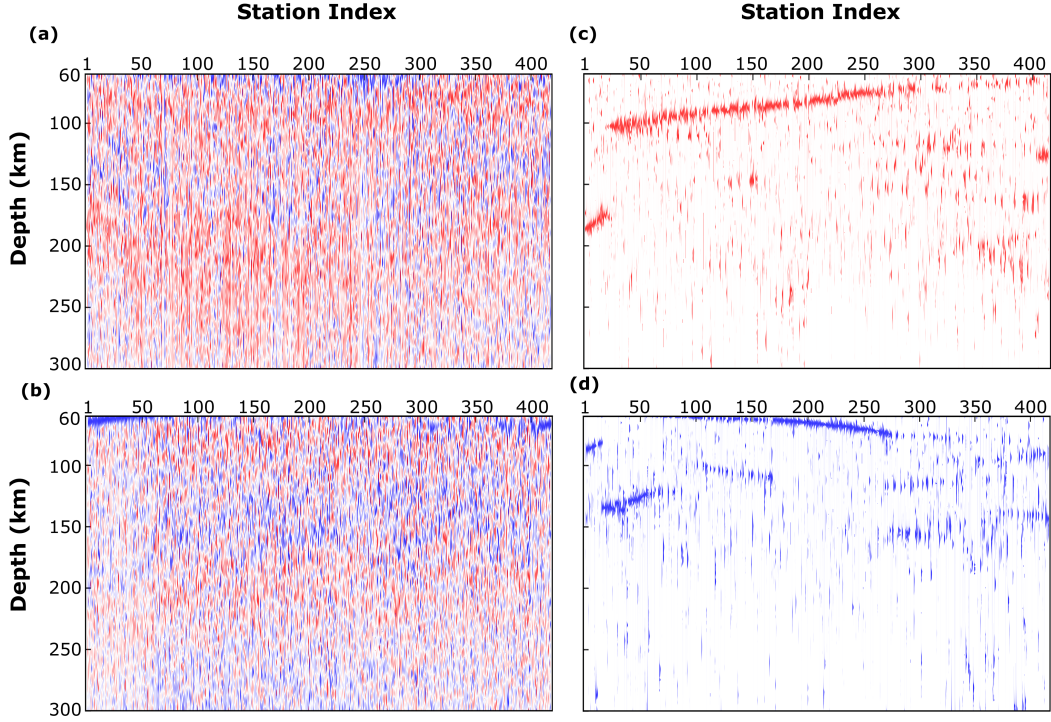


Figure 5. Enhanced pattern recognition of upper mantle discontinuities through polarity-based filtering and sequencing of Ps-RF traces. (a) Single-station radial Ps-RF stacks without CRISP-RF processing illustrating minimal interpretive content (b) Single-station radial Ps-RF traces, same as in (a), but processed through the sequencer algorithm. The image is still hard to interpret due to the presence of multi-mode scattering in a heterogeneous crust (c) Negatively filtered and sequenced Ps-RF traces (d) Positively filtered and sequenced Ps-RF traces. The CRISP-RF filtered traces in (c) and (d) show clear and coherent arrivals.

4 Results

Unsupervised machine learning, applied to Ps-RF traces that have been filtered based on polarity, offers a window into upper mantle structure beneath the contiguous US. Based on our analysis we observe a more complicated stratification of upper mantle structure. Beneath each station, three types of upper mantle discontinuities are observed, classified based on depth: (1) intra-lithospheric discontinuities (velocity drop and increase), (2) transitional discontinuities (velocity drop) and (3) sub-lithospheric discontinuities (velocity increase). This observation presents a departure from the simple view of a single uniform and ubiquitous middle lithosphere discontinuity expressed as a rapid velocity drop. Note that the relationship of the discontinuity depth to location within, across or beneath the lithosphere is only straightforward for stable continental lithosphere east of the Rocky mountain front. That said, this detailed perspective on upper mantle layering may reflect changes in composition, metasomatism, phase change, or rheology.

4.1 Transitional and Intra-lithosphere discontinuities: Velocity drop

The most striking results is the detection of phases with negative polarity visible across all the stations and within depth internal to the lithosphere (< 200 km) and at a depth that marks a transition from the lithosphere to asthenosphere (> 200 km). These phases with negative polarity on the filtered Ps-RF traces indicate discontinuities marked by a velocity

drop. After coherence-based clustering of these negative discontinuities, we observe four distinct station groupings: N1-N4 (Figure 6 % S3). The group index is sorted based on total number of stations and depth of each group's representative centroid (average Ps-RF trace in each cluster).

The first and largest cluster, N1, (45 % - 189 of 417 stations) is the one with a pronounced Ps-RF arrival at a depth between 60 to 100 km, i.e. spanning a depth of ~ 40 km (Figure 6a,6b & S3a). This intra-lithosphere discontinuity is within the depth-range traditionally associated with the mid-lithosphere discontinuity reported in previous studies (see Figure 1b) (Abt et al., 2010b; Hopper & Fischer, 2018a; Krueger et al., 2021a; Hua et al., 2023; T. Liu & Shearer, n.d.). Our independent confirmation of this discontinuity using a slightly different approach, Filtered and Sequenced Ps-RFs instead of Sp-RFs, provides extra validation that this discontinuity is real and not an artifact of deconvolution.

The second largest cluster, N2, (24 % - 101 of 417 stations) represents all stations with slightly deeper Ps arrivals compared to N1: 100 km - 135 km. This discontinuity is more depth-confined. Half of the stations see the discontinuity at a depth of 100 km and another half 35 km deeper at ~ 135 km (Figure 6c,6d & S5b). Compared to its shallower counterpart in N1 (Figure 6a), the deeper reflector lack a substantial depth variability and hints at a relatively consistent physical process across this limited depth range. While sporadic detections of such a relatively deeper intra-lithosphere discontinuity have previously been reported especially within the Achaean and Proterozoic terrains of central and eastern US, (T. Liu & Shearer, n.d.; Hua et al., 2023), the consistency of this seismic signal in a quarter of our stations implies a more widespread occurrence.

The third cluster, N3, (18% - 77 of 417 stations) represent stations with the deepest intra-lithosphere reflectors located at a depth range from ~ 150 km to ~ 190 km (Figure 6e, 6f & S3c). Coherent signals in this depth range coincide with the lowermost region of the thermal boundary layer within cratonic lithosphere (Kind et al., 2020a) and may mark the transitional zone where a non-mobile lithosphere transitions to a convection upper mantle asthenosphere. Although these group of stations are consistent in having deeper discontinuities, we observe a few stations with shallower discontinuities which are not located at a consistent depth. This complicated pattern reduces the overall correlation value across the entire group. as indicated by the smearing in the final cluster average (Figure 5f).

The fourth and final cluster, N4, (12% - 50 of 417 stations) represents stations situated above mantle that have a discontinuity that is very clearly transitional between lithosphere and asthenosphere. This is seen as a clear negative arrival on the Ps-RFs at a depth consistently between 200 to 260 km (Figure 6g). This depth range coincides with the expected base of thick depleted rigid mantle lithosphere underneath cratons (Kind et al., 2020a). As such, this cluster of stations reflect a deeper lithosphere-asthenosphere transition, and may detect a strong signature of a impedance contrast between the rigid lithospheric mantle and the weaker asthenospheric mantle. Stations that belong to these group, and in part N3, are consistent with upper mantle structure previously reported by (Kind et al., 2020a) in the central and eastern US referred to as the cratonic lithosphere-asthenosphere boundary (LABc). Here, our results show that these stations are mostly located in the Eastern US, for N4, with some stations in the western US for N3 (see Figure S5c & S5d)

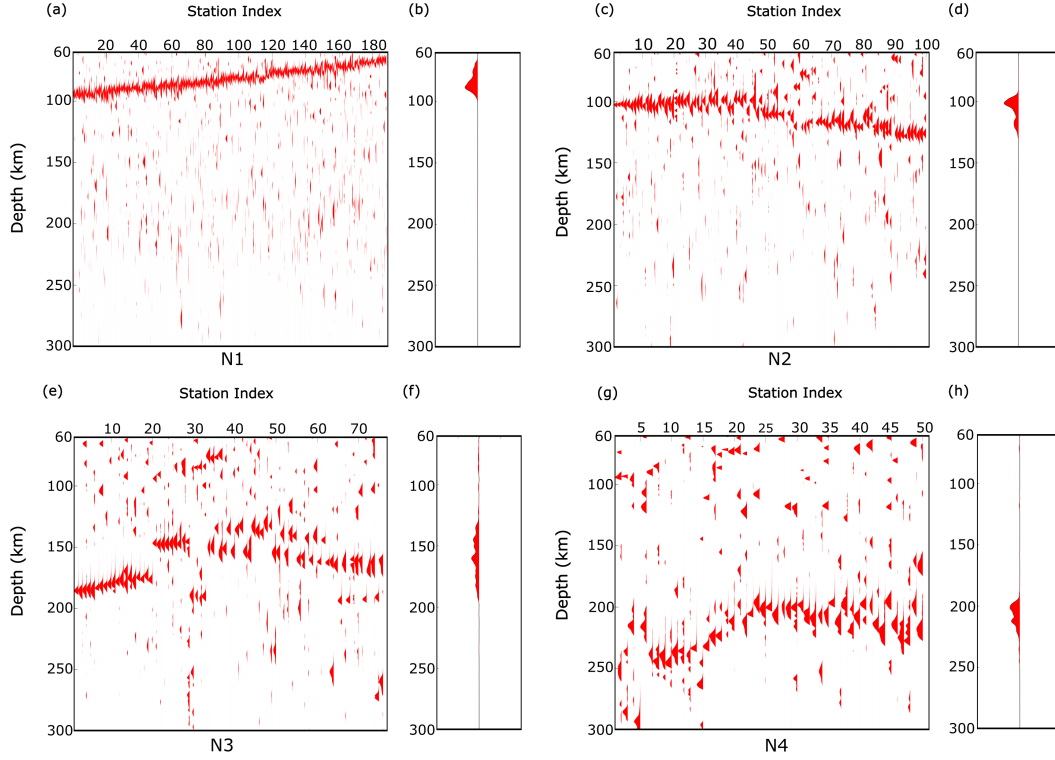


Figure 6. Stations with upper mantle discontinuities marked by a velocity drop and grouped by the hierarchical clustering of filtered and sequenced Ps-RFs (a) Shallow intra-lithospheric discontinuity (60-100 km) sorted from the deepest to shallowest station with the depth spanning 40-km. This discontinuity is similar to the previously identified mid-lithospheric discontinuities in Figure 1b. (b) Semblance-weighted stacks of the individual single-station filtered Ps-RFs (c) A relatively consistent and shallow intra-lithospheric discontinuity (100 km & 135 km) (d) Semblance-weighted stack, same as in b, showing the average Ps-RF signature across all stations in the cluster. (e) A transitional discontinuity (150-190 km) located at a depth consistent with the bottom of a thermal boundary layer. (f) The semblance weighted stack showing a more diffuse trace due to larger variance across stations in the cluster (g) A transitional discontinuity (200-250 km) located at a depth consistent with the transition from a conductive to adiabatic thermal gradient in a cold cratonic lithosphere. (h) The semblance weighted stack, is impulsive (~ 200 km) when the within-cluster variance is small and suggests that the sporadic negative amplitudes (~ 100 km) are not spatially coherent. A full statistic of the depths can be found in Figure S3. The spatial clustering can be found in S5.

