Constraints on D'' beneath the North Atlantic region from P and S travel times and amplitudes

S. Durand\textsuperscript{1,2}, C. Thomas\textsuperscript{1}, J.M. Jackson\textsuperscript{3,1}

\textsuperscript{1} Institut für Geophysik, Corrensstraße 24, 48149 Münster, Germany
\textsuperscript{2} Laboratoire de Géologie de Lyon -Terre, Planètes, Environnement, CNRS, UMR 5276, École Normale Supérieure de Lyon, Université de Lyon, Université Claude Bernard Lyon 1, 2 rue Raphaël Dubois, Bâtiment Géode 69622 Villeurbanne Cedex, France
\textsuperscript{3} Seismological Laboratory, California Institute of Technology, Pasadena, CA 91125, United States

SUMMARY

In this study we discuss possible origins of the D'' reflector beneath the North Atlantic region based on a combined analysis of P and S wave data. We use over 700 USArray station recordings of the Mw 6.3 earthquake that occurred in April 2010 in Spain. In order to investigate the D'' layer we look for waves reflected off the top of it, namely PdP and SdS waves, and compare them to the core-mantle boundary reflections used as reference phases. The differences in travel times and amplitudes are sensitive to D'' properties. Because the USArray installation generates a dense array, we are able to provide an almost continuous map of the detection or absence of PdP and SdS waves in the North Atlantic region. We use a Bayesian inversion for travel times, together with synthetic seismogram calculations, to find the best fitting D'' properties, \((V_p, V_s)\) jumps across the D'' interface and D'' thickness. We find that the best fitting models are for a D'' layer of about 300 km thick, with or without a velocity gradient of about 30 km at the top of it. Regardless of the model type, positive and similar velocity increases in both P and S velocities at the D'' interface, ranging from 2.7 to 3.8 %, are required to fit the data well. Our data
rule out velocity decreases in P and S waves at the D'' interface as well as no velocity reduction above the CMB. There are also regions where we do not observe PdP and SdS waves. Collectively, these observations suggest lateral variations in both chemistry and temperature, combined with phase transitions. For instance, ancient oceanic basalt debris from the Farallón slab could be modulating the detection of the D'' reflector in this region.

**Key words:** Structure of the Earth, Atlantic Ocean, Probability distributions, Body waves

1 **INTRODUCTION**

The D'' layer (Bullen, 1949) marks the transition between the molten iron-rich outer core and the predominantly crystalline lower mantle, thus modulating the heat flux across the Core-Mantle Boundary (CMB). The D'' layer therefore plays a central role in whole mantle convection processes (Lay, 2007a), core convection, and geodynamo processes (e.g., Glatzmaier et al., 1999). Improved characterization of the D'' region should lead to a better understanding of whole mantle dynamics and geomagnetism. This layer is associated with a wide-range of seismic complexity and interpretations of this layer remain uncertain (see Wysession et al., 1998; Cobden et al., 2015, for reviews). Possible candidates for the generation of a reflector at the top of D'' range from solid-solid phase transitions, subducted slab debris, preferred alignment of anisotropic materials, thermochemical layering, or a combination of these factors (Lay & Helmberger 1983; Sidorin et al., 1999; Hernlund & McNamara, 2015). This discontinuity has often been associated in seismic studies with strongly positive S velocity jumps and weakly positive or negative P velocity jumps (e.g., Hutko et al., (2008); Thomas et al., (2011); Cobden et al., (2013) and Wysession et al., (1998); Cobden et al., (2015) for reviews) such that the preferred candidate to explain such a layer is a structural phase transition from MgSiO$_3$ (or pyrolitic) bridgmanite (Br) to post-perovskite (pPv) within an isochemical lower mantle (Murakami et al., 2004; Oganov & Ono, 2004). However, global seismic characterization of this layer, in combination with mineral physics results, suggest that such a Br-pPv transition in a pyrolitic mantle cannot reconcile all the seismic observations (e.g. Akber-Knutson et al., 2005; Grocholski et al., 2012; Cobden et al., 2015).

The global large-scale D'' velocity structures (i.e., larger than 1000 km) are mostly constrained by both P- and S-velocity tomographic models (Ritsema et al., 2011; Chang et al., 2015; French & Romanowicz, 2014; Moulid & Ekström, 2014; Durand et al., 2017, 2016; Koelemeijer et al., 2016). Recently, using new normal mode cross-coupling data, Durand et al., (2016) show evidence for a more complex shear velocity pattern through the D'' region, characterized by stronger odd spherical harmonic degrees, in contrast to the well-known dominant degree 2 pattern (Dziewonski et al., 1993).
This method reveals more heterogeneous large low-shear-velocity provinces with various local maxima, well correlated with some clusters of hot spot sources. Moreover, the global scale D′′ mineralogy can be constrained by combining compressional and shear velocity tomographic models, assuming select mineral physics results (Mosca et al., 2012; Koelmeijer et al., 2016). For instance, by inverting for both global P and S velocity perturbations, Koelmeijer et al., (2016) show a negative correlation between the global shear wave and bulk sound velocity variations within D′′, suggesting either the presence of pPv or large-scale chemical heterogeneities in the lowermost mantle, or a combination of these effects (Kennett & Widiyanto, 1998; Masters et al., 2013).

