Apparent anisotropy in inhomogeneous isotropic media

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Abstract

Surface waves propagating through a laterally inhomogeneous medium undergo wavefield complications such as multiple scattering, wavefront healing, and backward scattering. Unless accounted for accurately, these effects will introduce a systematic isotropic bias in estimates of azimuthal anisotropy. We demonstrate with synthetic experiments that backward scattering near an observing station will introduce an apparent 360° periodicity into the azimuthal distribution of anisotropy near strong lateral variations in seismic wave speeds that increases with period. Because it violates reciprocity, this apparent $I\psi$ anisotropy, where ψ is the azimuthal angle, is nonphysical and is, therefore, a useful indicator of isotropic bias. Isotropic bias of the 2ψ (180° periodicity) component of azimuthal anisotropy, in contrast, is caused mainly by wavefront healing, which results from the broad forward scattering part of the surface wave sensitivity kernel. To test these predictions, we apply geometrical ray theoretic (eikonal) tomography to teleseismic Rayleigh wave measurements across the Transportable Array component of USArray to measure the directional dependence of phase velocities between 30 and 80 second period. Eikonal tomography accounts for multiple scattering (ray bending) but not finite frequency effects such as wavefront healing or backward scattering. At long periods (>50 sec), consistent with the predictions from the synthetic experiments, a significant $l\psi$ component of azimuthal anisotropy is observed near strong isotropic structural contrasts with fast directions that point in the direction of increasing phase speeds. The observed 2ψ component of azimuthal anisotropy is more weakly correlated with synthetic predictions of isotropic bias, probably because of the imprint of intrinsic structural anisotropy. The observation of a $I\psi$ component of azimuthal anisotropy is a clear indicator of isotropic bias in the inversion caused by unmodeled backward scattering and can dominate and mask the 2ψ signal. Observers are encouraged to estimate and report Iw anisotropy in their inversions for azimuthal anisotropy, to model finite frequency effects using methods that are tailored to the method of measurement, and to estimate $l\psi$ and 2ψ anisotropy simultaneously.

1. Introduction

Surface waves provide valuable and in some cases unique information about the seismic velocity structure of the crust and uppermost mantle. Recent deployments of large-scale seismic arrays, such as the USArray Transportable Array in the US (Fig. 1), present the potential to produce high resolution images of both isotropic (e.g. Yang et al. 2008; Moschetti et al. 2010b) and anisotropic structures (e.g. Moschetti et al. 2010a; Lin et al. 2010). Due to strong heterogeneity at shallow depths, however, wave-field complications such as multiple scattering or ray bending (e.g., Lin et al., 2009), wavefront healing (e.g. Nolet & Dahlen 2000), and backward scattering (e.g. Snieder 1986) can significantly affect the accuracy of surface wave tomography. This is particularly true for azimuthal anisotropy, which has a relatively weak second-order effect on observations, and may be subject to both random and systematic bias from the stronger isotropic heterogeneities.

Wavefield complexities, in general, are most important when the wavelength of a wave is comparable to or greater than the scale of heterogeneity. In this case, ray theory breaks down. Numerous theoretical and numerical studies (e.g. Wielandt 1993; Friederich et al. 2000; Bodin & Maupin 2008) have shown that the apparent phase velocity (sometimes referred to as dynamic phase velocity) inferred from phase travel time measurements with ray theory can differ substantially from the structural phase velocity. Recent work by Bodin & Maupin (2008), in particular, demonstrates the potential bias that isotropic heterogeneities can impart to measurements of (apparent) azimuthal anisotropy. These authors showed that azimuthal variations with a 360° , 180° , and 90° periodicity (i.e., 1ψ , 2ψ , 4ψ components, where ψ is azimuth) can be introduced in the presence of an isotropic velocity anomaly due to effects such as reflection and wavefront healing. We refer to such effects as "isotropic bias", which produces an "apparent anisotropy".

This study begins with simulations designed to estimate the effects of isotropic phase velocity anomalies on phase velocity measurements obtained with USArray data in the western US. The simulations will be based on recently observed isotropic phase speed maps (Lin & Ritzwoller in preparation). Although any observed phase speed map is imperfect, we believe that the anomalies are approximately correct, particularly for the major structures across the region. Focus will be at periods of 40 sec and above, where, as we will show here, isotropic bias is largest. The simulations are followed by applying a ray theoretic inversion to real data. The method applied is eikonal tomography (Lin et al. 2009), which we use here to obtain directionally dependent phase velocity measurements for Rayleigh waves between 30 and 80 sec period across the western US based on data from USArray (Fig. 1). The eikonal tomography method first tracks phase fronts across the entire array to determine the phase travel time map for each earthquake and then estimates both the direction and phase velocity at each location based on the eikonal equation:

$$\frac{\hat{k}_i(\mathbf{r})}{c_i'(\mathbf{r})} \cong \nabla \tau_i(\mathbf{r}) \tag{1}$$

where i is the earthquake index, \hat{k} is the unit wavenumber vector, τ is the phase travel time, and c' is the apparent phase velocity. The Eikonal equation is derived from the Helmholtz equation (e.g. Wielandt 1993):

$$\frac{1}{c_i(\mathbf{r})^2} = \left|\nabla \tau_i(\mathbf{r})\right|^2 - \frac{\nabla^2 A_i(\mathbf{r})}{A_i(\mathbf{r})\omega^2}$$
(2)

where c is the structural phase velocity, A is the amplitude, and ω is the angular frequency. The structural and apparent phase velocities are approximately equal $(c' \cong c)$ when either the amplitude variation of the wave is small or frequency is high enough so that the amplitude-dependent term in equation (2) can be neglected.

While the eikonal tomography method was developed for and was originally applied to ambient noise cross-correlation measurements (Benson et al. 2007; Lin et al. 2008) by Lin et al. (2009), the method can be applied to earthquake measurements in a straightforward way (Lin et al., 2010). Here, we use data following more than 700 earthquakes. Segregating by propagation direction and averaging provides estimates of the azimuthal distribution of phase velocity for Rayleigh waves. Although these estimates are robust, we present evidence that they are biased by isotropic anomalies in a way that grows with period. Aspects of isotropic bias for ambient noise tomography are discussed by Ritzwoller et al. (2010).

In both the simulations and inversions with real data, we find that spurious $I\psi$ signals are particularly strong near the edges of strong velocity contrasts at long periods (> 50 sec). The observed $I\psi$ anisotropy pattern is, in fact, consistent with predictions from the simulations based on finite frequency kernels with strong backward scattering. This apparent $I\psi$ anisotropy is nonphysical, as it violates the principle of reciprocity. Thus, the observation of $I\psi$ anisotropy is a "smoking gun" that presents clear evidence for isotropic bias in azimuthal anisotropy measurements. While bias in the 2ψ component of anisotropy is harder to evaluate due to the presence of intrinsic anisotropy with this azimuthal periodicity, we present evidence for the existence of bias at long periods (>60 sec) due to the effects of wavefront healing. At periods below about 60 sec, however, isotropic bias of 2ψ anisotropy is relatively weaker. Thus, Lin et al. (2010) combined earthquake and ambient noise dispersion measurements at periods below 54 sec in order to model azimuthal anisotropy in the western US. A study of how amplitude information can be used to reduce isotropic bias by applying the Helmholtz equation (eq. 2) directly is presented in a separate contribution (Lin & Ritzwoller in preparation).