4.2 Intra and Sub-lithosphere discontinuities: Velocity increase

In addition to upper mantle discontinuities marked by a velocity drop, we present results for discontinuities marked by a velocity increase. The Ps-RF signature of a velocity increase is a positive amplitude on the filtered Ps-RF traces. With the Ps-RFs filtered for positive amplitudes (Figure 5d) and processing through the hierarchical clustering algorithm, we observe two main types of upper mantle discontinuities marked by a velocity increase: (1) intra-lithospheric and (2) sub-lithospheric. The first cluster, P1, represents 22% of the stations with the shallowest intra-lithospheric discontinuity between ~ 80 to ~ 120 km (Figure 7a). This discrete jump in velocities is at a depth range overlapping with the intra-lithospheric discontinuities marked by a velocity drop in clusters N1 and N2 (Figure 6 a,c).

Slightly deeper (by ~ 40 km) is a second cluster, P2, of 32% of the stations located above a velocity increase located between ~ 120 to ~ 180 km (Figure 7c). This intra-lithosphere layer coincides with the previously reported positive velocity gradient-150km discontinuity (PVG-150) which has been hypothesized to be the base of a melt layer embedded within the lithosphere (Hua et al., 2023). When paired with the intra-lithosphere reflectors marked by a velocity drop, this discontinuity reveals a potentially stratified lithospheric mantle in some regions (Figure S6). Detection of such a top and bottom interfaces is only separable using these two-tier filtering and clustering approach.

A third cluster, P3, unlike the other two, indicates the detection of an elusive sub-lithosphere discontinuity at ~ 250 to 300 km (Figure 6e). Only a few stations ($\sim 5\%$) show clear Ps-RF arrivals at these depths (Figure 7e). This observation is consistent with the reported depth of the previously detected X-discontinuities (Pugh et al., 2021, 2023), which has remained elusive in prior studies of upper mantle layering across the contiguous US. The final and largest cluster, P4, is a null detection for lithosphere or sub-lithosphere discontinuities with a velocity drop. This is $\sim 41\%$ of the station population. In this cluster, the positive amplitudes observed at depths $< \sim 60$ km (Figure 7g and 7h) are most likely the side-lobe of a crust-mantle conversion or evidence of thickened crust or terrain sutures. Further analysis confirms this designations (Figure S7 & S8. see also 'X' discontinuity in (Kind et al., 2020a)) and therefore we categorize these stations as belonging to stations without a clear upper mantle discontinuity with a velocity increase. These structures may be associated with complexes formed during extended Paleozoic assembly of the North American continent.

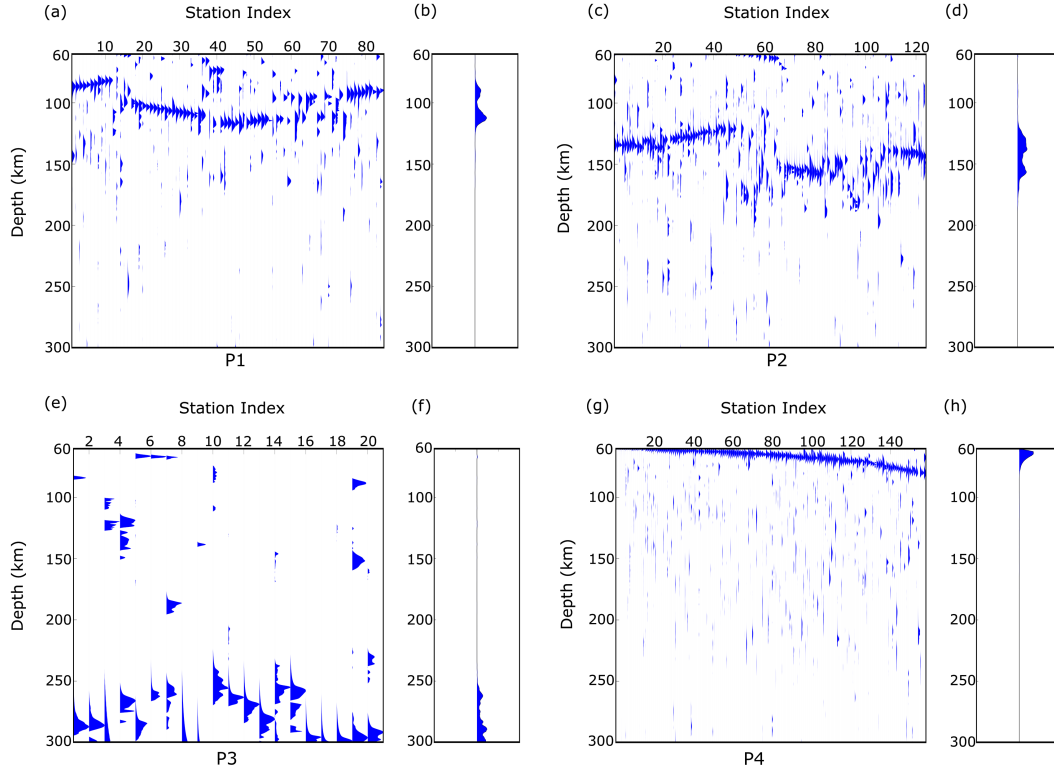


Figure 7. Similar to Figure 6 but for upper mantle discontinuities marked by a velocity increase. (a) P1: intra-lithosphere discontinuity depth of $\sim 80 - 120$ km (c) P2: intra-lithosphere discontinuity at a depth of $\sim 120 - 180$ km (e) P3: sub-lithosphere discontinuity at a depth of $\sim 250 - 300$ km (g) P4: Null detection caused by crustal side-lobes or terrane sutures. (b,d,f,h) Semblance-weighted stacks summarizing mean Ps-RF signal for P1-P4. A full statistic of the depths can be found in Figure S4. The spatial clustering can be found in S6.

4.3 Spatial Clustering of Stations and Ps-RF Centroids

Up until now, we've grouped our filtered Ps-RF results by looking at the data-similarity without any concern for geology or tectonics. Now, we examine how the stations belonging to each cluster are distributed in space. We do this by color-coding each station by the cluster index it belongs to using a color-coding scheme that interpolates stations into a 1-degree bin (Figure 8b and 8d). The mantle-discontinuity structure (velocity increase or decrease) beneath each station is then best described by the representative Ps-RF centroid for each group. The centroid is a semblance-weighted stack for all the polarity-filtered Ps-RFs for all the stations in the group. This summarizes the data variance in each group to a set of archetype receiver function reflecting the depth-dependent discontinuity structure across the US (Figure 8a and 8c). This spatial analysis of the station clustering reveals a striking diversity in upper mantle layering. It shows a mosaic of negative and positive seismic structures distributed in a largely stochastic fashion (Figures 8b, 8d). We observe that no single boundary or transition predominates continent-wide. Instead, a spectrum of seismic discontinuities emerges, segmented across variable depths. This random distribution does not conform to simple geographical or tectonic boundaries.

Despite this broad characterization, we observe that the most prevalent mantle discontinuity is the *intra-lithospheric discontinuity with a velocity drop* which is observed at $\sim 70\%$ of our stations (N1+N2). The semblance-weighted mean stacks reflect a discontinuity

at ~ 100 km for both clusters. In the first cluster, N1, the precursory arrival reflects the systematic depth variation across the individual Ps-RFs and for the second cluster, N2, the post-cursor arrival represents the slight depth offset for half of the station. Regardless these two clusters represent most of the data-variance for a negative-amplitude Ps-RFs. The filtered Ps-RF traces from these stations show a high correlation coefficient which is visually confirmed in the data grouping (compare Figures 6a and 6c). Beneath 18.36% of our stations we observe that the deepest intra-lithosphere discontinuity, N3 is less coherent (Figure 8a). The last group of stations, only 12 %, provide evidence for a discontinuity that is transitional between the lithosphere and asthenosphere - N4 - with a representative Ps-RF that is ~ 200 km (Figure 8a). The inter-station coherence for this group is lightly better than that of N2 but less than N1 and N2. The stations detecting this deeper transitional discontinuity are more prevalent in the stable continental lithosphere of the eastern US (Figure S5d) .

For upper mantle marked by a velocity increase, we observe only intra-lithospheric and sub-lithospheric discontinuities. We do not observe velocity increases at depths transitional between lithosphere and asthenosphere. While the station distribution shows no clear separation by geology or tectonics, we observe that the largest cluster (41 %), P4, is a null detection for upper mantle discontinuities (Figure 7h and 8d).. This means that intra-lithosphere discontinuities ($P1 + P2 = 53\%$) are only half as less likely than the counterpart velocity drop ($N1+N2 = 70\%$). The discontinuity structure beneath stations in cluster P1 is slightly shallower (~ 100 km $\pm$ 20 km), more self-similar (higher correlation) than those in P2 (~ 150 km $\pm$ 30 km), which are deeper. Unlike the intra-lithosphere discontinuity the detections of sub-lithospheric discontinuity is rare. Only 5.21% of stations belonging to cluster 3 (Figure 7e). The depth range is confined to (~ 270 km $\pm$ 30 km). The detection of upper mantle discontinuities with variable depth and spatial distribution reflects a complexity inconsistent with a simple view of a laterally continuous boundary. This complexity underscores their detection by higher resolution Ps-RFs after appropriate filtering and sorting.