Global tomography is, however, unable to resolve small-scale D′′ heterogeneities (smaller than 1000 km) which makes it difficult to attribute the observed large scale velocity heterogeneities to any particular effect such as temperature, composition or mineral texture. To do this, regional high-resolution studies of D′′ are required. D′′ reflected waves, combined with core-reflected waves, are particularly useful, as they allow one to probe the reflector as well as velocity variations within the D′′ region. D′′ reflected waves have been reported in several different regions (e.g., Lay & Helmerger, 1983; Weber & Davis, 1990; Weber & Körnig, 1990; Davis & Weber, 1990; Young & Lay, 1990; Houard & Nataf, 1992, 1993; Weber, 1993; Reasoner & Revenaugh, 1999; Russel et al., 2001; Thomas & Kendall, 2002; Thomas et al., 2004a,b; Lay et al., 2004b; Wallace & Thomas, 2005; Lay et al., 2006; Avants et al., 2006; Kito et al., 2007; Hutko et al., 2008; Sun et al., 2008; Hutko et al., 2009; Chaloner et al., 2009; Yao et al., 2015; Thomas et al., 2015; Sun et al., 2016). Many of these studies use either P- or S-wave observations. However, in order to advance our ability to interpret these observations in terms of thermochemical boundaries, phase transitions, and/or anisotropy, it is essential to obtain constraints on both wave types. To date, relatively few studies attempted to characterize the D′′ layer using a combination of P and S-wave data (e.g., Weber & Davis, 1990; Weber, 1993; Russel et al., 2001; Kito et al., 2007; Hutko et al., 2008, 2009; Chaloner et al., 2009; Thomas et al., 2011; Cobden et al., 2013).

In this study, we focus on characterizing D′′ beneath the North Atlantic by combining unprecedented P and S datasets. The D′′ layer beneath this region has been studied before (Braña & Helffrich, 2004; Houard & Nataf, 1992; Krüger et al., 1995; Weber & Körnig, 1990, 1992; Wallace & Thomas, 2005; Yao et al., 2015). These studies show the existence of a ∼200-300 km thick D′′ layer with P and S velocity perturbations of the order of 1-4% - using either P-wave data (Braña & Helffrich, 2004; Houard & Nataf, 1992; Krüger et al., 1995; Weber & Körnig, 1990, 1992) or S-wave data (Wallace & Thomas, 2005; Yao et al., 2015). Except for Yao et al., (2015), most of these studies had limited coverage due to the limited number of earthquake-station combinations suitable to study the D′′ structure in this area. In April 2010, a Mw 6.3 earthquake occurred in Spain that was recorded at the dense
Figure 1. a) Map of the selected data after the application of the SNR criterion. White triangles are the stations, the red star is the Mw6.3 Spanish earthquake, April 2010, and grey diamonds are great-circle-path mid-points. The black thick line profile corresponds to the tomographic section shown in b). b) Section in SEISGLOB2 (Durand et al., 2017) tomographic model corresponding to the profile shown in a) (black thick line). Superimposed are the paths of the core and D′′ reflected waves for a distance from the earthquake of 70 and 80°. A fast region is observed at the base of the mantle around the reflection point of the core-reflected wave. c) Examples of sub-arrays (green triangles) used to compute vesagrams. The pink triangle represents the starting station around which we look for at least 20 stations in a width of ±2°.

USArray (IRIS Transportable Array, 2003), thus providing high-quality P and S-wave recordings, enabling significant improvements on the coverage of this region. Yao et al., (2015) analysed this event using array processing techniques in order to study the D′′ discontinuity, focusing only on shear wave signals. Here we combine P and S wave information to constrain the nature of D′′ in this region. We use a Bayesian approach to invert for the characteristics of D′′, combined with synthetic seismogram calculations. We show that this approach leads to tighter constraints on the sharpness and lateral variability of D′′ beneath the North Atlantic region. In combination with existing mineral physics results, we discuss a few interpretations that involve lateral thermochemical variations.

2 DATA SELECTION AND PROCESSING

We use the Mw 6.3 earthquake occurring on 11th April 2010 in Spain, which was recorded at 711 North American seismic stations, mostly belonging to USArray (Figure 1a). We selected the seismograms based on the requirement that the signal-to-noise ratio (SNR) is greater than 3 and defined as follows
\[
SNR = \frac{\sqrt{\sum_{t=x}^{t=x+20} s(t)^2}}{\sqrt{\sum_{t=x}^{t=x-20} s(t)^2}}
\]

where \( X \) stands for P or S and \( s(t) \) refers to the seismogram time series. For the \( SNR \) calculations and all other data processing, we use the vertical component seismograms for P waves and the transverse component seismograms for S waves. This selection procedure yielded 521 good quality seismograms for P data and 529 for S data (see Table 1). A cross-section through the tomographic model SEISGLOB2 (Durand et al., 2017, 2018) for our source-receiver combinations reveals a fast anomaly at the base of the mantle, in the area of the reflection points of the core-reflected wave where \( D'' \) structure would likely be detected (Figure 1b).

\( D'' \) reflected waves, PdP and SdS, can be difficult to detect in individual seismograms. We therefore stack seismograms in order to obtain a convincing signal that stands out from the noise level. To do so we apply seismic array methods and compute fourth-root vespagrams (Davis et al., 1971; Rost & Thomas, 2002; Schweitzer et al., 2002); this approach is particularly powerful for detecting small amplitude signals such as PdP and SdS (e.g., Thomas et al., 2015). A vespagram is a signal processing method that computes the seismic energy that reaches an array for a given back-azimuth and various horizontal slowness values; we generally assume that the wave propagates along the great-circle path and thus arrives with the theoretical back-azimuth, however, we also test whether our waves travel out of plane using slowness-backazimuth analysis. We find that our recorded waves travel mostly on the great circle path.

For a good slowness resolution in the vespagram the aperture of the seismic array should be large enough such that arrivals between the stations are different, but small enough such that the plane wave approximation is valid and the waves are coherent across the array. Therefore, instead of computing a single vespagram for the entire dataset, we form square sub-arrays of \( \pm 2^\circ \) (see Figure 1c) and compute a vespagram for every possible sub-array. For this procedure we impose that the sub-arrays contain at least 20 stations, which ensures good quality vespagrams. We filter the data before stacking, using a Butterworth bandpass filter between 1-10 s for P wave data and between 3-20 s for S wave data to further enhance the quality of our observations. Our processing steps yield 428 P vespagrams and 438 S vespagrams (see Table 1) that can be used for further analysis.

3 TRAVEL TIME MEASUREMENTS

In order to constrain \( D'' \) thickness and velocity structure, various wave combinations can be used. For instance, differential travel times of the direct waves (P or S) and the \( D'' \) reflected waves (PdP or SdS) have been used before and allow a precise estimation of \( D'' \) depth, since neither wave is affected
Table 1. Summary of the number of processed data and detected waves.