The outline of this paper is as follows. In section 2, we present simulations to determine the probable patterns of $I\psi$ and 2ψ bias based on finite frequency kernels. In addition, we investigate whether biases arise from forward scattering effects that may potentially occur far from the

observing station, such as wavefront healing, or near-station effects such as backward scattering. In section 3, we present the result of applying eikonal tomography to earthquake measurements across the western US. In section 4, we discuss the period dependence of both the $l\psi$ and 2ψ components of azimuthal anisotropy and also discuss the implications. In section 5, we conclude with a discussion of the challenges that must be addressed in order to obtain reliable structural anisotropy information.

2. Simulation of isotropic bias

To predict the effect of isotropic bias on measurements of surface wave azimuthal anisotropy that are interpreted ray-theoretically, we perform synthetic tests based on recent isotropic phase velocity maps observed across the western US (e.g., Fig. 2a; Lin & Ritzwoller in preparation). Simulated events at a distance of 90° from the center of the observing array, each separated by 10° in azimuth, are used to synthesize phase travel time measurements across the USArray stations (Fig 1). We adopt the non-oscillatory, flat-topped finite frequency kernels (e.g. Fig. 2b) similar to those described by Ritzwoller et al. (2002) to estimate travel time perturbations due to structural perturbations within the region. For each event-station pair, the region with non-zero sensitivity (x) is defined by $|\Delta$ -(Δ_1 + Δ_2)|<3c₀T₀/8, where Δ , Δ_1 , and Δ_2 are the distances between the event and receiver, the event and position x, and the receiver and x, respectively. c_0 is the reference phase speed (the average of the input model) and T₀ is the period. Where the kernel is non-zero, the sensitivity is constant for each cross-section perpendicular to the straight ray path and is set equal to $1/Rc_0$, where R is the width of the sensitivity zone for that cross-section. To avoid infinite values of the kernel, when R < 20 km we set it equal to 20 km.

Note that the kernel extends slightly beyond the station location in the direction of wave propagation. We refer to this as backward scattering region in contrast to the rest of the kernel, which is the forward scattering region (Fig. 2b). The presence of backward scattering sensitivity is justified when backward scattering signals interfere with and are indistinguishable from the main arrival. Ritzwoller et al. (2002) truncated the sensitivity kernels to include only the forward scattering region, but we include the backward scattering part of the kernel here. This zone is very small; for example, if $c_0T_0 \sim 200$ km, the backward scattering zone extends only ~ 40 km past the station. It may, therefore, be somewhat surprising that it makes such an important contribution to isotropic bias.

We follow the eikonal tomography method described by Lin et al. (2009) here to estimate the directionally dependent apparent phase velocities from the simulated data and in section 3 based on real data. Figure 2c presents an example of the 60 sec Rayleigh wave phase travel time map determined from the synthetic phase travel time measurements across the array from a single simulated event that lies northwest of the array. We apply a minimum curvature surface fitting method to interpolate the inferred travel times onto a $0.2^{\circ} \times 0.2^{\circ}$ grid. Based on eq. (1), the gradient of this phase travel time map provides a direct estimate of the apparent phase speed,

which is summarized in Fig. 2d, as well as the direction of wave propagation at each location. The phase velocity anomalies in Fig. 2d are shifted slightly toward the event direction relative to the input model (Fig. 2a). This is due to the nonzero backward scattering sensitivity relative to the input phase speeds (Fig. 2a). This is particularly clear for the low velocity anomaly associated with the Snake River Plain. In effect, the forward edge of sensitivity appears to lead the ray theoretic wave front. Thus, a finite frequency wave approaching a low velocity anomaly (e.g., the Snake River Plain in Fig. 2a) will sense the presence of the anomaly before the anomaly is intersected by the ray. This forward sensitivity is actually caused by back-scattering from a strong structural contrast. The effect will be to shift the anomaly in the direction of the incoming wave (Fig. 2d). As we will show in section 3, this same shifting phenomenon is also observed with real data. Waves that approach the anomaly from the opposite direction will experience the anomaly similarly, but will shift the apparent location of the anomaly in the opposite direction. Near the edges of velocity anomalies, therefore, the apparent speed of the wave will be azimuthally dependent, which imparts an apparent anisotropy to the measured phase speeds.

Figure 3a shows an example from our simulations of this directional dependence in apparent phase speed measurements for the 60 sec Rayleigh wave at a point near the Snake River Plain (star in Idaho in Fig. 1). A clear 1ψ component of apparent azimuthal anisotropy is observed which is about twice as strong as the apparent 2ψ component. Waves moving toward the southeast (~150° from north), which is approximately perpendicular to the edge of the Snake River plain, appear to propagate slower than waves in the opposite direction. Both the apparent 1ψ and 2ψ signals are spurious, because the input model is isotropic. Because of the strength of the 1ψ signal, the traditional functional form for a weakly anisotropic medium (Smith & Dahlen 1973), which contains only even order sinusoids, is inappropriate to analyze azimuthal anisotropy. Instead, we will assume that phase velocity exhibits the following directional dependence:

$$c(\psi) = c_{iso} \left\{ 1 + \frac{A_{1psi}}{2} \cos(\psi - \varphi_{1psi}) + \frac{A_{2psi}}{2} \cos[2(\psi - \varphi_{2psi})] \right\} , \qquad (3)$$

where c_{iso} is the isotropic component of wave speed, ψ is the azimuthal angle measured positive clockwise from north, A_{1psi} and A_{2psi} are the peak-to-peak relative amplitude of 1ψ and 2ψ anisotropy, and φ_{1psi} and φ_{2psi} define the orientation of the anisotropic fast axes for the 1ψ and 2ψ components, respectively.

The best fitting 1ψ and 2ψ components of anisotropy (e.g. Figure 3a) across the entire western US for the 60 sec Rayleigh wave synthetic test are summarized in Figure 3b-d. A clear correlation is observed between strong 1ψ anisotropic signals and regions with large structural contrasts, as Figure 3b and 3c shows. The observed apparent fast directions always point toward higher velocities (Fig. 3a). In contrast, the 2ψ anisotropy is better correlated with linear features,

such as the Snake River Plain, where either fast or slow directions align with the linear slow or fast anomaly, respectively (Fig. 3d).

The apparent 1ψ and 2ψ anisotropy are both "isotropic bias" of the estimates of azimuthal anisotropy because the input model is purely isotropic. To further understand the part of the sensitivity kernels that produce each kind of bias, we perform synthetic tests with kernels either with sensitivity to only forward scattering or backward scattering (Fig. 2b). The observed 1ψ and 2ψ anisotropy from forward and backward scattering alone are summarized in Figure 4. The forward scattering part of the kernel produces a weak 1ψ bias (Fig. 4a) but a strong 2ψ bias (Fig. 4b). Conversely, the backward scattering part of the kernel generates a strong 1ψ bias (Fig. 4c) and a weak 2ψ bias (Fig. 4d). Thus, as mentioned earlier, backward scattering controls the 1ψ bias. The 2ψ bias is caused by wavefront healing, which is due to the broad forward scattering sensitivity.

The non-oscillatory, flat-topped kernels used in our simulations are clearly an oversimplification of the complexity of the forward problem. The kernels make clear predictions about isotropic bias, however, and their applicability is tested implicitly here as we compare the predictions with real observations in Section 3. Testing based on a direct numerical simulations (e.g., Fichtner et al. 2009; Tape et al. 2010) or other presumably more accurate kernels either with a more sophisticated theoretical treatment (e.g., Zhou et al. 2004), a numerical method (e.g., Tromp et al., 2005; Peter et al. 2007), or empirical sensitivity kernels (Lin & Ritzwoller 2010) is beyond the scope of this paper.