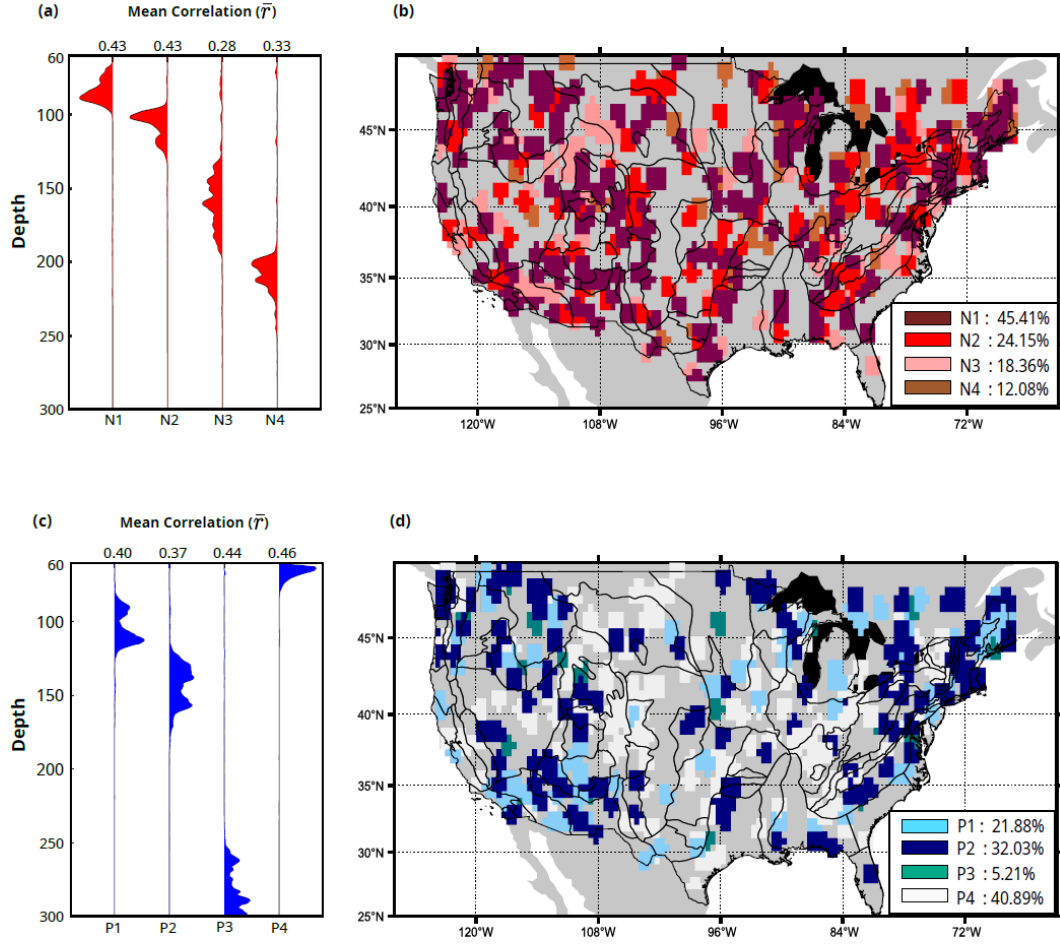


Figure 8. Station location, cluster index, centroid, and statistics for each Ps-RF filtered by polarity. (a) Semblance-weighted stacks for negative Ps-RF traces (N1-N4) representing discontinuities within and across the lithosphere (b) Location of stations (and counts) belonging to cluster N1-N4 (c) Semblance-weighted stacks for positive Ps-RF traces (P1-P3) representing discontinuities within and beneath the lithosphere. P4 represents null detections unrelated to upper mantle structure (d) Location of stations (and counts) belonging to cluster P1-P4

4.4 Synthesis: Architecture of Upper Mantle Stratification

The analysis of polarity-filtered single-station Ps-RF traces resulted in their classification based on the upper mantle structure beneath the station. When each individual station was processed through the CRISP-RF filter and sorted into an exclusive group: N1-N4 or P1-P4 based on similarity to other stations, we were able to distinguish depth and type of the discontinuity (e.g. shallow, deep, velocity drop or intra-lithospheric). However, it is important to note that each station can belong to either an ‘N-type’ cluster, a ‘P-type’ cluster, or both. Therefore looking beneath each station and identifying the ‘N-type’ or ‘P-type’ discontinuity structure leads to a view of upper mantle architecture across the US. The first class is the *intra-lithosphere discontinuities without a discernable base* (green circles in Figure 9). These are stations whose Ps-RFs belong to the shallow ‘N-type’ (N1-N3) but do not indicate a deeper discontinuity marked by a velocity increase and so do not have a ‘P-type’ signature (do not belong to P1-P3). Crucially, these stations are coincident with the P4-type (null detection), where deep crustal reflectors and no positive intra-lithosphere

discontinuities are observed. The absence of a velocity increase below the velocity drop indicates that this is a strict discontinuity rather than a layering with a discernible top and bottom base. This type of upper mantle structure is prevalent and widespread (38.7%) suggesting a ubiquitous feature of the lithosphere.

In contrast, we observe a second class of upper mantle architecture which can be described as *intra-lithosphere layering with a top and a base*. This type of upper mantle stratification is as prevalent as the previous type (44.8% of recording sites). This upper mantle architecture is observed for stations that belong to both an ‘N-type’ (N1-N3) and a ‘P-type’ (P1-P3) cluster. Therefore beneath these stations the mantle has both an upper and lower impedance contrast as you cross through an intra-lithosphere layer. It is important to note that two potential stratifications can arise in this conjunction of ‘N-type’ and ‘P-type’ discontinuities: (i) a layer bounded by a velocity drop on top and a velocity increase below (yellow circles in Figure 9), and (ii) the reverse, a layer bounded by a velocity increase on top and a velocity drop below (yellow squares in Figure 9). The latter is a special case of mid-lithosphere stratification that has not previously been resolved.

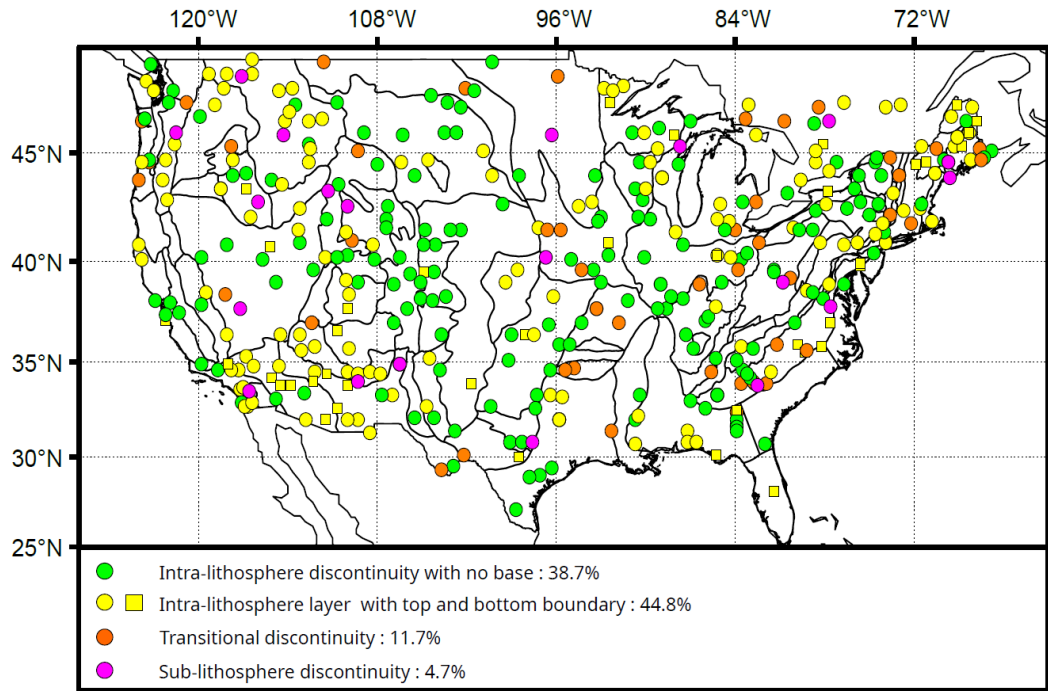


Figure 9. Upper mantle stratification beneath the US. Green circles represent stations with intra-lithosphere discontinuities without a discernable base. Yellow circles represent stations detecting a negative reflector with a deeper positive reflector. Yellow squares represent stations detecting a deeper negative reflector beneath a shallower positive reflector. Magenta-colored stations denote observed transitional discontinuities while orange stations mark sub-lithospheric positive reflectors

The two last classes of upper mantle stratification is: *transitional discontinuities* (across the lithosphere and asthenosphere) and *sub-lithosphere discontinuities*. Both types are not widespread - only 12 % show the detection of transitional discontinuities within the upper mantle. These can either be deeper ‘N-type’ clusters (N3 and N4) which lack a corresponding shallow ‘P-type’ Ps-RF signature (P1 or P2) at the same station (magenta-colored stations in Figure 9). Additionally, these stations lack any deep prominent positive reflectors from sub-lithosphere ‘P-type’ (P3) discontinuities. We therefore classify

these clusters as transitional discontinuities. Lastly, sporadic detection of sub-lithosphere discontinuities (4.7% of stations) with cluster ‘P-type’ (P3) signature constitutes the final class of upper mantle stratification. These are velocity increases confined to a depth of ~ 280 km $\pm$ 30 km .

5 Discussions and Interpretations

Our results, using filtered Ps-RFs, show that the upper mantle beneath the US is stratified. In the broadest sense, this view of the upper mantle’s stratification, particularly within and across the lithosphere, is consistent with previous regional and continent-wide (Abt et al., 2010b; Hopper & Fischer, 2018b; Kind et al., 2020a; Lekic et al., 2011; Lekić & Fischer, 2014; Levander & Miller, 2012; T. Liu et al., 2023) and single-station observations) (Ford et al., 2016; Hua et al., 2023; Krueger et al., 2021a; Long et al., 2017; Luo, Long, Karabinos, & others, 2021; Rychert et al., 2005, 2007b). However, our work differs in some specific details, especially across and below the lithosphere. First, our results refine the sharpness, depth variation, and complexity of intra-lithosphere discontinuities. Second, we show that some of these discontinuities have a top and bottom boundary, while others do not. Lastly, we can show a rare detection of a class of discontinuity transitional between the upper mantle lithosphere and asthenosphere (Kind et al., 2020b) and an elusive sub-lithosphere discontinuity that might be consistent with the X-discontinuity (Pugh et al., 2021). In what follows, we: (1) provide a justification for a new taxonomy of upper mantle stratification, (2) summarize our revised constraints providing the reasoning for why our approach to mantle imaging enables a refined view of upper mantle stratification (in contrast with S-wave conversions or reflections), and (3) discuss the implications of our revised constraints for causal models for upper mantle stratification.

5.1 A New Taxonomy and its Justification

In describing upper mantle structure, we introduce a new taxonomy – a way of organizing and describing how upper mantle stratification varies across the US. This new taxonomy is informed by the descriptive patterns visible in the cluster analysis (Figure 10). We observe that most of the variability in the upper mantle stratification can be organized in three main ways: (1) intra-lithosphere discontinuities with no base, (2) intra-lithosphere layering with a top and bottom-boundary (P-type and N-type), and (3) transitional and sub-lithosphere discontinuities. In previous work by (Abt et al., 2010b; Fischer et al., 2010a; Fischer, Rychert, Dalton, Miller, Beghein, & Schutt, 2020; Kind et al., 2015; Kumar, Yuan, et al., 2012; L. Liu & Gao, 2018; T. Liu & Shearer, 2021) much effort has focused on detecting the mid-lithosphere discontinuities (MLD) using S-wave conversions or S-reverberations. Much of these observations belong to the class of mantle stratification we are calling the intra-lithosphere discontinuity with no base. This discontinuity, which is marked by a velocity drop, has initially been disputed to be an artifact of deconvolution by (Kind et al., 2020a). Here, we confirm this to be a robust detection consistent with the re-analysis of (Krueger et al., 2021b) but now verified across a wider footprint of stations. Apart from the MLD, we observe other discontinuities internal to the lithosphere, some of which look more like layering, hence introducing a new naming scheme that captures this diversity.