<table>
<thead>
<tr>
<th></th>
<th>P Data</th>
<th>S Data</th>
</tr>
</thead>
<tbody>
<tr>
<td>Downloaded dataset</td>
<td>711</td>
<td>711</td>
</tr>
<tr>
<td>After SNR selection</td>
<td>521</td>
<td>529</td>
</tr>
<tr>
<td>Number of sub-arrays</td>
<td>428</td>
<td>438</td>
</tr>
<tr>
<td>Detected waves</td>
<td></td>
<td></td>
</tr>
<tr>
<td>P/S only</td>
<td>90</td>
<td></td>
</tr>
<tr>
<td>P &amp; PcP / S &amp; ScS</td>
<td>181</td>
<td>224</td>
</tr>
<tr>
<td>P, PcP &amp; PdP / S, ScS &amp; SDS</td>
<td>110</td>
<td>135</td>
</tr>
<tr>
<td>Bad quality</td>
<td>47</td>
<td>79</td>
</tr>
<tr>
<td>Measured travel times</td>
<td></td>
<td></td>
</tr>
<tr>
<td>PcP-PdP / ScS-SdS</td>
<td>79</td>
<td>107</td>
</tr>
</tbody>
</table>

by $D''$ velocities, which can affect PcP or ScS travel times (e.g., Chaloner et al., 2009; Yao et al., 2015). However, these differential travel times are also very sensitive to the mantle structures above $D''$ and are well-known to have a maximum of sensitivity at the turning point of the direct wave, usually occurring around 1800-2300 km depth. Velocity structures located in this depth range can thus greatly affect the estimation of the $D''$ thickness. That is why we choose to use differential travel time measurements between the $D''$ reflected wave and the core-reflected wave only, denoted $\delta t_{PcP-PdP}$ and $\delta t_{ScS-SdS}$. These differential travel times are well suited to focus on the $D''$ structure since the paths of both waves are very similar outside the $D''$ layer, which practically restrict their sensitivity to $D''$ (Lay et al., 2004b).

We thus inspect every vespagram in order to see whether any $D''$ reflected signals were present on both P and S vespagrams (Figure 2). To that aim, we first use TauP (Crotwell et al., 1999) to predict slowness and travel time of $D''$ reflected waves for $D''$ thicknesses varying from 100 to 500 km (black curves in Figure 2) and we then look for signals lying around this curve that have a signal-to-noise ratio greater than 10. When a $D''$ reflector can be detected (Figures 2b and 2d), we perform differential travel time measurements $\delta t_{PcP-PdP}$ and $\delta t_{ScS-SdS}$. These first travel time measurements are done by manual picking in the vespagrams. Examples of picked travel times are shown as red points in Figure 2. Every picked wave was characterized by two lobes, one positive and one negative (see Figure 2), so we decided to pick the travel time in the middle of the waveforms when they have zero
amplitude. In order to evaluate the uncertainties of the travel time delays and the detection of the $D''$ reflected waves, we perform a bootstrap analysis (e.g., Efron, 1982) meaning that for every vespagram where $D''$ reflected waves have been detected we re-compute 100 vespagrams by randomly resampling the sub-array. Using the hand picked travel times to define a window where the $D''$ reflected wave is expected, we automatically pick travel times of PdP or SdS on the 100 bootstrap vespagrams. This leads to a distribution of travel times (Figure 3) that we fit with a Gaussian function (see red curve in Figure 3). The mean of the Gaussian, $\mu$, gives a measure of the travel time and its standard deviation, $\sigma$, the associated uncertainty. We keep the travel time measurements obtained with the bootstrap analysis when at least 60 of the 100 measurements made on the bootstrap vespagrams lie within two standard deviations around the mean of the Gaussian distribution (see dashed lines in Figure 3).

Table 1 summarizes the different detected waves. We find values for differential travel times rang-
Figure 3. Example results of the bootstrap analysis performed for the same sub-array as for the vespagrams shown Figures 2b (left) and 2d (right). Maps indicate the mid point locations for these measurements (green symbols) within every performed measurement (grey symbols). We show the 100 travel time measurements automatically picked on the 100 bootstrap vespagrams for P (left) and S (right) data. These distributions are fitted with a Gaussian function (red curve) whose mean, $\mu$ (thick black line), and standard deviation, $\sigma$ (thick dashed lines), are used as final travel time measurements and uncertainties. The measurements are kept only if at least 60 of the 100 measurements made on the bootstrap vespagrams lie within two standard deviations around the mean of the Gaussian distribution (i.e. within the two black dashed lines).

The measured travel times are represented at the theoretical reflection point of the core-reflected wave in Figures 4a and 4b and as a function of the epicentral distance in Figures 4c and 4d. We find that both PdP and SdS waves are detected in the northern and southern parts of the sampled area, similar to the S-wave findings of Yao et al., (2015). We observe a trend in the measured travel times with epicentral distance that indicates, to first order, that there is little topography in the regions where the D'' reflector is observed. However, it can also be observed that the $\delta t_{PcP-PdP}$ in the northern part are very different and do not align with the general trend, which could indicate variations in D'' properties between the North and South areas. However, we observe this only for P signals and, unfortunately, these two observations are not sufficient to run an inversion and draw more conclusions. So further investigation in this area is needed to confirm this different trend in the northern part for P data.

3.1 Bayesian inversion

The average trend of the delay times with the epicentral distance (Figures 4c and 4d) indicates that, in the regions where we detect a D'' reflection, they can be explained by a 1D model including a flat D''
layer. We thus invert the travel time measurements for $D''$ interface properties. To do so we adopt a Bayesian approach (Tarantola & Valette, 1982b), meaning that we will explore the model space. This model space is infinite so in order to render the inversion feasible, we separate the inversion into two steps. First, we find the models that best fit the travel time delays, considering various model families.
Then, we will use these best fitting models to find the one that best reproduces the amplitudes on the vespagrams of the data (see workflow Figure 5).