3. Observational methods and results

We follow the eikonal tomography method described by Lin et al. (2009) to determine the local directional dependence of phase velocities across the western US. Over 700 earthquakes that occurred between January 1st, 2006 and April 11th, 2010 with Ms magnitudes larger than 5.0 are used (Figure 5). For each earthquake, we apply automated frequency-time analysis (FTAN) to measure phase travel times at each period for all available stations. Note that the FTAN method estimates the phase information (hence the phase travel time) at the time of the maximum amplitude of the group arrival for each band-passed waveform. This means that scattered energy separated from the main arrival will not affect the phase travel time measurements. This is consistent with the use of non-oscillatory sensitivity kernels in the synthetic tests discussed in section 2. All measurements with signal-to-noise ratios less than 10 are removed from further analysis.

For each earthquake, we apply minimum curvature surface fitting to interpolate all phase travel time measurements onto a $0.2^{\circ} \times 0.2^{\circ}$ grid to construct the phase travel time maps for each period. The 2π phase ambiguity is corrected based on nearby stations and anomalous

measurements are removed before a final map is constructed (Lin & Ritzwoller in preparation). Figure 6a and 6b show two examples of the resulting phase travel time maps for the 60 sec Rayleigh wave propagating to the southeast and northwest, respectively. The maps are only meaningful where there are stations. The method smoothly extrapolates outside the observing region, but the travel times are not constrained by data. The apparent phase velocity maps computed from the gradient of the phase travel time using eq. (1) for each of these two earthquakes are presented in Figures 6c and 6d. These maps are truncated to the region of the observing stations. Note that similar to the synthetic result shown in Figure 2d, for the earthquake in which the wavefront propagates to the southeast, the apparent low phase speeds beneath the Snake River Plain shift toward the northwest (Fig. 6c). This implies that phase travel time measurements obtained on real data are also sensitive to downstream structures, presumably through backward scattering. A southeastern shift is less apparent for the wave propagating in the northwestern direction probably because of a cancellation between the slow anomaly of the Snake River Plain with the faster anomaly in southwest Wyoming.

Following Lin et al. (2009), for each location we estimate the directionally dependent phase velocity and uncertainty based on the mean and standard deviation of the mean within each 20° azimuthal bin, respectively. A 9-point (3×3 grid with 0.6° separation) averaging scheme is used to reduce small-scale variations (Lin et al. 2009). Figures 7a and 7b present two examples of the directionally dependent phase velocities for 60 sec Rayleigh waves at locations near the Cascade Range and the Snake River Plain (stars in Fig. 1), respectively. At each location, we fit the observed velocity measurements with eq. (3) to simultaneously estimate the 1ψ and 2ψ components of azimuthal anisotropy. Significant 1ψ components of apparent anisotropy are observed at each location and both observations agree qualitatively with the synthetic predictions. The non-physical 1ψ apparent anisotropy signal (>3% amplitude) dominates potential intrinsic 2ψ anisotropy, which is typically has amplitudes less than 2% (e.g., Marone & Romanowicz 2007; Lin et al. 2010).

The estimated 1ψ and 2ψ anisotropic signals from real data for 60 sec Rayleigh waves across the western US are summarized in Figure 8. Clear correlations between strong 1ψ anisotropy and edges of structural boundaries are observed with fast directions that point toward the faster structures (Fig. 8a and 8b). Regions with the most significant 1ψ anisotropy amplitudes (> 4%) are associated with the sharpest velocity contrasts in the western US, such as the edges of the Snake River Plain slow anomaly, the Colorado Plateau fast anomaly, and the fast anomaly of the subducted Juan de Fuca Plate near the Cascade Range. The pattern of the observed 1ψ anisotropy is similar to the synthetic prediction shown in Figures 3b and 3c. The observed 2ψ anisotropy, on the other hand, is in general weaker than the observed 1ψ anisotropy (1% on average for 2ψ signals compared to 1.6% for 1ψ signals) and shows a less clear relationship with the isotropic structures. This suggests that the observed 1ψ and 2ψ anisotropy are different in nature. The correlation between the observed (Fig. 8c) and predicted (Fig. 3d) 2ψ patterns is also weak (see

section 4.1). This is probably due to the existence of intrinsic 2ψ anisotropy although inaccuracy of the forward scattering part of the sensitivity kernel may also contribute.

4. Discussion

Simulations and observations with real data both establish that isotropic bias poses a significant problem for the inference of intrinsic azimuthal anisotropy and that this bias worsens as period increases. Thus, we consider here two principal questions. First, is there is a period threshold below which observers can safely ignore isotropic bias even within the context of ray theory (e.g., eikonal tomography)? Second, what can observers do to diagnose whether their estimates of azimuthal anisotropy are biased by isotropic heterogeneities and minimize isotropic bias?

As discussed above, finite frequency (non-ray theoretic) effects produce both $I\psi$ and 2ψ apparent anisotropy. However, the physics of the phenomena are different in each case. The apparent $I\psi$ signal is caused by backward scattering from a sharp velocity contrast in the neighborhood of the observing station. The apparent 2ψ bias, on the other hand, is caused by wavefront healing during the forward progress of the wavefront, which is modeled by the broad forward scattering part of the finite frequency kernel. Because $I\psi$ anisotropy is nonphysical, its observation provides unambiguous evidence for isotropic bias. To draw conclusions about the period dependence of $I\psi$ isotropic bias, therefore, is straightforward and is the subject of section 4.1. However, observations of 2ψ anisotropy may either be caused by bias from isotropic structures, by intrinsic anisotropy within the earth, or by an unknown combination of both. The period dependence of 2ψ isotropic bias, therefore, is more ambiguous, and is discussed in section 4.2.

To investigate the period dependence of the isotropic bias, Figures 9 and 10 present the observed and simulated $I\psi$ and 2ψ anisotropy for the 40 and 80 sec period Rayleigh waves to compare with the results at 60 sec period in Figures 3 and 8. Our most recent isotropic phase velocity maps (Lin & Ritzwoller in preparation) at each period are plotted in the background of the $I\psi$ results and are the basis for the simulations. In addition, to quantitatively compare the amplitude of the bias of anisotropy predicted from the synthetic tests to the observations with real data, Figures 11a and 11b present the percentage of the region with significant anisotropic amplitudes as a function of period. We consider anisotropic amplitudes of 2% and 1% as the significance threshold for $I\psi$ and 2ψ anisotropy, respectively. The region east of 255° is not included in this analysis due to shorter spans of deployment for the stations in this region. To compare the direction of biased anisotropy predicted from the synthetic tests to observations with real data, Figure 11c shows the vector correlation between the predicted and observed fast directions within the region of significant predicted and observed anisotropy amplitudes. Here, we define 1% and 0.5% anisotropy amplitudes as significant for $I\psi$ and 2ψ anisotropy, respectively. The vector correlation, α_{ab} , between two directional distributions \hat{a}_i and \hat{b}_i (i=1,...,N) is defined as

$$\alpha_{ab} = \frac{\sum_{i=1}^{N} (\hat{a}_i - \langle \hat{a} \rangle) \cdot (\hat{b}_i - \langle \hat{b} \rangle)}{\sqrt{\sum_{i=1}^{N} (\hat{a}_i - \langle \hat{a} \rangle)^2} \sqrt{\sum_{i=1}^{N} (\hat{b}_i - \langle \hat{b} \rangle)^2}},$$
(4)

where \hat{a}_i and \hat{b}_i are unit vectors and i is the location index. Because of the 180° periodicity of fast directions for 2ψ signals, the azimuth of each fast direction is first multiplied by 2 for the 2ψ analysis before inserting into eq. (4). The correlation coefficient α ranges from -1 to 1. When \hat{a}_i and \hat{b}_i point in the same direction for the 1ψ or 2ψ component the coefficient will equal 1. The coefficient will be -1 when \hat{a}_i and \hat{b}_i point in the opposite direction everywhere for the 1ψ component and are everywhere perpendicular to each other for the 2ψ case.