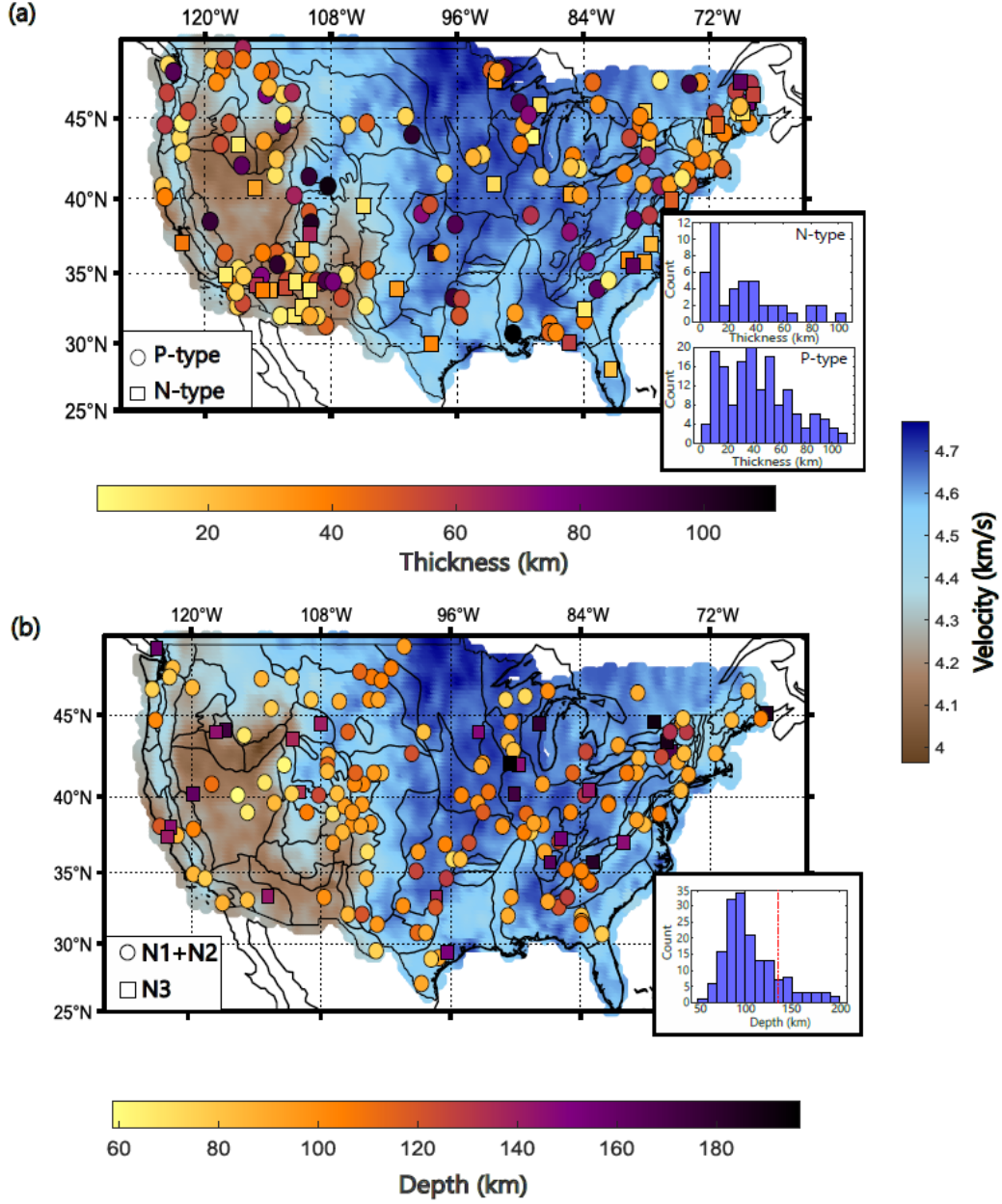


Figure 10. The most common upper mantle stratification across the US. (a) Stations located above mantle with an intra-lithosphere layer with a top or bottom boundary. Inset histogram shows layer thickness and symbols denote P-type and N-type layering (b) Stations located above mantle with an intra-lithosphere discontinuities with no detectable base. Inset histogram shows depth and symbols for N1+N2 and N3 discontinuities (compare with Figure 8). The red line marks the minimum depth for N3 discontinuities

For example, a recent global study conducted by (Hua et al., 2023) revealed a positive velocity gradient located at 150 km. They interpret this to be the base of a global molten asthenosphere layer. In our survey of the continental upper mantle, such a discontinuity is detected across the US, but this type of upper mantle stratification is more likely to be the base of an intra-lithosphere layer (P-type). Our taxonomy here is justified because when ob-

served in the eastern US, this P-type base is within the cold continental lithosphere and cannot be associated with the base of an asthenosphere layer (Figures 9 and 10a). In some rare cases, in the western US, which is more tectonically active, the thermal and shear-velocity structure may argue for a thinner lithosphere with a P-type base reflecting the bottom of an asthenosphere layer (Hansen et al., 2015; Hopper et al., 2014; Priestley et al., 2018). Our final classification – the transitional and sub-lithosphere discontinuities – could be the same discontinuities as that called the lithosphere-asthenosphere boundary in (Kind et al., 2020b) or the X-discontinuity in (Pugh et al., 2021; Srinu et al., 2021). Here, we choose to use the term transitional discontinuity because it does not impose a rheological interpretation to a seismological observation without a clear model. The term sub-lithospheric discontinuity encompasses all possibilities: the Lehmann, the X-discontinuity, and other types of upper mantle stratification.

5.2 Revised Constraints on Upper Mantle Stratification

Re-evaluation of UMD1+3 (Intra-lithosphere discontinuity with no base):

The detection of an intra-lithosphere discontinuity with no base is most consistent with the previous observation of a mid-lithosphere discontinuity (MLD) in the eastern US, often referred to as the lithosphere-asthenosphere boundary (LAB) in the west (Hopper & Fischer, 2018b; Krueger et al., 2021b; T. Liu & Shearer, 2021). Across the US, this discontinuity has previously been reported at a depth of 100 - 140 km (UMD1 and UMD3 in Figures 1b). As pointed out, our new results confirm those obtained using reflected and S-p converted body waves: SP-RFs, SS reflections (Figure 11). The confirmation of this discontinuity with our newly improved Ps-RF technique demonstrates that this type of mantle stratification is a feature that varies little with depth and is sharp enough to be visible at different wavelengths (Figure 6a,6b & 10b). Higher-resolution Ps-RF imaging provides the following revised constraints on this discontinuity: (1) it is more likely to be observed east of the Rockies, (2) the depth varies systematically, over 40 km, with the shallowest discontinuities (60 km) in the west and the deepest (~135 km) to the east (3) the velocity gradient is as sharp as 10 km regardless of region (Figure 10b). These constraints are important for evaluating causal models. Note also that to the west of the US the intra-lithosphere discontinuities are mostly marked by a bottom boundary, unlike to the east (Figure 10a). This observation rules out the need for a distinction between MLD and LAB and suggests that intra-lithosphere discontinuities with no base are a clear feature of cold continental lithosphere that has not been thermally modified over much of the US's tectonic history and yet can maintain a near-universal discontinuity that seems to be unrelated to the history of continental formation.

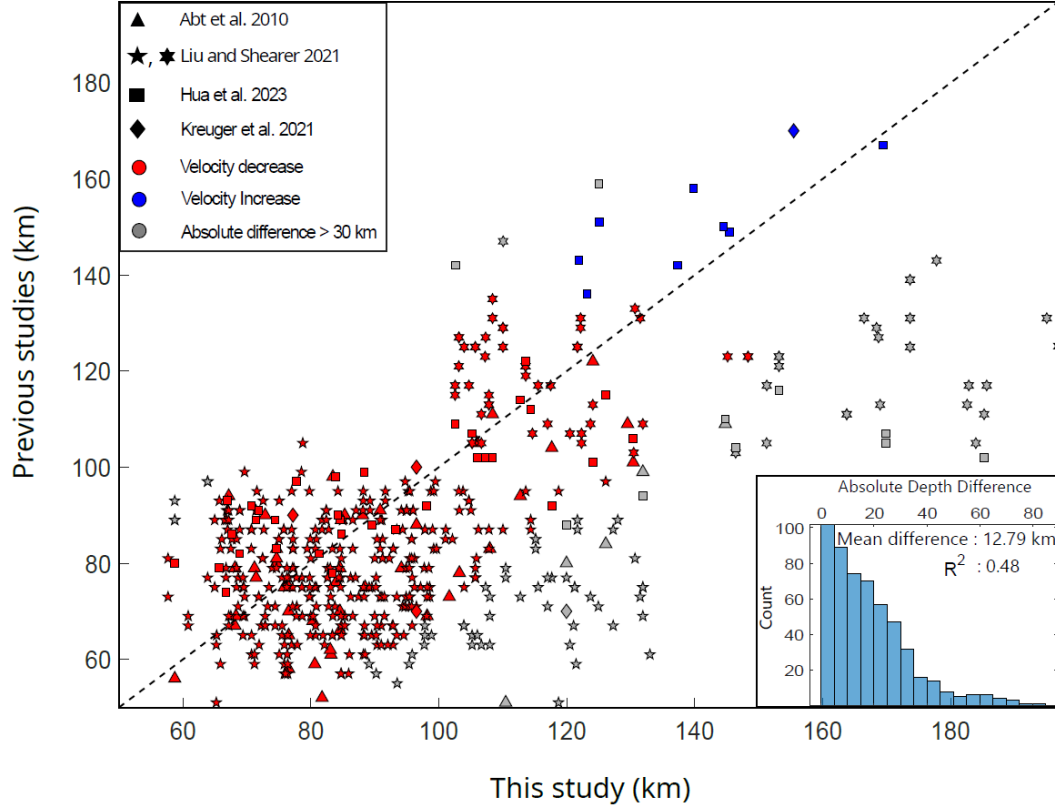


Figure 11. A comparison of previous body-wave studies of upper mantle discontinuities and this study. The scatter plot shows depth estimates for negative and positive discontinuities for similar locations. A one-to-one line (black dashed line) means that our results are consistent with previous work. Outliers are indicated in grey. Sample filtered Ps-RFs for two stations US.ECSD and IU.RSSD previously studied by (Krueger et al., 2021b; T. Liu et al., 2023) can be seen in Figure S9.