We define two distinct categories of models, category “D” and category “G”. Category “D” refers to models that are discontinuous across the D" interface (“D" stands for “discontinuous”). Within this category we then define four families (D0, D1, D2, D3) that differ from the slope of the velocity gradient inside D" (Figure 6a). These different gradients represent various heat fluxes at the CMB. Geodynamic modelling has shown that in regions where slabs are present, there is a decrease in temperature a few hundreds of kilometers above the CMB, followed by a sharp increase in temperature close to the CMB (e.g., Thomas et al., 2004b; Bower et al., 2013). Because there are large uncertainties on how to convert the temperature anomalies into velocity anomalies, we test several velocity profiles with velocity variations reproducing these temperature variations, where case D0 stands for an average mantle model including a D" layer, such as in model pwdk (Weber & Davis, 1990). These models are characterized by three free parameters that will be explored, the D" thickness \( H \) and P and S velocity jumps across the D" interface, \( d \ln(V_p) \) and \( d \ln(V_s) \), respectively. Category “G” refers to models where we allow for a gradient at the top of D" (“G” stands for “gradient”). Again, we consider four families of models in that category (G0, G1, G2, G3) which differ from the slope of the velocity gradient inside D" (Figure 6b). These models are characterized by four free parameters that will be explored, the D" thickness \( H \), the gradient thickness \( H_g \) and P and S velocity jumps across the D" interface, \( d \ln(V_p) \) and \( d \ln(V_s) \), respectively.

We first explore the model space, for every family of models, with the parameter ranges given in Table 2 and we then refine the exploration around the best solution, using a step of 0.01% for the velocities and a step of 1 km for the thicknesses, resulting in millions of tested models for every model family. For each model, we predict the travel times, \( \delta t_{\text{predicted}} \), using TauP (Crotwell et al., 1999) and we compute the probability density, \( f \), which provides the probability for every parameter combination to best fit the data. The probability density is computed using the following definition,

\[
f(d \ln(V_p), d \ln(V_s), H, H_g) = \exp \left( -\frac{\chi^2}{2} \right)
\]

where

\[
\chi^2 = \sum_i \left( \frac{\delta t_{\text{obs}}^i - \delta t_{\text{predicted}}^i}{\sigma_i^2} \right)^2
\]

\( \delta t_{\text{obs}}^i \) and \( \delta t_{\text{predicted}}^i \) are the measured and predicted travel time delays, respectively, and \( \sigma_i \) are the measurement uncertainties.

For model families D0-D3, the probability density \( f \) is a 3D function, as three parameters are explored \( (d \ln(V_p), d \ln(V_s), H) \), while, it becomes 4D for model families G0-G3, since they are characterized by an additional parameter \( H_g \). In order to find the most probable parameter combination
Table 2. Summary of the explored parameters and parameter ranges for each family of models.

<table>
<thead>
<tr>
<th>Category</th>
<th>Model family</th>
<th>Parameter</th>
<th>Range</th>
<th>Step</th>
</tr>
</thead>
<tbody>
<tr>
<td>D</td>
<td>D0, D1, D2, D3</td>
<td>$H$</td>
<td>from 280 to 340 km</td>
<td>1 km</td>
</tr>
<tr>
<td></td>
<td></td>
<td>$d\ln(V_p)$</td>
<td>from -3 to 4%</td>
<td>0.1%</td>
</tr>
<tr>
<td></td>
<td></td>
<td>$d\ln(V_s)$</td>
<td>from -3 to 4%</td>
<td>0.1%</td>
</tr>
<tr>
<td></td>
<td></td>
<td>$H_g$</td>
<td>from 1 to 60 km</td>
<td>2 km</td>
</tr>
<tr>
<td>G</td>
<td>G0, G1, G2, G3</td>
<td>$H$</td>
<td>from 280 to 310 km</td>
<td>2 km</td>
</tr>
<tr>
<td></td>
<td></td>
<td>$d\ln(V_p)$</td>
<td>from -3 to 4%</td>
<td>0.1%</td>
</tr>
<tr>
<td></td>
<td></td>
<td>$d\ln(V_s)$</td>
<td>from -3 to 4%</td>
<td>0.1%</td>
</tr>
</tbody>
</table>

that best fit the travel times for every model family we compute the 1D marginal probability densities, which give the probability of one parameter to be the best fitting solution. In the most general case of 4 parameters, $(d\ln(V_p), d\ln(V_s), H, H_g)$, we give the expression of one of these 1D marginal probability densities in eq. (4), the three others can be obtained by permutation of the parameters.

$$f_{d\ln(V_p), d\ln(V_s), H=g}(H_g) = \int_{d\ln(V_p)} \int_{d\ln(V_s)} \int_H f(d\ln(V_p), d\ln(V_s), H, H_g) d(d\ln(V_p)) d(d\ln(V_s)) dH$$

We then fit the 1D marginal probability densities with Gaussian functions. The maximum of the Gaussian yields the most probable value of every parameter and the standard deviation of the Gaussian gives the associated uncertainty. This procedure yields the most probable combination of parameters for every model family that best fits the travel time measurements. Then, in order to compare the families of models between each other, we compute for each of them the travel time misfit $M_{time}$ defined as

$$M_{time} = \sqrt{\frac{\chi^2}{N}} = \sqrt{\frac{1}{N} \sum_i \frac{(\delta t_{obs} - \delta t_{pred})^2}{\sigma_i^2}}$$

where $N$ is the number of travel time measurements (see the workflow diagram in Figure 5).