4.1 Period dependence of $I\psi$ isotropic bias

Due to the reciprocity principle, intrinsic structural anisotropy cannot manifest a $I\psi$ azimuthal component. The clear correlation between the observed 1ψ anisotropy and isotropic structural boundaries, therefore, suggests that the $I\psi$ anisotropy is purely isotropic bias. The fact that the amplitude of the observed $I\psi$ anisotropy increases with period (e.g. Fig. 11a) indicates that it is a finite frequency effect. But, at what period does the $I\psi$ anisotropy become significant?

To compare with the observed results for the 60 sec Rayleigh wave (Fig. 8), Figure 9a,b,d,e presents the observed $I\psi$ anisotropy at 40 and 80 sec period, respectively. Measurable $I\psi$ signals are observed at both periods near the edges of prominent velocity anomalies, but the signals are significantly weaker at 40 sec than at 60 sec or 80 sec period. At 40 sec period, the wavelength of the Rayleigh wave is ~150 km and the backward scattering sensitivity extends only ~30 km behind the station. Given the ~70 km station spacing for the USArray, a sharp structural boundary half way between two stations will have only a weak effect on the phase travel time measurements at the two stations at this period. For periods shorter than 40 sec, therefore, backward scattering is less severe than at longer periods. At 80 sec period, the observed $I\psi$ anisotropy pattern (Fig. 9e) is similar to the 60 sec result (Fig. 8b), although the pattern is more variable. This may be due to the degrading data quality at the longer periods (only 545 events satisfy the selection criterion at 80 sec compared to 775 and 743 events for 40 and 60 sec period, respectively).

The simulations for the 40 and 80 sec period Rayleigh waves are summarized for apparent $l\psi$ anisotropy in Figure 10a,b,d,e to contrast with the observed results in Figure 9 and the simulations at 60 sec period presented in Figure 3. Similar to the 60 sec results, the predicted $l\psi$ anisotropy patterns correlate well with the observations based on real measurements, particularly at 80 sec period.

Figure 11a, which presents the percentage of the region with significant anisotropic amplitudes as a function of period, demonstrates that the synthetic tests slightly underestimate the real $I\psi$

isotropic bias, but does correctly predict the growth of the $I\psi$ signal with period. The discrepancy may be caused by random noise in the measurements, the sensitivity kernels inaccurately reflecting the real sensitivity of the measurements, or the underestimation of the amplitude of the isotropic velocity anomalies in the input phase velocity maps (Lin & Ritzwoller in preparation). Figure 11c demonstrates that there is good correlation (α >0.7) between the predicted and observed fast directions for $I\psi$ anisotropy at all periods, which suggests that the kernels we use to model backward scattering accurately reflect the observed bias in the $I\psi$ anisotropy.

In summary, the simulations and observations with real data agree substantively qualitatively and quantitatively. They establish that the 1ψ bias increases with period and becomes particularly significant above about 50 sec period which the corresponding backward scattering sensitivity extended ~35 km behind each station roughly the same as the half station spacing.

4.2 Period dependence of 2ψ isotropic bias

Because of the existence of intrinsic 2ψ anisotropy in the earth, determination of the bias in the 2ψ signal is much harder than for $I\psi$ anisotropy. At all periods, the observed 2ψ signal is some combination of real anisotropy and bias and separating these effects is problematic. This is exacerbated by the fact that our simulations of wavefront healing through a forward scattering finite frequency kernel (which produces the 2ψ bias) may be less accurate than our simulations of backward scattering (which produces the $I\psi$ bias) because the kernels may be too broad (e.g., Yoshizawa & Kennett 2002; Zhou et al. 2005). It is reasonable to assume, however, that wavefront healing, and therefore the 2ψ bias, would set on at about the period that the corresponding wavelength becomes comparable to the scale of major isotropic anomalies. By estimating this scale as ~200 km in the western US, the 2ψ anisotropy is probably significantly biased only above about 50 sec period, similar to $I\psi$ anisotropy. We present several lines of circumstantial evidence that point to the observed 40 sec 2ψ map (Fig. 9c) being much less biased by isotropic structures than the maps above about 50 sec period (Fig. 8c, 9f).

First, the simulated 2ψ bias maps at 40 sec and 80 sec shown in Figures 10c and 10f are very similar in the 2ψ fast directions and the distribution of high amplitude features, and differ mainly in the amplitude of the bias. However, the observed 40 sec and 80 sec maps in Figures 9c and 9f are quite different from each other with a fast direction correlation coefficient equal only to 0.24 for regions where the amplitude of anisotropy is larger than 0.5%. We believe this is because the observed 40 sec map is dominated by intrinsic anisotropy whereas the 80 sec map is much more strongly biased. It is unlikely that the intrinsic anisotropy at these two periods, which are both sensitive predominantly to the uppermost mantle, are uncorrelated. Second, close inspection reveals that the observed 40 sec and 80 sec 2ψ maps differ mainly where the simulated 80 sec 2ψ bias in Figure 10f is largest. Third, as Figure 11b shows, significant simulated 2ψ bias occurs at 40 sec period over an area only about 1/3 the size of significant observed 2ψ anisotropy.

Although we are concerned about the absolute accuracy of our 2ψ simulations, the relative area of significant 2ψ bias in our simulations more than doubles between 30 sec and 60 sec period. Fourth, as Figure 11c illustrates, at 70 sec and 80 sec period the predicted and observed fast directions are better correlated (α ~0.5) with each other than at shorter periods, which implies that the isotropic bias in 2ψ anisotropy cannot be ignored at the longer periods.

This evidence is consistent with the belief that isotropic bias of 2ψ anisotropy is most severe above about 50 sec period and the 2ψ maps based on ray theory (e.g., eikonal tomography) will be most reliable below this period. We acknowledge that this reasoning is not iron-clad, as our simulations have their limitations. Future efforts to improve the accuracy of the simulations of 2ψ bias would be useful. More useful, perhaps, would be efforts to model finite frequency effects in inversions directly, which is the approach taken by Lin and Ritzwoller (manuscript in preparation, 2010). This approach yields very different observed 2ψ anisotropy at 80 sec period but very similar 2ψ anisotropy at 40 sec period compared to the results presented here. In addition, the observed fast directions are better correlated across period. For example, the fast direction coefficient between observations at 40 and 80 sec period approximately doubles compared to the ray theoretic results presented here.

4.3 What are observers to do?

While the $I\psi$ and 2ψ isotropic bias are probably due to different finite frequency effects, as indicated by the synthetic tests (Fig. 4), the observation of a $I\psi$ component of anisotropy nevertheless should be considered as a indicator of some level of isotropic bias in the 2ψ component. Although it is harder to discriminate the 2ψ isotropic bias from intrinsic anisotropy, the results shown in section 4.2 suggest that the bias is probably important at periods >50 sec where the $I\psi$ signal is particularly strong. It is possible that the backward scattering effect may be less important for global-scale tomography and the threshold for significant isotropic bias may shift to longer periods. But this is speculative and it would be prudent for global-scale modelers also to consider the recommendations here. In addition, surface wave dispersion measurements obtained from ambient noise are not exempt from isotropic bias. Ritzwoller et al. (2010) demonstrate that $I\psi$ anisotropy is also observed in ambient noise surface wave tomography at periods greater than ~50 sec (Ritzwoller et al. 2010).