Re-evaluation of UMD2 (Intra-lithospherelayering): The observation of an intra-lithospheric layering with a discernible top and bottom boundary may be consistent with the PVG-150 km detected by (Hua et al., 2023). However, this interpretation is only consistent for stations located to the west of the Rockies. The spatial clustering along regions with recent magmatic activity – south of the Colorado Plateau and within the Columbia River basalt suggests that in these regions alone – not in the eastern US – do you have a lithosphere that may be thermally modified in such a way as to produce a partial molten layer that results in a shallow velocity drop with a discernable velocity increase at the bottom boundary of a rheological weak asthenosphere layer. In the eastern US, however, such an interpretation is not consistent with the observations, and a new model is required. Also, in a few locations we observe an even puzzling layering that is opposite of the partial melt interpretation—a velocity increase above a velocity increase (N-type).

5.3 Improved Visibility of the Transitional and X-Discontinuity

As we have seen, discontinuities internal to the lithosphere are easily detectable. However, the high-frequency body-wave signature of the boundary between a lithosphere and an asthenosphere has proved elusive, especially beneath the Archean or Proterozoic lithosphere in the eastern US. This is probably due to the gradual thermal and compositional structure

leading to the lack of a sharp boundary at a depth of 250 km (Dalton et al., 2017; Fischer, Rychert, Dalton, Miller, Beghein, & Schutt, 2020; Priestley et al., 2018). In the continent-wide and single-station studies (Kind et al., 2020a; Krueger et al., 2021b; Mancinelli et al., 2017) the detections of a transitional discontinuity marked by a velocity drop are referred to as the craton LAB and are most clearly observed by (Kind et al., 2020a) in the south-eastern region of the US and on craton boundaries by (Krueger et al., 2021b). In our case, the detection of a deep discontinuity is rare and spatially variable (Figure 9, S5c, S5d, and S6c, S6d). As a result, we hesitate to make any inference on the driving mechanisms for its visibility.

Similarly, positive velocity gradients have previously been detected within and beneath the lithosphere. For detections within the lithosphere, the favored interpretation is the signature of paleo-subduction beneath the Superior craton, craton assembly through imbrication and underplating (Kind et al., 2020a). Although we observe these discontinuities in the lithosphere, the spatial resolution is not high enough to place constraints on their tectonic drivers. Most of our detections are associated with the top or bottom boundary of a lithospheric layer rather than a structural feature of continental assembly. The most compelling observation is the rare detections of sub-lithosphere discontinuities at 250 -300 km (Figures 7c and S4c). We interpret these as an X-discontinuity similar to that seen globally by (Pugh et al., 2021). The correspondence between the location of our detection and the yellow-stone hotspot lends further strength to this interpretation (Figure S6c). We note that the interpretation of a shallower positive discontinuity as the Lehmann discontinuity is not supported by our results. Future work is needed to evaluate if this discontinuity is preferably associated with anisotropy (Ford et al., 2016; Gaherty & Jordan, 1995; Gung et al., 2003).

5.4 A Case for Models consistent with Revised Constraints

Based on our new constraints we re-evaluate the different models proposed to explain intra-lithosphere and transitional discontinuities (Karato & Park, 2018; H. Yuan & Romanowicz, 2018). They include partial melting (Hua et al., 2023; Rader et al., 2015) chemical stratification or metasomatism (Krueger et al., 2021b; T. Liu et al., n.d.; Rader et al., 2015; Saha et al., 2021; Selway et al., 2015a), variable anisotropy (Wirth & Long, 2014a; H. Yuan & Levin, 2014; H. Yuan & Romanowicz, 2010), and elastically accommodated grain-boundary sliding (Karato et al., 2015). Many of these models were proposed shortly after the early detection of lithosphere discontinuities when a detailed view of upper mantle stratification was unavailable (Saha et al., 2021; Saha & Dasgupta, 2019). The new observations suggest that some models are more consistent with discontinuities without a base while others are more consistent with those with a base.

5.4.1 *Intra-Lithosphere Discontinuities with no Base*

The simplest class of mantle stratification is the intra-lithospheric discontinuity with no base. This discontinuity, more likely to be observed in cold continental lithosphere, has a very systematic behavior that makes it hard to reconcile with models that prescribe a unique tectonic history – e.g., metasomatism or imbrication and underplating during craton assembly. For example, a discontinuity that is relatively sharp with no bottom boundary and is more likely to be observed east of the Rockies at a depth that varies systematically: the shallowest discontinuities (60 km) to the west and deepest (135 km) to the east. This near-universal discontinuity in the cold continental lithosphere leads us to prefer the attenuation-related model of (Karato et al., 2015) for this class of mantle stratification. As conceived, this model can reduce velocities across the US at sub-solidus temperatures either through thermal relaxation or hydration, without the need for a deeper increase in velocities, ruling out the need for a bottom base. The depth dependence of temperature and hydration in the grain-boundary sliding model can explain the deepening of this discontinuity. It is hard to reconcile this observation with the metasomatic model.

5.4.2 *Intra-Lithosphere Layering with a Top and Bottom Boundary*

The second class of mantle stratification is the intra-lithospheric discontinuity with a top and bottom boundary. In this class, the easiest to explain is the P-type boundary – a velocity increase below a velocity decrease. Because this discontinuity is more likely to be observed in the tectonically active and recently magmatic regions or along the Appalachians, we are inclined to prefer the partial melt or metasomatic model to explain this class of mantle stratification. If the lithosphere is significantly thermally perturbed, with the infusion, into the mantle, of low-velocity iron-rich or fluid-rich minerals, partial melting or metasomatism might lead to a reduction in velocity, below which an increase in velocity, detected as a bottom base, will be observed (Karato & Park, 2018; Saha et al., 2021). The reason why this bottom base has gone undetected until now might be related to the low-frequency content of Sp-RFs with or without deconvolution (Kind & Yuan, 2018b; X. Yuan et al., 2006) compared to the higher-resolution Ps-RFs (T. M. Ougboji et al., 2013; T. Ougboji, Zhang, et al., 2023). Also, in the S-reflection technique used by (T. Liu & Shearer, 2021; T. Liu et al., 2023) the resolution is limited to shallow discontinuities (< 150 km) due to the ambiguity of distinguishing source-side and receiver-side reflections. The N-type boundary – velocity decrease below a velocity increase is harder to explain. One simple model is that this reflects relics of craton assembly or crustal underplating. A thickened crust, or subducted lithosphere embedded within a lower velocity layer is one way to explain this observation. The geological preference for regions where such a tectonic scenario can be envisioned is another reason for our preference for this model.

5.4.3 *Transitional Discontinuities and the X*

The final class of mantle stratification is transitional and sub-lithosphere discontinuities. Strictly speaking, these discontinuities are of different types and are rare: negative velocity gradients for the transition across a lithosphere to asthenosphere transition and a positive velocity gradient for the sub-lithosphere discontinuity. For the discontinuity associated with the lithosphere-asthenosphere transition, the current statistics suggest that this discontinuity is more likely to be observed in the cold continental lithosphere in the eastern US (Figures 9 and S6d). The sparsity of observations should be related to the small velocity drop at these depths due to weak thermal and compositional gradients at these depths (Fischer et al., 2010b). The rarity of the sub-lithosphere X-discontinuity at 300 km is also a clear indication that phase transformations or recycling of basalts at hotspots are very unlikely across the US (Figure S6c).

5.5 *Current Limits, Next Steps: Hales, Lehmann and Anisotropy*

In our current assessment of upper mantle stratification, the CRISP-RF approach has produced a higher-resolution and improved view of upper mantle stratification. This success is due to improvements in frequency content as well as the availability of long-running stations that allow for wavefield separation of deep mantle conversions from shallow crustal reverberations. Despite these improvements, our taxonomy of upper mantle stratification does not yet explore anisotropy as do some recent studies using anisotropic Ps-RFs (Abt et al., 2010b; Ford et al., 2016; Park & Levin, 2016a; Wirth & Long, 2014a; H. Yuan & Levin, 2014). This is because the radon-transformed Ps-RFs we use assume isotropic layering. A generalization of the CRISP-RF methodology to investigate anisotropy is a natural next step. We do argue that in future generalization of our methodology to investigating anisotropy, back-azimuthal harmonic decomposition, as described in (Levin & Park, 1998; Park & Levin, 2016b; Bostock, 1997, 1998) should be applied only after isotropic layer-stripping and attenuation of crustal reverberations using CRISP-RF. An improved method for investigating anisotropy not contaminated by shallow crustal reverberations will allow us to evaluate models that invoke anisotropy for both intra-lithosphere and sub-lithosphere discontinuities, e.g. Lehmann, Hales, and Gutenberg discontinuities (Ford et al., 2016; Gaherty & Jordan, 1995; Gung et al., 2003; Deuss, 2009; Deuss & Woodhouse, 2004)

6 Conclusions

The stratification of the upper mantle beneath the US is investigated using high-resolution Ps-converted waves after filtering out shallow crustal reverberations. After careful data curation, using 417 of the best stations that span a diversity of physiographic provinces, followed by polarity-dependent filtering, sequencing, and clustering, we obtain a new and improved taxonomy of upper mantle stratification. We observe that the most dominant type of upper mantle stratification (84% of station inventory) is within the lithosphere – about half of which are discontinuities without a base and the other half are layers with a top and bottom boundary. A re-evaluation of causal models based on our revised constraints suggests that some class of models better explain the former than they do the latter. The remainder of our stations (16%) show rare detections of discontinuities transitional between the lithosphere and the asthenosphere and an X-type sub-lithosphere discontinuity. This suggests a limited role of such discontinuities in explaining upper mantle stratification. Future work should evaluate our taxonomy on a global scale and revisit the evaluation of causal models, especially with regards to anisotropy.

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8 Open Research

The dataset used in this study can be retrieved from IRIS using Obspy’s routines for mass download. The codes and results for waveform processing is accessible in the Github repository linked to the <https://doi.org/10.5281/zenodo.10452228>. The repository contains all metadata information, Ps-RF results and station classification.