An example of this procedure is shown in Figure 7 in the case of model family D0. Figure 7 represents the 1D and 2D (coloured faces) marginal probability densities. By fitting the 1D marginal probability densities with Gaussian functions (red dashed curves in Figure 7), we find that the best fitting model for the model family D0 has a $D''$ layer of 305 ($\pm 7.7$)km thick, with $d\ln(V_p) = 0.8(\pm 0.06)\%$ and $d\ln(V_s) = 1.00(\pm 0.14)\%$. These values also enable us to compute the bulk sound velocity perturbation $d\ln(V_\phi) = 0.68(\pm 0.01)\%$. Tables 3 and 4 summarise the obtained best fitting model parameters, as well as the associated misfit values $M_{time}$ for this first category of discontinuous models (D0-D3). We always find a $D''$ layer of around 300 km thick as well as positive P and S velocity...
Figure 5. Workflow diagram of the Bayesian inversion. See text for misfit definitions and Figure 6 for examples of models D0-D3 and G0-G3.

Figure 6. Examples of tested D'' velocity models with respect to PREM. In category “D” (a), the models are characterized by a D'' of thickness H and by S and P velocity jumps across the D'' interface d ln(V_s) and d ln(V_p). In category “G” (b), we investigate the sharpness of the D'' discontinuity by allowing for a gradient of thickness H_g at the top of D''. See Table 2 for the explored ranges of values for every parameter.
Table 3. Summary of the velocity increases \((d \ln(V_s), d \ln(V_p), d \ln(V_\phi))\) across \(D''\) as well as the corresponding travel time delay misfit \((M_{time})\) and vespagram misfit \((M_{vespa})\) for the best fitting models (see text and Figure 6 for details).

<table>
<thead>
<tr>
<th>Model family</th>
<th>(d \ln(V_s)) (%)</th>
<th>(d \ln(V_p)) (%)</th>
<th>(d \ln(V_\phi)) (%)</th>
<th>Travel time delay misfit ((M_{time}))</th>
<th>Vespagram misfit ((M_{vespa}))</th>
</tr>
</thead>
<tbody>
<tr>
<td>D0</td>
<td>1.00 ± 0.14</td>
<td>0.80 ± 0.06</td>
<td>0.68 ± 0.01</td>
<td>1.19</td>
<td>1.76</td>
</tr>
<tr>
<td>D1</td>
<td>2.19 ± 0.11</td>
<td>2.37 ± 0.04</td>
<td>2.08 ± 0.01</td>
<td>1.19</td>
<td>1.72</td>
</tr>
<tr>
<td>D2</td>
<td>2.90 ± 0.11</td>
<td>3.10 ± 0.03</td>
<td>2.77 ± 0.02</td>
<td>1.19</td>
<td>1.70</td>
</tr>
<tr>
<td>D3</td>
<td>3.63 ± 0.09</td>
<td>3.85 ± 0.02</td>
<td>3.50 ± 0.02</td>
<td>1.19</td>
<td>1.70</td>
</tr>
<tr>
<td>G0</td>
<td>0.99 ± 0.12</td>
<td>0.78 ± 0.05</td>
<td>0.65 ± 0.01</td>
<td>1.19</td>
<td>1.77</td>
</tr>
<tr>
<td>G1</td>
<td>2.25 ± 0.10</td>
<td>2.05 ± 0.03</td>
<td>1.93 ± 0.015</td>
<td>1.19</td>
<td>1.72</td>
</tr>
<tr>
<td>G2</td>
<td>2.92 ± 0.10</td>
<td>2.71 ± 0.03</td>
<td>2.59 ± 0.015</td>
<td>1.19</td>
<td>1.70</td>
</tr>
<tr>
<td>G3</td>
<td>3.59 ± 0.08</td>
<td>3.37 ± 0.02</td>
<td>3.24 ± 0.02</td>
<td>1.19</td>
<td>1.70</td>
</tr>
<tr>
<td>C1</td>
<td>1.18</td>
<td>1.01</td>
<td>0.92</td>
<td>1.19</td>
<td>1.74</td>
</tr>
<tr>
<td>C3</td>
<td>2.19</td>
<td>2.32</td>
<td>2.11</td>
<td>1.20</td>
<td>1.68</td>
</tr>
</tbody>
</table>

Table 4. Summary of the \(D''\) thicknesses \(H\), gradient thicknesses \(H_g\) and corresponding \(D''\) depths for the best fitting models (see text and Figure 6 for details).

<table>
<thead>
<tr>
<th>Model family</th>
<th>(H) (km)</th>
<th>(H_g) (km)</th>
<th>(D'') depth (km)</th>
</tr>
</thead>
<tbody>
<tr>
<td>D0</td>
<td>305 ± 7.7</td>
<td>2586 ± 7.7</td>
<td></td>
</tr>
<tr>
<td>D1</td>
<td>307 ± 7.8</td>
<td>2584 ± 7.8</td>
<td></td>
</tr>
<tr>
<td>D2</td>
<td>309 ± 8.7</td>
<td>2582 ± 8.7</td>
<td></td>
</tr>
<tr>
<td>D3</td>
<td>312 ± 8.5</td>
<td>2579 ± 8.5</td>
<td></td>
</tr>
<tr>
<td>G0</td>
<td>291 ± 6.3</td>
<td>25.3 ± 3.0</td>
<td>2587 ± 9.3</td>
</tr>
<tr>
<td>G1</td>
<td>291 ± 8.4</td>
<td>30.0 ± 3.8</td>
<td>2585 ± 12.2</td>
</tr>
<tr>
<td>G2</td>
<td>294 ± 9.2</td>
<td>31.4 ± 4.8</td>
<td>2581 ± 14.0</td>
</tr>
<tr>
<td>G3</td>
<td>296 ± 9.3</td>
<td>30.6 ± 5.4</td>
<td>2580 ± 14.7</td>
</tr>
<tr>
<td>C1</td>
<td>100</td>
<td>200</td>
<td>2591</td>
</tr>
<tr>
<td>C3</td>
<td>170</td>
<td>130</td>
<td>2591</td>
</tr>
</tbody>
</table>
Figure 7. Representation of the \textit{a posteriori} probability density, $f(d \ln(V_s), d \ln(V_p), H)$ in the case of $H_g = 0$ for model D0. Every face is a 2D marginal probability density showing the probability of two parameters to be the best fitting model whatever is the third parameter. The three solid black curves represent the 1D marginal probability densities (see eq. (4)) of one parameter to be the best fitting model whatever are the two others and the superimposed red dashed curves are the best fitting Gaussian functions that yield the final values of every parameter with their uncertainties.

jumps across the D'' interface. Interestingly, even though one would expect a strong trade off between seismic velocities inside D'' and D'' thickness, we obtain a well resolved maximum because we benefit from a good distance coverage (see Figure 2). This procedure would fail when inverting a single measurement.