First, observers would be well advised to estimate and report $I\psi$ anisotropy in their inversions. The observation of a weak $I\psi$ component of anisotropy is evidence for weak isotropic bias. A strong $I\psi$ signal is cause for concern that the 2ψ signal is biased and efforts must be taken to minimize the bias

Second, observers are encouraged to model finite frequency effects, particularly wavefront healing and backward scattering, in their inversion for azimuthal anisotropy. The use of finite frequency kernels that are not tuned to the measurements, however, may offer little help in reducing both the $l\psi$ and 2ψ bias. The weak correlation between the predicted and observed 2ψ

fast directions where the predicted anisotropy amplitude is significant, as demonstrated in Fig. 11c, is evidence that the ad-hoc finite frequency kernels used in this study may not faithfully reproduce the 2ψ bias effect. We note that we also carried out the synthetic experiments with oscillatory analytical kernels, which performed worse than the non-oscillatory kernels in matching the observed $I\psi$ bias. However, they produced geometrically similar results for the 2ψ bias but with reduced amplitudes. Lin and Ritzwoller (manuscript in preparation, 2010) discuss the effect of applying finite frequency corrections via the Helmholtz equation (eq. (2)).

Third, the $I\psi$ signal may be misinterpreted as the 2ψ component of anisotropy when the data distribution is not homogeneous in azimuth. Figure 12 presents examples using the directionally dependent phase velocity measurements shown in Figure 7. The green line fits the observations in which both the $I\psi$ and 2ψ components are specified in the regression (i.e., eq. (3)). The 2ψ part of this regression is shown with the black solid line. Thus, in Idaho near the Snake River Plain (Fig. 12b), simultaneous specification of the $I\psi$ and 2ψ components in the regression produces a 2ψ component with the small amplitude of 0.1%. However, if the regression is performed without specifying the $I\psi$ component, then the 2ψ term attempts to fit the observed azimuthal distribution and the estimated amplitude of the 2ψ term increases to 1.8%. The situation is not as severe near the Cascade Range in Oregon (Fig. 12a), but the $I\psi$ bias affects the orientation of the 2ψ fast direction by about 30° .

5. Conclusion

In this study, we discuss the significance of isotropic bias in measurements of azimuthally anisotropic phase velocities obtained from surface waves based on ray theoretic inversions. We demonstrate that significant $I\psi$ anisotropy bias, which is nonphysical because to the principle of reciprocity, is clearly observed in the western US at long periods (> 50 sec) based on eikonal tomography (Lin et al. 2009). The clear correlation between observed $I\psi$ anisotropy and sharp contrasts in isotropic structures and the fact that the amplitude of anisotropy increases with period strongly suggest that the $I\psi$ anisotropy is a form of isotropic bias caused by finite frequency effects that are unaccounted for in the inversion.

Most studies of finite frequency effects on surface waves have focused on wavefront healing caused by forward scattering (e.g., Nolet & Dahlen 2000; Ritzwoller et al. 2002; Zhou et al. 2005). Near station finite frequency sensitivity, on the other hand, has rarely been explored, probably because the spatial extent of the region with strong backward scattering sensitivity is very small and it is surprising that its effect on long period surface wave measurements is important. Accurate expression of the near station sensitivity is particularly important for regional scale array studies such as our focus here (Yang & Forsyth 2006). Based on our simulations, the significant $I\psi$ signals that we observe near strong velocity contrasts as well as the spatial shift of the observed anomalies (e.g., Fig 6c) cannot be accounted for with the forward scattering part of the sensitivity kernel alone. They are explained, however, by near station backward scattering that provides sensitivity that leads the arrival of the theoretical ray. Thought

of ray theoretically, the back scattering part of the sensitivity kernel is caused by reflected signals propagating backward that interfere with the primary signal and affect the phase travel time measurement. While surface waves reflected from sharp velocity contrasts have been identified at periods less than 30 sec (e.g., Ji et al. 2005; Stich & Morelli 2007), the reflections discussed here merge with the main surface wave packet.

The effect of backward scattering on surface wave phase travel time measurements is probably only strong when the distance between a sharp structural boundary and the station is within ~3/16 of wavelength. Considering the ~70 km station spacing for USArray, any structural boundary that appears right in the middle of two stations will cause no backward scattering effect when the wavelength is less than ~200 km, which roughly corresponds to 50 sec Rayleigh wave. This is a plausible explanation for why finite frequency effects begin to manifest themselves at about 50 sec period across the western US.

The observation of a $I\psi$ signal at long periods potentially provides a means to improve the resolution of structural boundaries at depth, which is crucial to distinguish thermal from composition structural variations in the upper mantle. To achieve this, however, precise knowledge of the near station sensitivity kernel will be required. Accurate expression of the sensitivity depends on the measurement method (Tromp et al., 2005). Here, we have chosen an exceptionally simple form for the finite frequency kernels and have found that the first-order patterns of the observed $I\psi$ signals are predicted relatively well. Although inferring a more accurate expression for the near station sensitivity is beyond the scope of this paper, we find that finite frequency kernels with near-station multiple side lobes do not predict the observed $I\psi$ anisotropy pattern. This may be because our measurement method is based on Frequency-Time Analysis (FTAN), which effectively removes the influence of wave groups that are well separated from the main arrival. A fully 3D numerical simulation might be required to provide better insight (e.g., Fichtner et al. 2009; Tape et al. 2010).

Although estimating the 2ψ bias is not as straightforward as $I\psi$ bias due to the existence of intrinsic 2ψ azimuthal anisotropy, there are several lines of evidence that suggest the presence of 2ψ bias at long periods (>50 sec) where the wavelength is comparable or larger than the scale of major isotropic structures in the region. Based on our synthetic tests, the 2ψ bias is mainly caused by wavefront healing which arises from the broad forward scattering part of the sensitivity kernel, and correlation can be observed between predicted and observed 2ψ fast directions at long period (> 60 sec) where predicted 2ψ bias is strong. The strong isotropic bias in 2ψ anisotropy at long periods probably is responsible for the weak correlation between the observed 2ψ anisotropy fast directions across different periods. In a separated contribution, we show that the observed 2ψ anisotropy is better correlated across different periods when finite frequency effects are accounted for in the inversion (Lin & Ritzwoller in preparation).

To evaluate isotropic bias in azimuthal anisotropy measurements properly, we encourage observers to estimate and report $I\psi$ anisotropy in their inversions, to model finite frequency

effects using methods that are tailored to the method of measurement, and to estimate $I\psi$ and 2ψ anisotropy simultaneously.

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Figure captions

Figure 1. The USArray Transportable Array (TA) stations used in this study are identified by black triangles. The two stars identify locations used later in the paper. Red lines mark the tectonic boundaries in the western US. CAS: Cascade Range; SNR: Snake River Plain; CP: Colorado Plateau.

Figure 2. (a) The structural phase velocity map for the 60 sec Rayleigh wave used as the input model for the synthetic tests. (b) Example of the 60 sec Rayleigh wave non-oscillatory, flattopped finite frequency kernel used in the simulations. This kernel is for TA station Q22A (Crested Butte, Gunnison, CO) for an event in the northwest direction. The green area near the station defines the backward scattering region, which is separated from the broad region of forward scattering. The insert shows a blow up of the region near the station. (c) The 60 sec Rayleigh wave phase travel time map determined from the synthetic phase travel time measurements across the array (triangles) for an event in the northwestern direction. Contours are separated by 60 sec intervals. The arrow indicates the direction of wave propagation. (d) The apparent phase velocity derived from (c) based on the eikonal equation (eq. (1)). The Snake River Plain low velocity anomaly shifts toward the northwest, opposite to the direction of wave propagation.