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A Taxonomy of Upper Mantle Stratification in the US

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Contents of this file

1. Figures S1, S2, S3, S4, S5, S6 S7, S8 and S9.
2. All data, codes, and files described here can be accessed on the open repository at Carr, S., & Olugboji, T. (2024). URseismology/USMantleTax: Preprint Release (0.0.1). Zenodo. <https://doi.org/10.5281/zenodo.10452228>

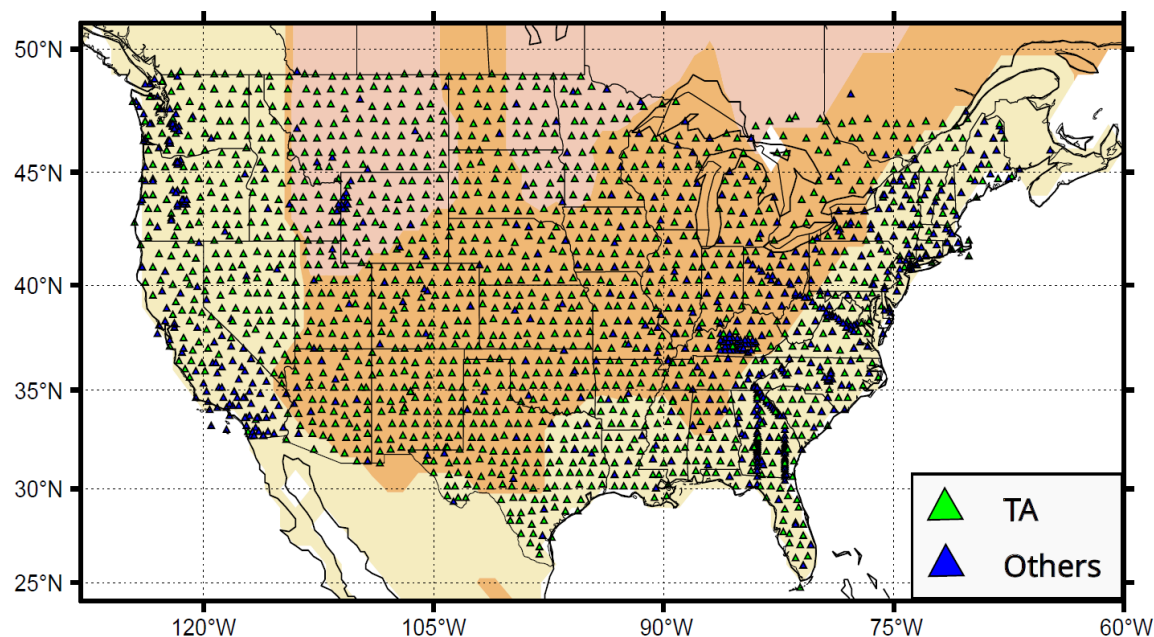


Figure S1. Distribution of all stations evaluated. Most stations belong to the transportable array (TA) with other contributing stations from all major seismic networks across the contiguous US.

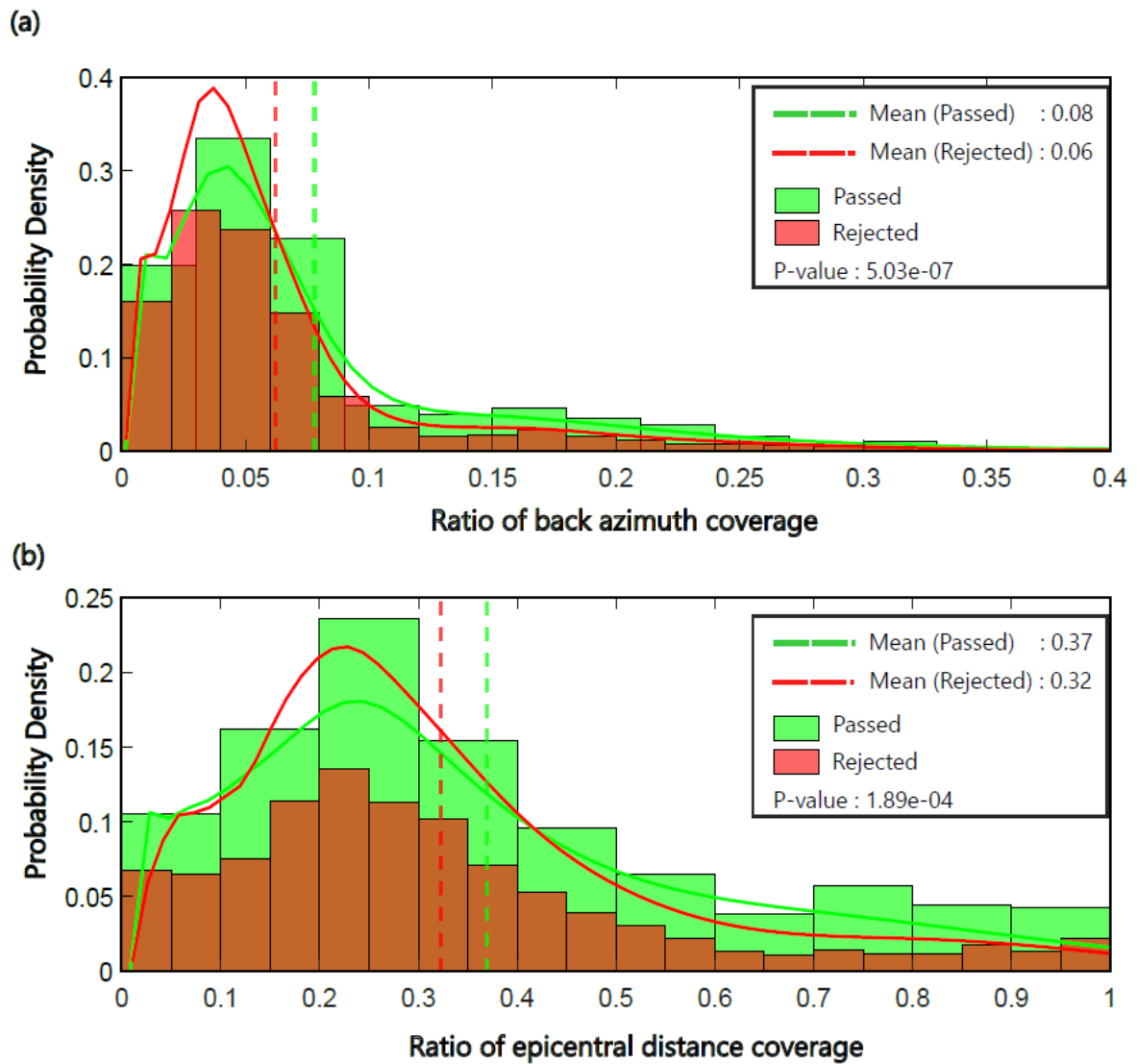


Figure S2. A statistical analysis of stations that pass (green) or fail (brown) our quality selection criteria. The 417 stations that pass are in Figure 2 of the manuscript.

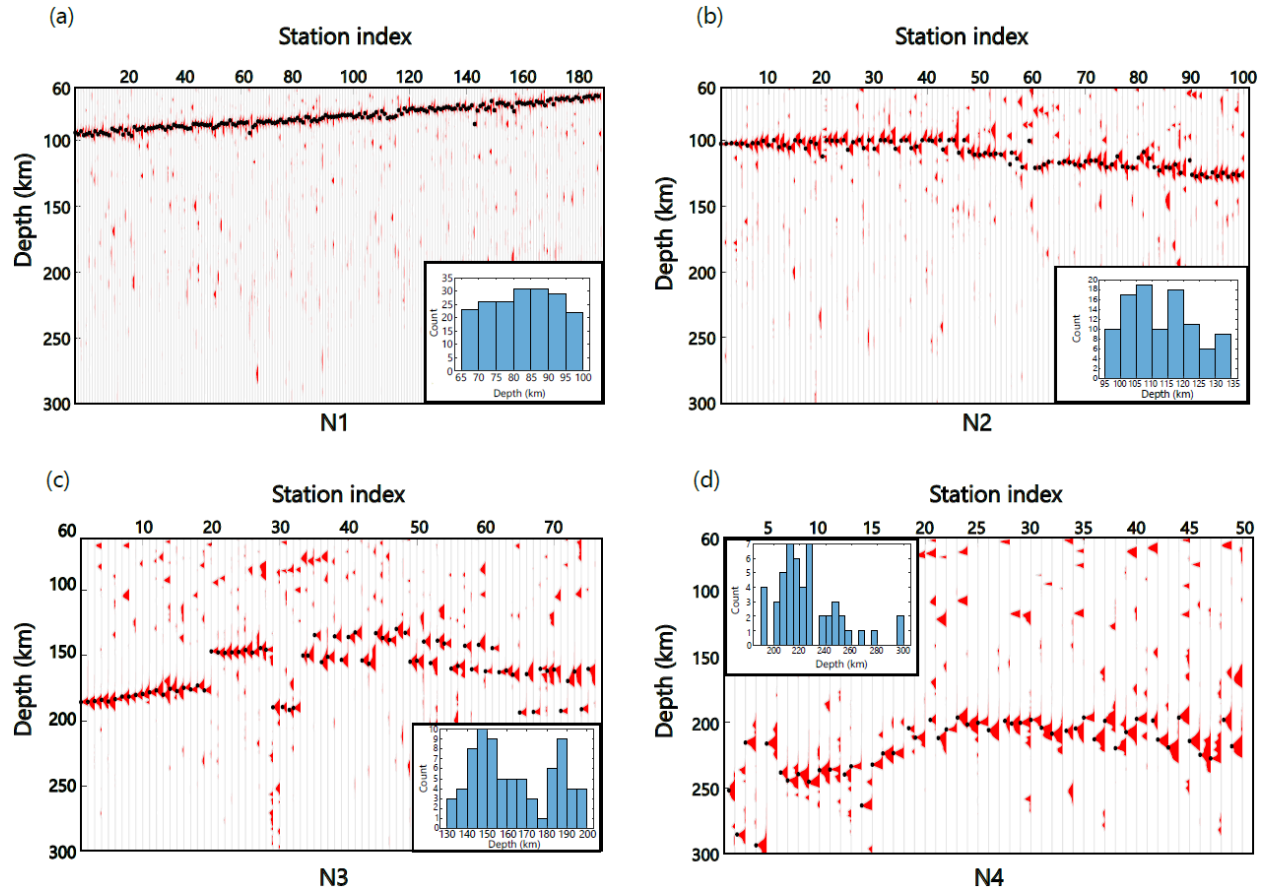


Figure S3. Stations with upper mantle discontinuities marked by a velocity drop (same as Figure 6 in the manuscript but with the depth identified as black dots and histograms)