In the case of model families G0-G3, the \textit{a posteriori} probability functions are less well resolved for parameters $H$ and $H_g$ because of the trade-off between them. However, we are still able to find best fitting models, that fit the data equally well as models D0-D3. The best parameter values and misfit $M_{\text{time}}$ values are given in Tables 3 and 4. In this family of models, we always find a D'' layer of thickness around 290 km with a 20 to 30 km thick gradient layer at the top of the layer. The P and S velocity jumps are also always both positive and similar in values.

We verify \textit{a posteriori} that all these models fit the data on Figures 4c and 4d. The use of travel times alone does not enable us to choose between all these models because they fit the delay times
Figure 8. a) Best fitting models D0-D3 for $V_p$ (dashed lines) and $V_s$ (solid line) models with corresponding P and S vespagrams of synthetic traces. b) Best fitting models G0-G3 for $V_p$ (dashed lines) and $V_s$ (solid lines) models with corresponding P and S vespagrams of synthetic traces. The vespagrams have been computed for the same group of stations as those for the vespagrams of data shown Figures 2b and 2d.

equally well (delay time misfit values in Table 3). However, the best fit requires a comparison of the observed amplitudes to synthetic ones obtained for the best fitting model of every family (D0-D3, G0-G3). To do so, we compute synthetic seismograms using the reflectivity method (Fuchs & Müller, 1971; Müller, 1985) with the PREM model (Dziewonski & Anderson, 1981) as input, in which we include a $D''$ layer characterized by the best model parameter combinations given Tables 3 and 4. The reflectivity calculations also include an Earth’s flattening approximation. We assume that the effect of 3D heterogeneities is small because we are using differential travel times that are mostly sensitive to the $D''$ region where the tomographic models are very smooth over the studied region (see e.g. Figure 1c).
After computing full waveforms, we then apply the same processing to the synthetic data and generate vespagrams. Figures 8a and 8b show examples of obtained vespagrams of synthetic data for the same sub-array as for the vespagrams of data shown Figures 2b and 2d, respectively. We find that for every best fitting model, clear PdP and SdS are observed on the vespagrams of synthetic traces. As expected, greater PdP and SdS wave amplitudes are observed for larger velocity jumps across D″ discontinuity. In order to estimate how well the vespagrams of synthetic traces fit the vespagrams of data, we define a misfit parameter $M_{\text{vespa}}$ as follows:

$$M_{\text{vespa}} = \sqrt{\frac{1}{N} \sum_i \left( \frac{\text{VESPA}_{\text{data}} - \text{VESPA}_{\text{synth}}}{\text{vespa}_i} \right)^2}$$

(6)

where $\text{VESPA}_{\text{data}}$ and $\text{VESPA}_{\text{synth}}$ denote the vespagram of data and of synthetic traces, respectively, $N$ the number of vespagrams and $\text{vespa}_i$ are the uncertainties on the vespagrams defined as the percentage of bootstrap vespagrams lying outside two standard deviations around the mean of the Gaussian distribution of the 100 bootstrap vespagrams and $(\text{slow, time})$ refer to the slowness and time ranges over which the vespagram amplitudes are stacked, we chose the time window to be the same for synthetic and real data vespagrams (see Figure 3 and workflow diagram Figure 5). The misfit values are summarized in Table 4, last column. Based on these results, we find that the best models that satisfactorily explain both P and S travel times, in addition to P and S amplitudes, are from model families D2, D3, G2 and G3. They all support a D″ thickness of about 310 km, with or without a $\sim 30$ km gradient layer (reduced sharpness) at the top of the D″ layer (see Table 4), compatible with the 304 ($\pm 14$)km found by Yao et al., (2015) using only S-waves. The best fit models yield positive and strong velocity jumps across the discontinuity $\sim 2.9$-$3.6\%$ for $d\ln(V_p)$, $\sim 2.7$-$3.8\%$ for $d\ln(V_s)$ and $\sim 2.6$-$3.5\%$ for $d\ln(V_\phi)$ (see Table 3). It is also important to note that all these models are characterized by strong negative velocity gradients down to the CMB in agreement with an expected increase of heat flux toward the CMB.

4 DISCUSSION

The seismic reflector at the top of D″ is generally associated with a phase transition from magnesium silicate bridgmanite (Br) to post-perovskite (pPv) (e.g. Sidorin et al., 1999; Oganov & Ono, 2004; Murakami et al., 2004; Cobden et al., 2015; Lay, 2007b; Hernlund et al., 2005; Sun et al., 2008). Several theoretical and experimental investigations have focused on determining the elastic properties of MgSiO$_3$ Br and pPv as well as studies that estimate the effects of Al, Fe, and H incorporation to these phases (see e.g. Shukla et al., 2016; Wentzcovitch et al., 2006; Townsend et al., 2015; Wookey et al., 2005; Stackhouse et al., 2006b; Mao et al., 2006; Tsuchiya & Tsuchiya, 2006; Caracas &
Figure 9. (a,b) Maps summarizing the different detected waves for P (a) and S (b) data. They are represented at the reflection point of the core-reflected wave on top of a summary map (e.g. Lekic et al. 2012) obtained considering six tomographic models (S40RTS (Ritsema et al., 2011), SEMUCB-WM1 (French & Romanowicz, 2014), S362WMANI+M (Moulik & Ekström, 2014), SGLOBE (Chang et al., 2015), SP12RTS (Koelemeijer et al., 2016), SEISGLOBE2 (Durand et al., 2017)) at 300 km above the CMB. The colorbar on the right of panels (a) and (b) indicates the number of models out of the six considered that report a positive velocity anomaly in the area. The cases where PcP is not detected are shown as filled black circles. (c,d) Histograms of the different detected waves, where the colors are defined to the right of panels (c) and (d).