Figure 3. (a) The directionally dependent phase velocity measurements (red bars) for a point in Idaho northwest of the Snake River Plain (star in Fig. 1) for the 60 sec Rayleigh wave simulation. The green line shows the best fitting curve based on eq. (3) where the amplitudes of the 1ψ and 2ψ components are shown. (b) The predicted 1ψ fast directions at locations where the 1ψ amplitude is larger than 2% are shown with arrows. The input phase velocity model (Fig. 2a) is shown in the background as a reference. (c) The predicted 1ψ amplitudes. (d) The predicted 2ψ anisotropy. The fast propagation direction and anisotropy amplitude are presented by the orientation and length of the red bars. The anisotropy amplitude is also plotted in the background.

Figure 4. (a)-(b) The predicted 1ψ and 2ψ anisotropy based on the forward scattering kernels alone. In (a), the arrows present 1ψ fast directions with 1ψ anisotropy amplitude larger than 0.75%. The anisotropy amplitude is plotted in the background. In (b), 2ψ fast propagation directions and anisotropy amplitudes are presented by the orientation and length of the red bars. The anisotropy amplitude is also plotted in the background. (c)-(d) Same as (a)-(b), but with

backward scattering kernels alone. In (c), the fast directions are presented by arrays only when anisotropy amplitudes are larger than 1.5%.

- **Figure 5.** The earthquakes used in this study. Circles mark the location of the earthquakes, the star is the center of our study region, and the lines between circles and the star are great-circle paths. The two yellow circles and paths mark the earthquakes used in Figure 6.
- **Figure 6.** (a) The 60 sec Rayleigh wave phase travel time map for the January 9th, 2008 earthquake near Queen Charlotte Islands (Ms=5.9). The stations with available phase travel time measurements used to construct the map are shown as triangles. Contours are separated by intervals of 60 sec. The arrow indicates the direction of wave propagation. (b) Same as (a) but for the June 17th, 2008 earthquake south of Panama (Ms=5.3). (c)-(d) The apparent phase velocity maps derived from (a) and (b) based on eq. (1). The inserts show blow ups of the region near the Snake River Plain with the stations used shown as triangles.
- **Figure 7.** (a) The directionally dependent phase velocity measurements at a point near the Cascade Range (star in Fig. 1). The red bar summarizes all measurements within each 20° azimuthal bin with their mean and standard deviation of the mean. The green solid line shows the best fitting curve of eq. (3) to the measurements with 1ψ and 2ψ amplitude also indicated in the panel. The best fitting curve based on the synthetic test is also plotted as the blue dashed line. (b) Same as (a) but for a point near the Snake River Plain (star in Fig. 1)
- **Figure 8.** Same as Fig. 3b-d, but with real data measurements for the 60 sec period Rayleigh wave.
- **Figure 9.** Same as Fig. 8, but with real data measurements for the 40 sec (a)-(c) and 80 sec (d)-(g) period Rayleigh waves.
- **Figure 10.** Same as Fig. 9, but with simulated measurements at 40 sec (a)-(c) and 80 sec (d)-(g) period.
- **Figure 11.** (a) Percentage of the studied region where the predicted (green dash line) or observed (solid red line) 1ψ anisotropy amplitude is greater than 2% as a function of period. (b) Same as (a), but for 2ψ anisotropy greater than 1%. (c) The correlation in the fast direction between the predicted and observed 1ψ (solid red line) and predicted and observed 2ψ (green dash line) anisotropy. Only regions with significant predicted anisotropy amplitudes (>2% for 1ψ and >1% for 2ψ) and meaningful observed anisotropy amplitudes (>1% for 1ψ and >0.5% for 2ψ) are included in the analysis.

Figure 12. (a)-(b) Directionally dependent phase velocity measurements of 60 sec Rayleigh wave obtained with the real data near the Snake River Plain and near the Cascade Range. (Same as Fig. 7a-b but with two additional 2ψ curves.) The black thin line is the best fitting 2ψ curve when both 1ψ and 2ψ are fit spontaneously and the dashed gray line is the best fitting 2ψ curve when only the 2ψ component is fit. Both fast direction and amplitude can be quite different for the two 2ψ lines depending on if 1ψ is specified simultaneously in the regression.

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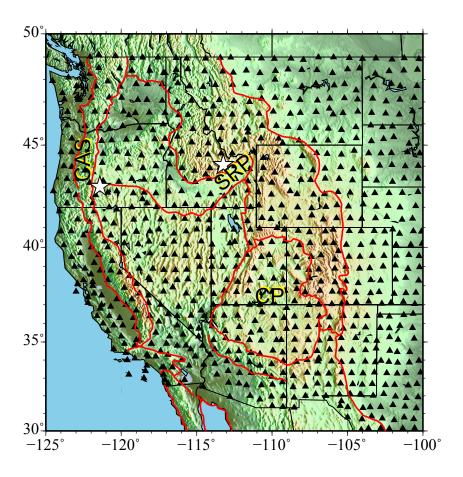


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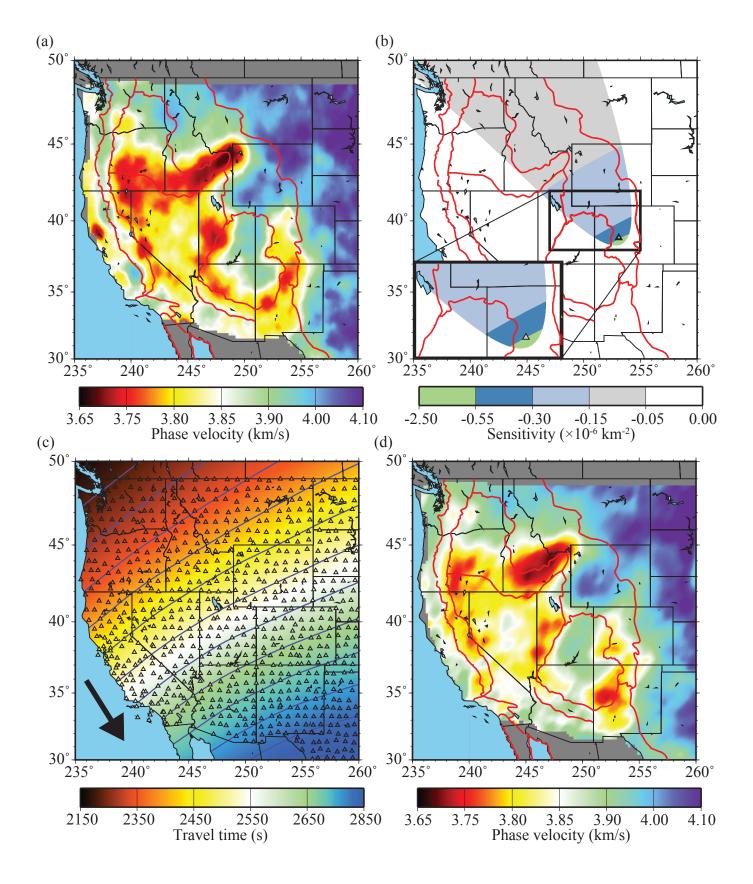