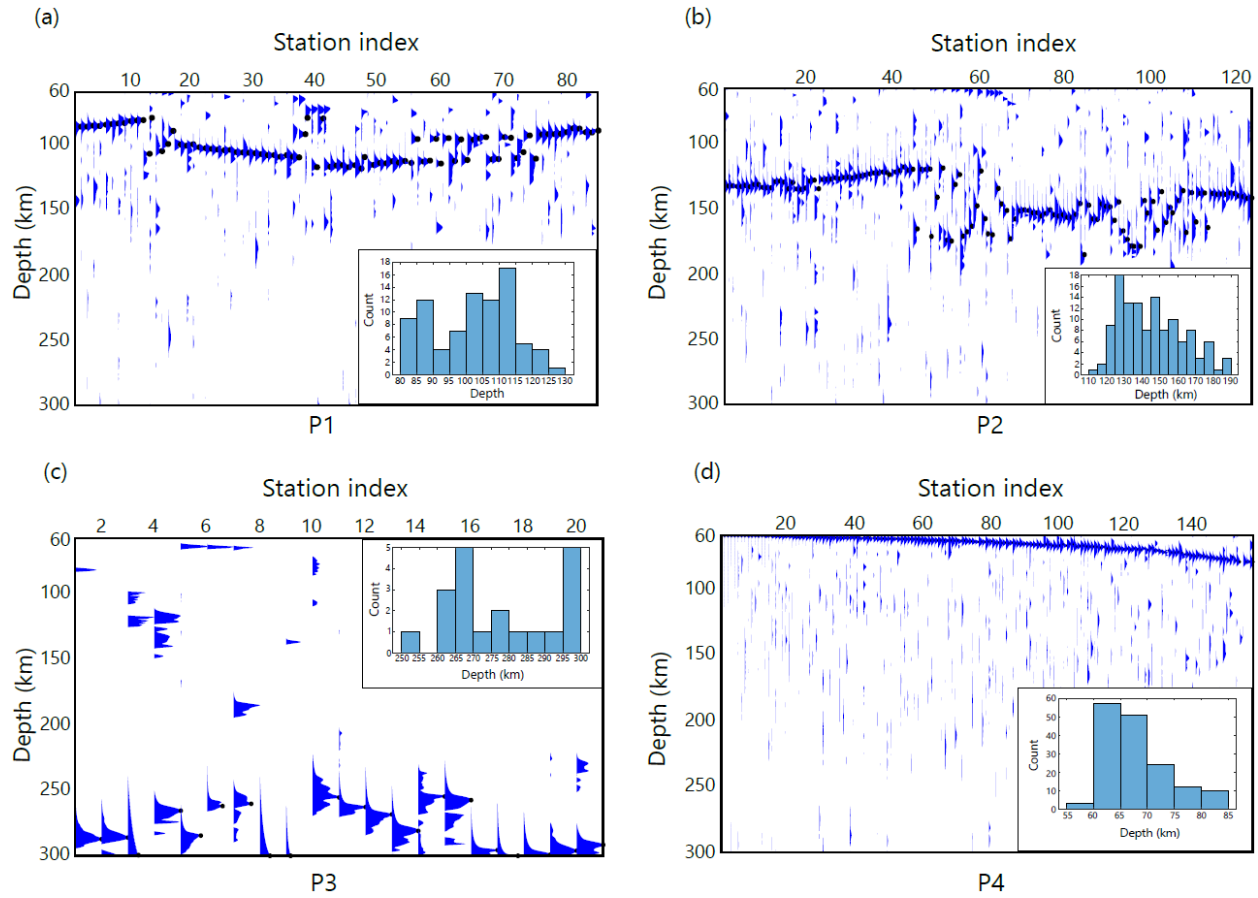


Figure S4. Same as Figure S5 and Figure 7 but for upper mantle discontinuities marked by a velocity increase (depth identified as black dots and statistics highlighted with histograms)

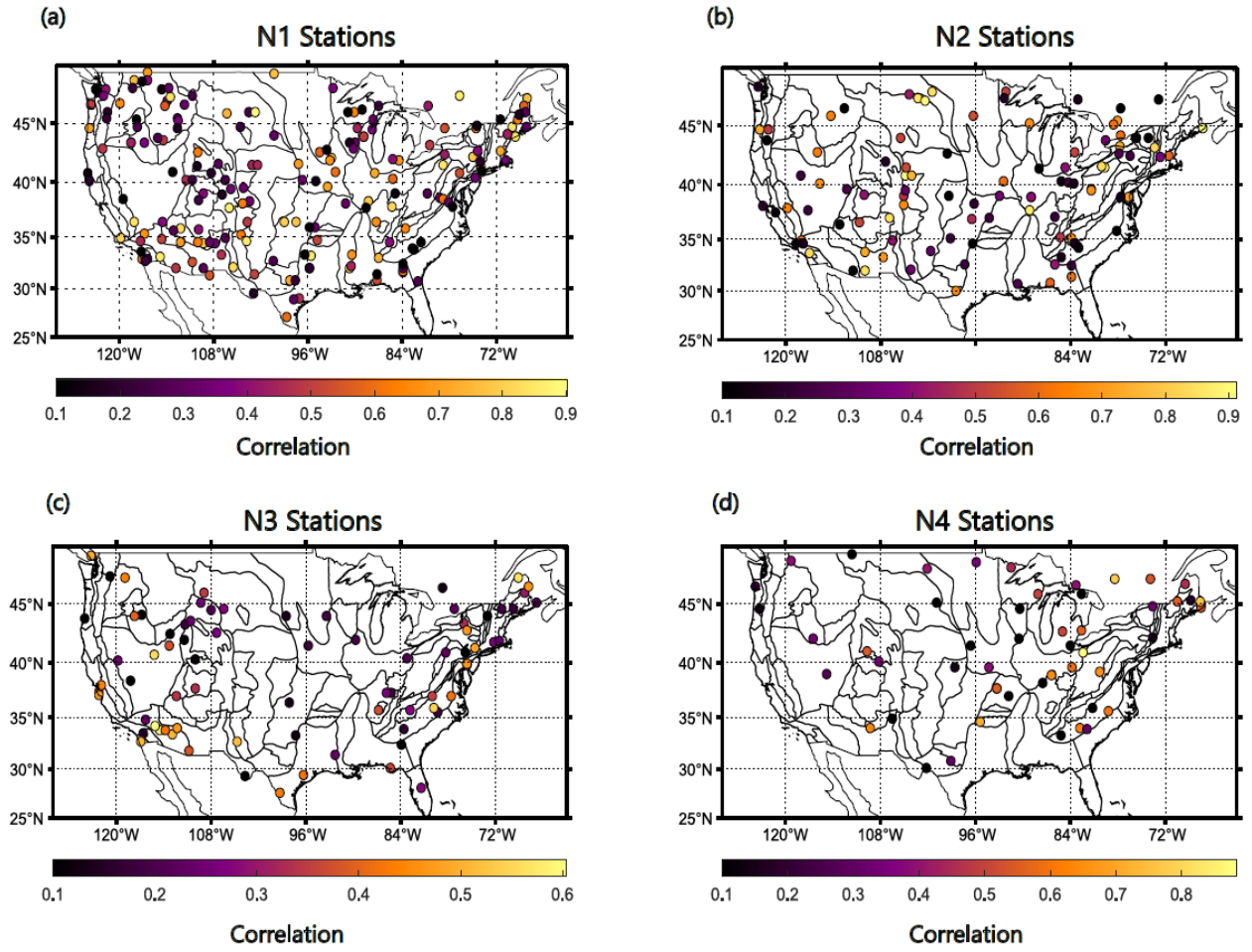


Figure S5. Geographic distribution of stations detecting intra-lithospheric and transitional discontinuities exhibiting velocity drops (N1-N4).

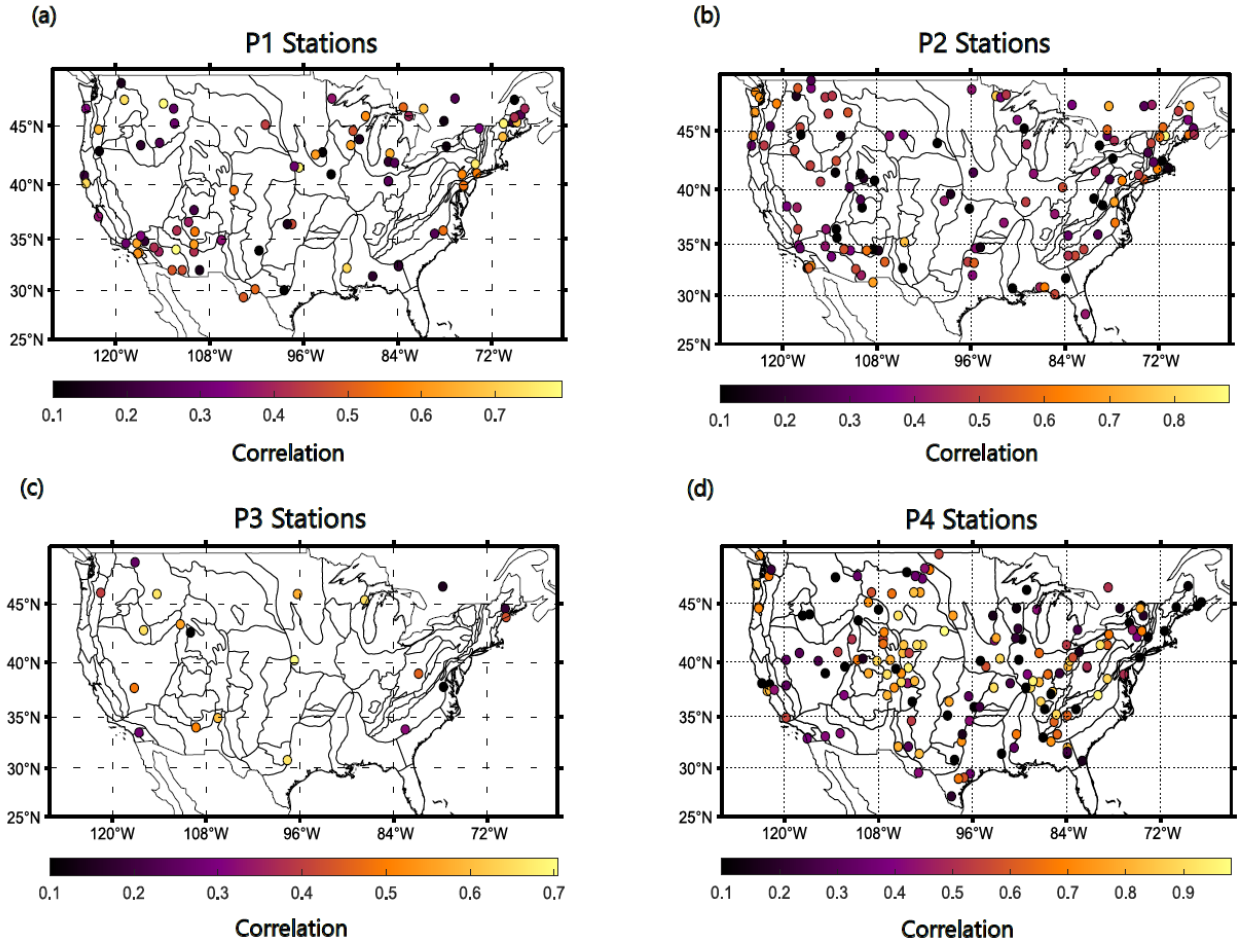


Figure S6. Geographic distribution of stations detecting intra-lithospheric and sub-lithospheric discontinuities exhibiting velocity increases (P1-P4).