Cohen, 2005; Zhang et al., 2016; Stackhouse et al., 2006a; Grocholski et al., 2012). Theoretical studies report that the phase transition of a pure MgSiO$_3$ Br to pPv produces a positive jump in $V_s$, a small positive or negative jump in $V_p$ and a negative jump in $V_\phi$ (Wookey et al., 2005; Wentzcovitch et al., 2006; Stackhouse et al., 2006b; Tsuchiya & Tsuchiya, 2006), which collectively do not match the observations in our study. Moreover, it has been shown that the presence of iron or aluminium increases the depth range that Br-pPv coexist (Akber-Knutson et al., 2005; Grocholski et al., 2012), such that, in the lower mantle, where bridgmanite is likely to contain some amounts of iron and aluminum, the phase transition is expected to be broadened (Akber-Knutson et al., 2005; Hirose et al., 2005; Caracas
When combined with effects due to the possible presence of relatively cooler and chemically distinct slab debris (Bower et al., 2013; Grocholski et al., 2012), the sharpness and layer thickness of D'' will likely also be affected, which resemble features captured in the "G" models.

Figures 9a-d show a summary of the areas and distances where P- or S-waves, reflected off D'', are detected. In Figures 9a and 9b, we display the "summary" map obtained for seismic P and S velocity perturbations extracted from six recent global tomographic models. The histograms in Figures 9c and 9d show that the different groups of detection do not correspond to particular distance ranges, they all overlap. Regions where D'' reflected waves are well correlated with regions where the velocity perturbations predicted by tomographic models are positive for both P and S velocity perturbations.

Remnants from the ancient subduction of the Farallon plate have been inferred in the studied area (e.g. Bunge & Grand, 2000; Conrad et al., 2004). Based on this inference, we tested additional models where we consider only two variations of heat fluxes at the bottom of D'', that are thus denoted C1 and C3 (referring to the denomination we used for model categories “D” and “G”). They are shown in Figure 10 and their characteristics are given Tables 3 and 4. They are characterized by a sharp D'' interface, with jumps in P and S velocities that then extend farther down before decreasing toward the CMB (e.g., Sidorin et al., 1998; Thomas et al., 2004b; Sun et al., 2008). In these velocity models, the depth range with higher velocities mimics the presence of a thermochemical/phase boundary that could represent the presence of a thermal slab interacting with a phase transition. Although we did not perform a Bayesian inversion for models C1 and C3, we compute the misfit values (Table 3). We find that model C3 better reproduces both travel times and wave amplitudes than any other models.
Considering all the explored models in our study, the ones that best explain our seismic observations are models C3, D2-D3, G2-G3. They are all characterized by positive and strong P and S velocity jumps across the D'' interface and by a reduction in wave speeds down to the CMB. Models D2-D3 and C3 have a sharp D'' interface, but for model C3 it extends down to about 100 km, while models G2-G3 are characterized with a gradient (reduced sharpness) at the top of the D'' layer. Based on the misfit values it is difficult to distinguish all these models. Model C3 appears slightly better, but since it has not been obtained after a proper Bayesian inversion we prefer not to draw further conclusions. Nevertheless, our study rules out a decrease in wave speeds as well as velocity increases smaller than 2.7% in both P and S velocities at the D'' interface, indicating that a pyrolitic Br to pPv transition is unlikely to explain these observations (e.g., Cobden et al., 2013). Models with no velocity reduction above the CMB are also ruled out.

It has been shown that the enhanced aluminium and iron concentrations in mid-oceanic ridge basalt (MORB) subjected to the pressure-temperature conditions of the lowermost mantle broadens the Br-pPv phase transition (Akber-Knutson et al., 2005; Hirose et al., 2005; Caracas & Cohen, 2007; Ohta et al., 2008; Catali et al., 2009; Grocholski et al., 2012) and is compatible with an increase in $V_0$ at the transition (e.g., Cobden et al., 2013). If slab debris similar to that of MORB has accumulated in this region, then a broader seismic "transition" (or gradient) and perhaps cooler temperatures (Ohta et al., 2008; Grocholski et al., 2012), such as our models G2-G3 and C3, may be expected due to these phenomena. However, the detailed chemistry of the assemblage cannot be identified because several factors remain uncertain: the pressures-temperatures of the pPv appearance and Br disappearance in slab debris, the partitioning of Fe/Mg between coexisting Br, pPv, and other phases, and the effect of compositional variation on these variables.

We also observe some cases where the P wave reflected off the CMB, namely PcP, is not visible (Figure 9a, black circles), but we do not find such cases for ScS (see Figures 9b). This is expected from the reflection coefficients off the CMB that are close to 1 for S waves, but which vary for P waves. The area between the Northern SdS detections and the southern PdP and SdS detections does not seem to produce either PdP or SdS reflected waves. We first tested whether these lateral variations could be due to the source mechanism by computing the radiated P, PcP, S and ScS energies, but we found no correlation between the radiation pattern and the detection pattern. The absence of PcP and PdP or SdS could also be due to out-of-plane propagation, possibly generated by D'' or CMB topography (see e.g., Sun et al., 2008). However, we performed slowness/back-azimuth analysis (Rost & Thomas, 2002; Schweitzer et al., 2002) and no systematic evidence of such an effect was found; most of our detected waves travelled on the great circle path and those event-receiver combinations without PcP, PdP or SdS did not show out-of-plane signals that could be attributed to core and D''.
reflections. Seismic anisotropy or small impedance contrasts could also explain the lack of PeP, PdP and SdS waves. All these hypothesis could be tested using crossing raypaths sampling the same region, however, the limited number of earthquake-station combinations suitable to study the \( D'' \) structure in this area does not allow this verification. Alternatively, the absence of detected \( D'' \) reflected waves could also be explained by significantly higher temperatures such that a phase transition to pPv would be suppressed. Indeed, as suggested by geodynamical modeling (Bower et al., 2013; Sun et al., 2016), the presence of the slab could create an anomalously high heat flux in front of the slab which would deepen the Br-pPv phase transition and, if the temperature anomaly reaches several hundreds of Kelvin (Hirose et al., 2005), the Br-pPv phase transition may not occur. This latter situation would generate complex material flow, from horizontal flow in the slab region to upward flow in the warmer region, a hypothesis that could be tested in future studies investigating the presence of anisotropy.