Figure 2

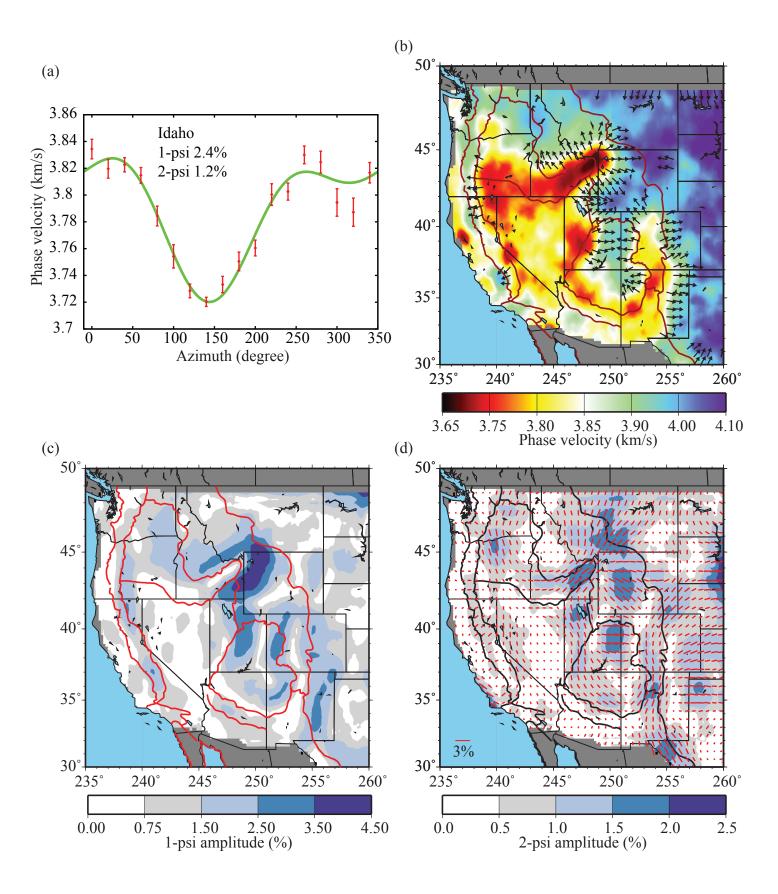


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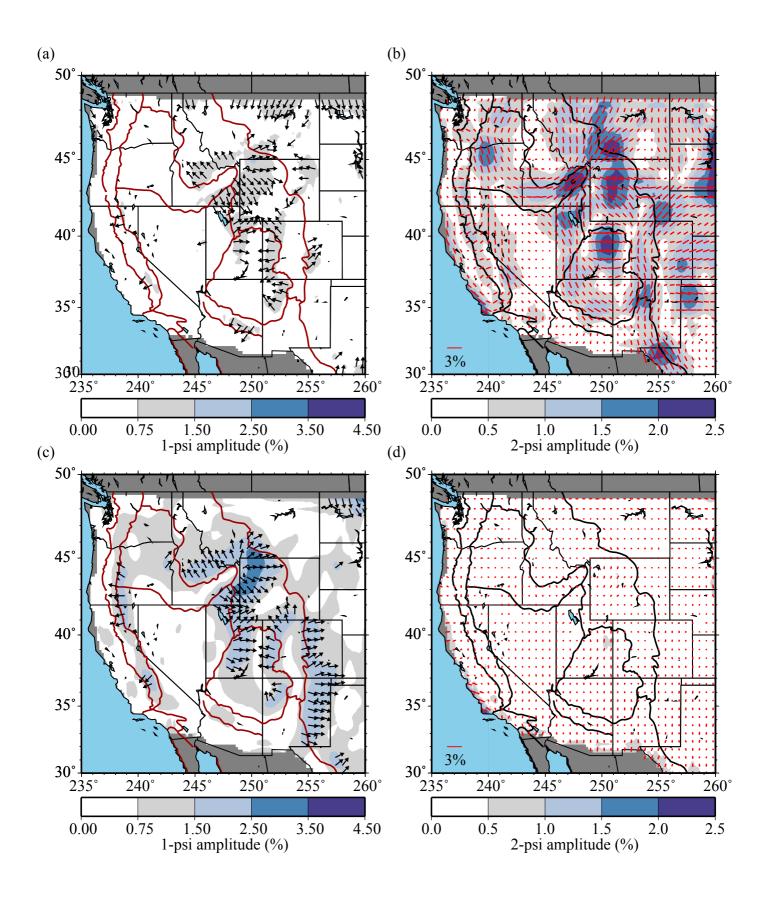
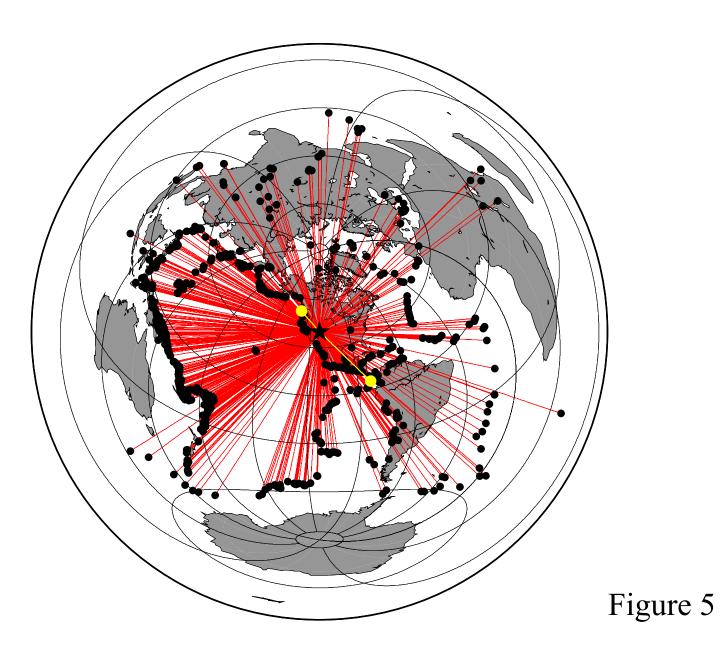


Figure 4



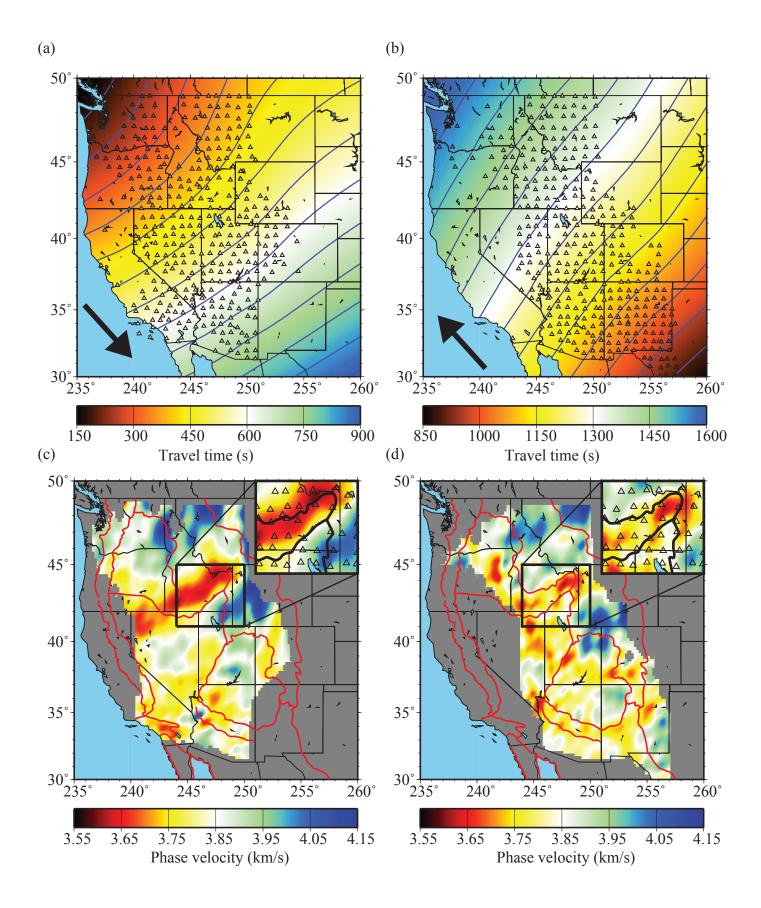
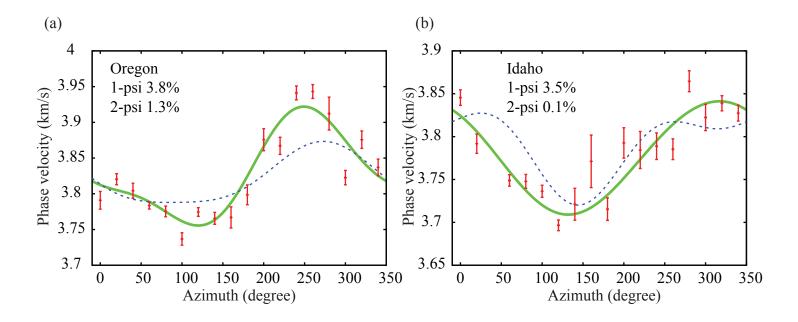