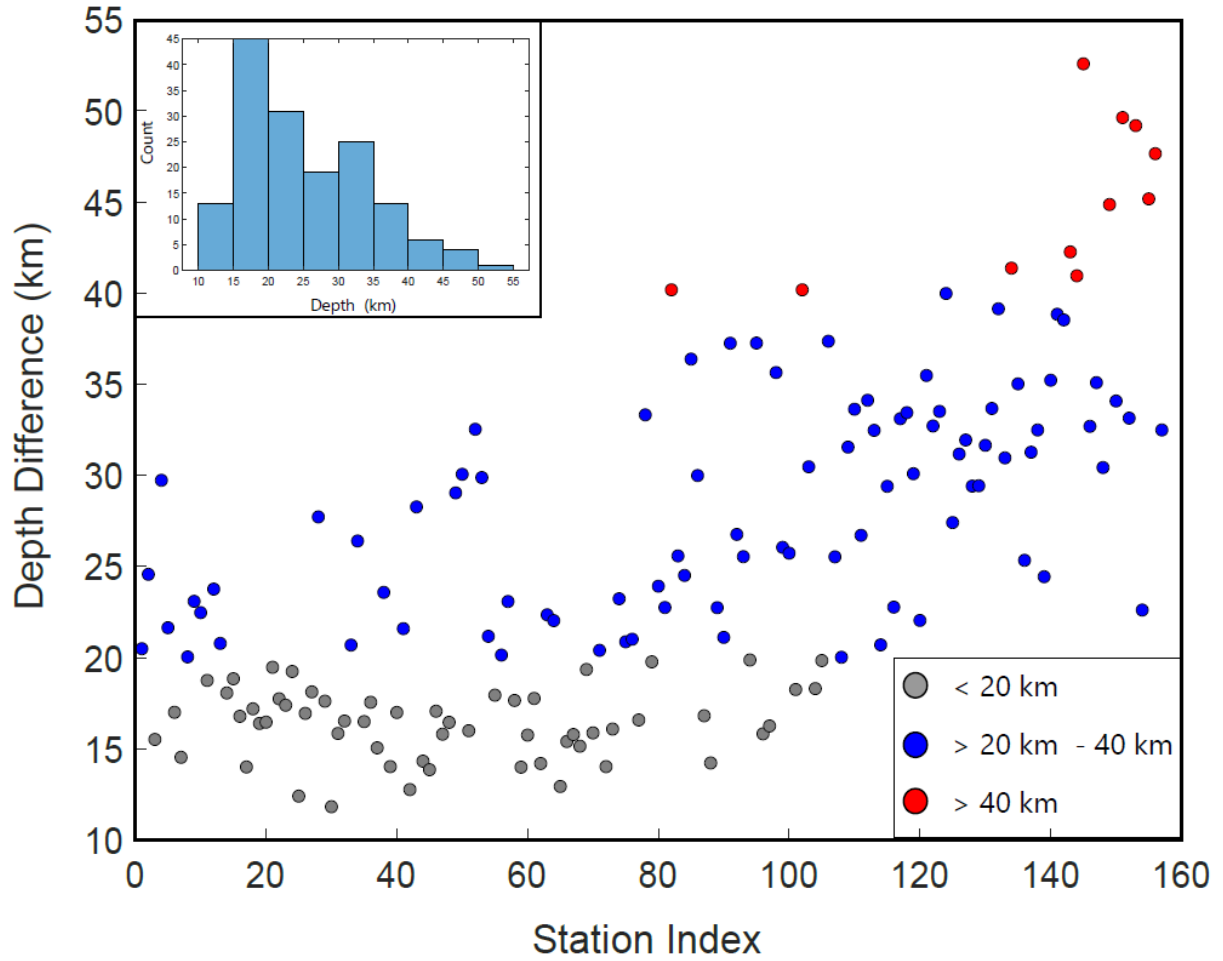


Figure S7. Analysis showing Ps-RFs in the P4 cluster are null detections for upper mantle discontinuities. Comparison of Moho depth and Ps-RF arrivals after depth migration. Most detections are sidelobes of the Moho (<20 km). Some detections are gradational Mohos (20-40 km) and others are signatures of terrane sutures.

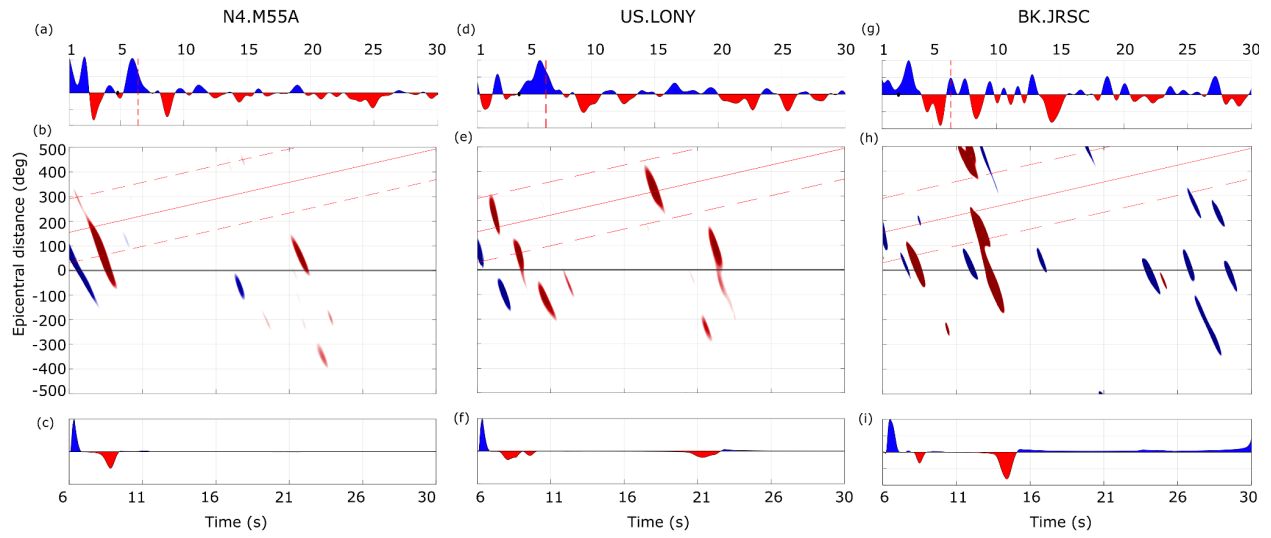


Figure S8. A selection of three Ps-RF traces from the analysis in Figure S7 above. Station N4.M55A is a moho sidelobe, US.LONY is a gradational Moho and BK.JRSC is along the previous Farallon paleo-subduction during the Laramide orogeny

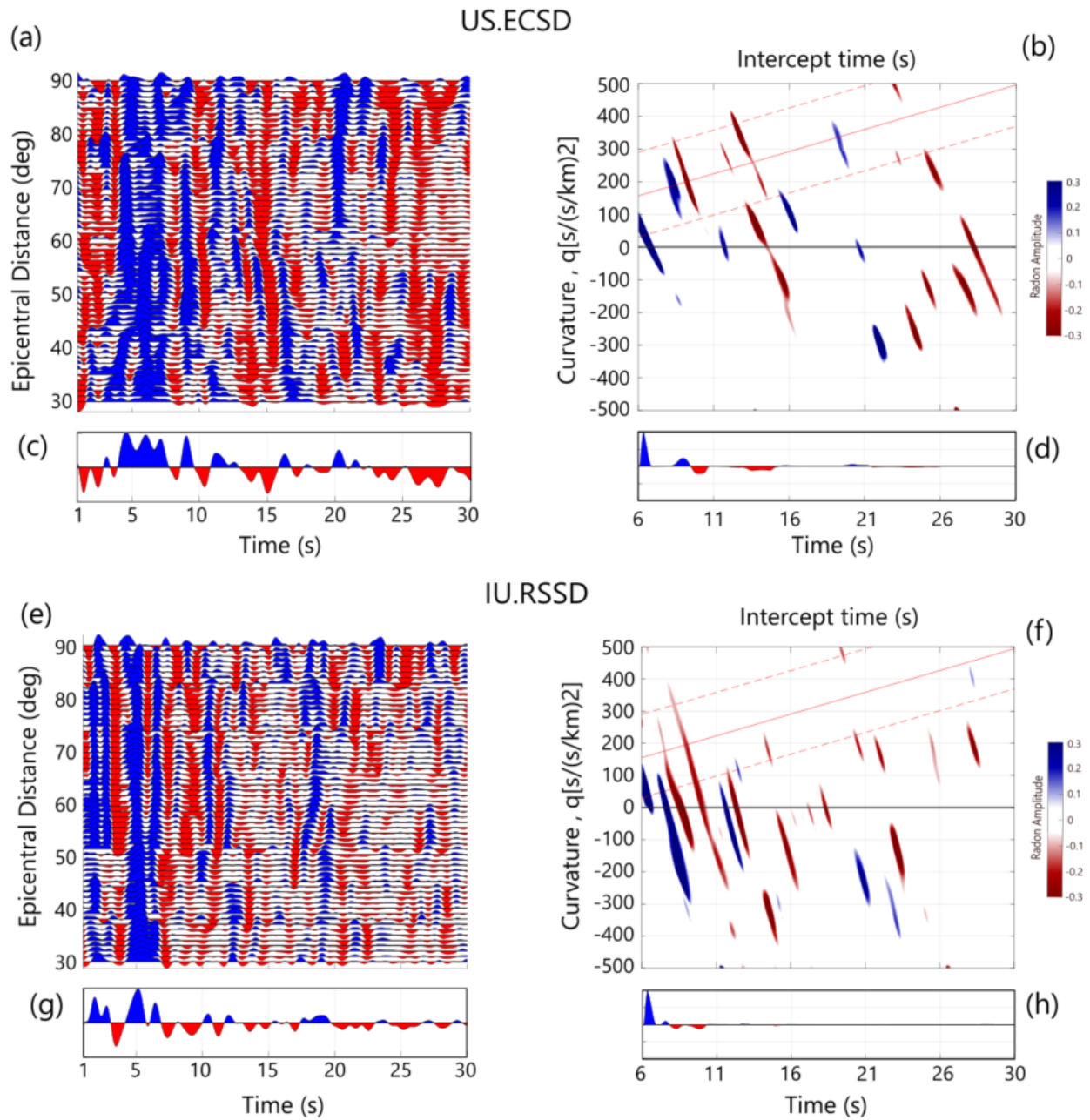


Fig. S9 An example CRISP-RF for two stations on the Wyoming craton previously studied by Liu and Shearer, 2021 and Krueger et al., 2021a