One can also observe that even though all our models well fit the travel time delay (Figures 4c and 4d), the fit is worse for distances smaller than 72° which corresponds to the North area of the studied region. The larger delay times in P would indicate a slower P velocity. However, these two data points are not sufficient to bring further constraints and this again requires further investigation.

To summarize, the areas where we detect \( D'' \) reflected waves can be explained by the presence of relatively cold ancient Farallon slab debris, that has been inferred for this region before (models D2-D3, G2-G3 or C3). The slab debris, in the form of MORB-rich material, would undergo a broad phase transition (reduced sharpness of \( D'' \)) due to enhanced aluminium and other elements. This applies for the North and South areas. It is important to note that in the North area, the \( D'' \) reflector is only detected with S waves, and not with P waves. This could result from the presence of small scale scatterers affecting preferentially high frequency P waves (e.g. Rost et al., 2010; Frost et al., 2013; Ma et al. 2016; Frost et al., 2017). In the regions where the \( D'' \) reflector is not detected at all, neither with S nor with P waves, various explanations are possible: (1) small \( D'' \) topography that deviates the waves which are thus not observed, (2) seismic anisotropy or (3) an anomalously high heat flux in the front of the remnant slab. These interpretations and hypotheses are summarized in Table 5.

5 CONCLUDING REMARKS

In this study, we show that by combining both P and S observations we are able to propose the most likely characteristics of the \( D'' \) layer beneath the North Atlantic. To do so we performed a bootstrap analysis in order to measure travel times that were then inverted for P and S velocity perturbations and \( D'' \) thickness, applying a Bayesian inversion. We investigated the sharpness of the \( D'' \) discontinuity as well as the existence of a negative velocity gradient toward the CMB. Combined with further synthetic seismogram calculations, that were used to compare with the observed seismograms, we find that the
Table 5. Summary of the various interpretations.

<table>
<thead>
<tr>
<th>Region</th>
<th>Observations</th>
<th>Preferred models</th>
<th>Interpretation</th>
</tr>
</thead>
<tbody>
<tr>
<td>North area</td>
<td>SdS, no PdP</td>
<td>D2-D3, G2-G3, C3</td>
<td>Presence of (cooler) MORB-like debris from ancient Farallon slab</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>Br to pPv phase transition in a Fe- and Al-enriched assemblage</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>small scale scatterers</td>
</tr>
<tr>
<td>Central area</td>
<td>no SdS, no PdP</td>
<td>no D'' reflector</td>
<td>D'' topography, anisotropy</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>Presence of a nascent hot plume that inhibits the Br-pPv phase transition</td>
</tr>
<tr>
<td>South area</td>
<td>SdS, PdP</td>
<td>D2-D3, G2-G3, C3</td>
<td>Presence of (cooler) MORB-like debris from ancient Farallon slab</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td>Br to pPv phase transition in a Fe- and Al-enriched assemblage</td>
</tr>
</tbody>
</table>

best fitting models have a D'' thickness of 300 km as well as strong and positive velocity jumps across the D'' discontinuity ranging from 2.7 to 3.8% for both $V_p$ and $V_s$. We also find that a velocity gradient across the D'' interface of ~30 km thick or a 100 km thick fast region at the top of D'' equally well explains the data. These results suggest that the D'' layer beneath the North Atlantic region could be characterized by a broadened Br-pPv phase transition in subducted slab debris. Lateral variations in the detection of D'' in our region further point towards the presence of heterogeneities, in the form of temperature, composition, topography, anisotropy or a combination of these.

ACKNOWLEDGMENTS

The authors thank M. Thorne, D. Frost, and one anonymous reviewer for their helpful comments as well as the Editor Martin Schimmel. Data were analysed with Obspy (Beyreuther et al., 2010), maps were drawn with GMT (Wessel & Smith, 1991) and the tomographic section was obtained with SeisTomoPy (Durand et al., 2018). Data were downloaded with IRIS. S.D. was supported by the DFG project HAADSES DU1634/1-1. J.M.J. was supported through the International Office of WWU, Münster, NSF-CSEDI-EAR-1600956, Caltech, and the W.M. Keck Institute for Space Studies.
REFERENCES


Bower, D.J., Gurnis, M., Sun, D., 2013, Dynamics origins of seismic wavespeed variation in D''', Phys. Earth Planet. Inter., 214, 74-86.


Bunge, H., Grand, S., 2000, Mesozoic plate-motion history below the northeast Pacific Ocean from seismic images of the subducted Farallon slab, Nature, 405, 337340.


Chaloner, J.W., Thomas, C., Rietbrock, A., 2009, P- and S-wave reflectors in D'' beneath southeast Asia, Geophys. J. Int., 179, 10801092


D′′ beneath the North Atlantic region


Efron, B., 1982, The Jackknife, the Bootstrap and Other Resampling Plans SIAM.


French, S.W., Romanowicz, B., 2014, Broad plumes rooted at the base of the Earth’s mantle beneath major hotspots, Science 525, 95-99.


2016. Strong seismic scatterers near the core mantle boundary north of the Pacific Anomaly, Phys. Earth Planet. Inter., 253, 2130.
Sidorin, I., Gurnis, M., Helmberger, D.V., 1999, Dynamics of a phase change at the base of the mantle consis-


Tarantola, A., Valette, B., 1982b, Inverse problems: Quest for information, *J. Geophys.*, **50**, 159-170