Figure 6



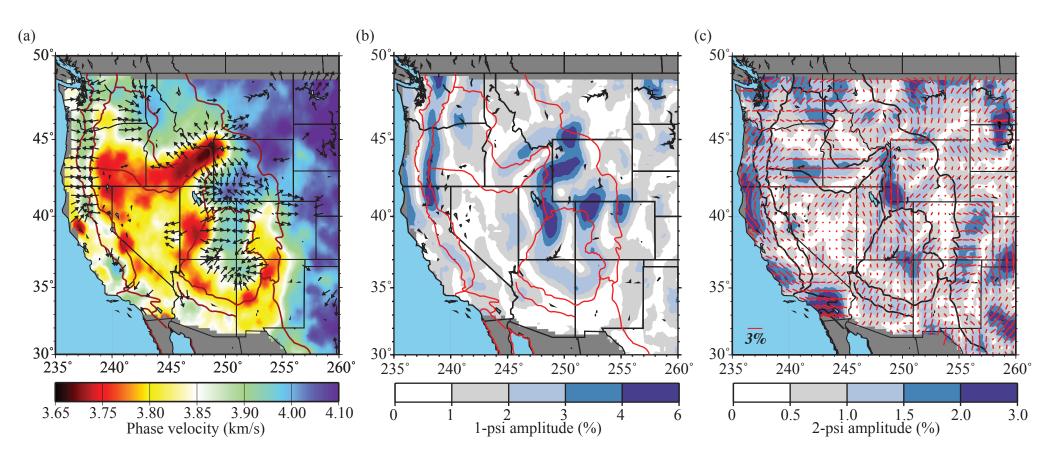


Figure 8

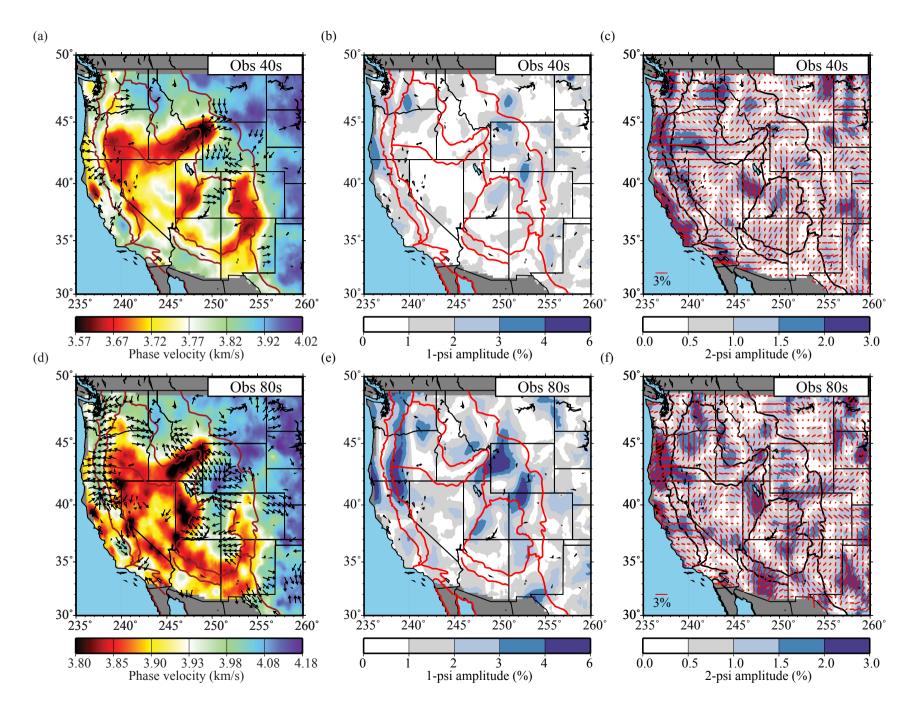


Figure 9

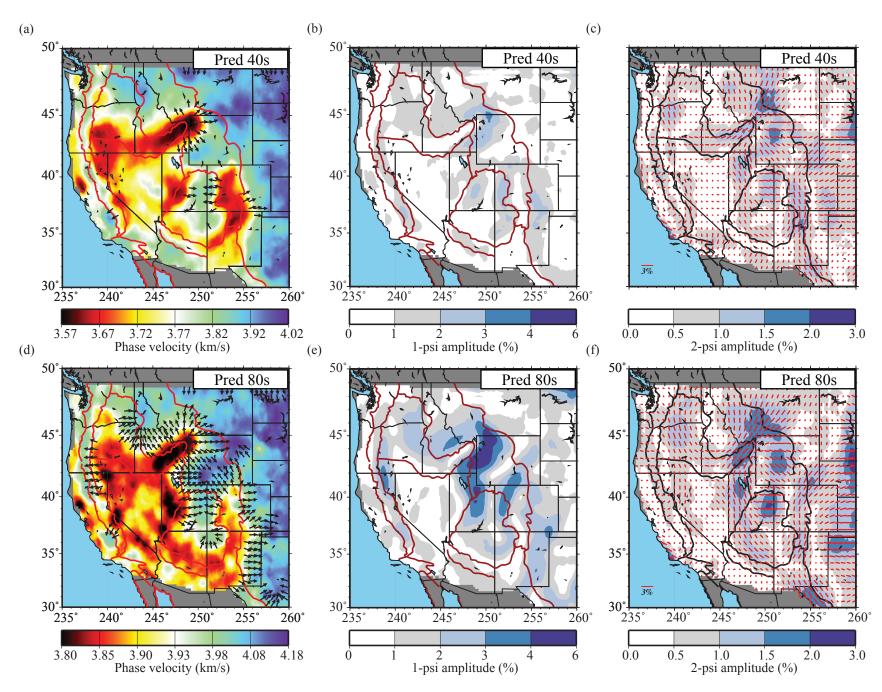


Figure 10

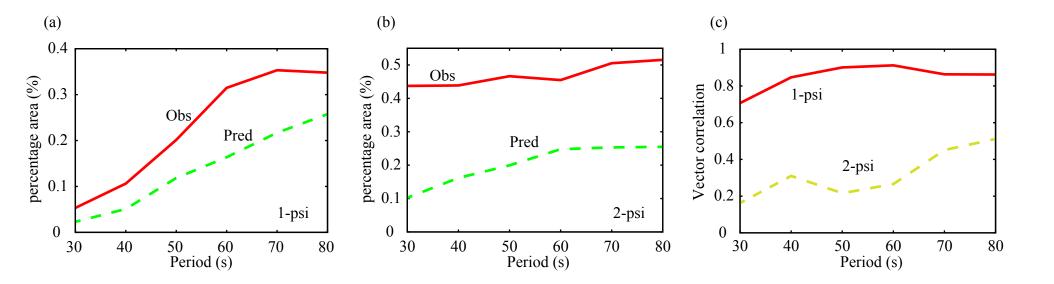


Figure 11

