Local, Regional, and Remote Seismo-Acoustic Observations of the April 2015 VEI 4 Eruption of Calbuco Volcano, Chile

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Abstract
The two major explosive phases of the 22–23 April 2015 eruption of Calbuco volcano, Chile, produced powerful seismicity and infrasound. The eruption was recorded on seismo-acoustic stations out to 1,540 km and on five stations (IS02, IS08, IS09, IS27, and IS49) of the International Monitoring System (IMS) infrasound network at distances from 1,525 to 5,122 km. The remote IMS infrasound stations provide an accurate explosion chronology consistent with the regional and local seismo-acoustic data and with previous studies of lightning and plume observations. We use the IMS network to detect and locate the eruption signals using a brute-force, grid-search, cross-bearing approach. After incorporating azimuth deviation corrections from stratospheric crosswinds using 3-D ray tracing, the estimated source location is 172 km from true. This case study highlights the significant capability of the IMS infrasound network to provide automated detection, characterization, and timing estimates of global explosive volcanic activity. Augmenting the IMS with regional seismo-acoustic networks will dramatically enhance volcanic signal detection, reduce latency, and improve discrimination capability.

1. Introduction
Calbuco volcano, Chile (41.3300°S, 72.6183°W), erupted explosively in April 2015 in two subplinian phases (plume heights >15 km, VEI 4) following relatively modest precursory activity (Castruccio et al., 2016; Romero et al., 2016; Valderrama et al., 2015, 2016; Van Eaton et al., 2016). A minor increase in volcanotectonic (VT) events (local magnitudes <2, ~5 events per day) was detected on local and regional seismic stations in the 3 months preceding the eruption (i.e., from February 2015); these events were located between the crater of the volcano and 6 km to the west, with depths of 5–9 km (Valderrama et al., 2015). We nominally define recording distances as local: <15 km, regional: 15–250 km, and remote: >250 km (Fee & Matoza, 2013). A significant, rapid, escalation in shallow seismicity (VT and long-period, LP, including events classified by Observatorio Volcanológico de los Andes del Sur (OVDAS) as “hybrid” based on frequency content and waveform) occurred in the 3–4 h prior to the first explosive phase (Figure 1) (Castruccio et al., 2016; Valderrama et al., 2016, 2015). This preeruptive seismicity sequence included a local magnitude Ml 3.8 event located to the west of Calbuco at 6.3 km depth (OVDAS solution), approximately 20 min before the eruption (Figure 1) (Valderrama et al., 2015, 2016). Van Eaton et al. (2016) provide a chronology of the eruption combining data from a local seismic station (station PES ~5.4 km distance from the crater), satellite-derived umbrella cloud expansion estimates, lightning mapping, and characteristics of the fall deposits. The two major subplinian explosive phases are estimated to have begun at 21:04 22 April 2015 (duration ~1 h:30 m) and 04:00 23 April 2015 (duration ~6 h:15 m) (Van Eaton et al., 2016) (we report all times in UT and all plume heights referenced to above sea level). These explosive phases were characterized by ash columns extending into the stratosphere, with a maximum plume height of 23 km (Vidal et al., 2015) and pyroclastic density currents reaching 6 km from the vent (Castruccio et al., 2016). These events resulted in the evacuation of over 6,500 people from nearby communities and impacted infrastructure, agriculture, and aviation. The two major eruptive phases were also detected using ionospheric total electron content perturbations on ground-based Global Navigation Satellite System receivers in southern Chile, interpreted as a consequence of acoustic noise, observed in the frequency band of 30–100 Hz. This occurred over an area ~100 km in diameter, with a maximum delay of 15 km, with a rapid subsequent increase in activity lasting ~20 min in both explosive phases.
shocks that propagated to ionospheric altitudes (Shults et al., 2016). A third smaller (likely phreatic) explo-
sive eruption occurred at 16:08 30 April 2015 (plume height <4.5 km) (Van Eaton et al., 2016); the third
event did not produce large enough signals to be recorded beyond local distances. Here we focus on
using remote infrasound signals to locate and characterize the two major explosive eruption events on
22–23 April 2015.

Previous work has demonstrated that remote infrasound arrays can be used to detect, locate, and pro-
vide detailed chronologies of remote explosive volcanism, with the potential to provide source para-
eters for ash transport and dispersal models (e.g., Caudron et al., 2015; Dabrowa et al., 2011; Fee,
Steffke, & Garces, 2010; Green et al., 2013; Matoza, Le Pichon, et al., 2011). Regional volcano-acoustic
monitoring and early warning systems are being investigated and implemented (De Angelis et al., 2012;
Garces et al., 2008; Fee, Garces, & Steffke, 2010; Kamo et al., 1994; Matoza et al., 2007; Ulivieri et al., 2013).
More recent work has explored the potential of the International Monitoring System (IMS) infrasound network to provide a quantitative catalog of global explosive volcanic activity (Matoza et al., 2017) and automated eruption notifications to Volcanic Ash
Advisory Centers (Mialle et al., 2015). The well-documented 22–23 April 2015 eruptive sequence of
Calbuco represents a unique opportunity to test and evaluate remote infrasonic detection, location,
and characterization capabilities. We evaluate the ability of remote IMS infrasound stations to (1) detect
volcanic eruption signals in the presence of wind noise and interfering infrasound signals, (2) provide fast
and reliable location solutions using automated procedures, and (3) provide constraints on the timing
(origin time and duration) of explosive eruptive activity. The availability of local seismic, regional
seismo-acoustic, and remote acoustic data makes this a useful case study for this purpose. In addition,
the April 2015 eruption of Calbuco represents a rare case of a large ground-truth infrasound event in the
Southern Hemisphere. Very few ground-truth infrasound events have been available for the Southern
Hemisphere to date, due in part to the lower station density and correspondingly lower detection capability
(Le Pichon et al., 2009) and due to the reduced number of anthropogenic sources in the more sparsely
populated hemisphere (Nippress & Green, 2017). Furthermore, Earth’s potentially active volcanoes are
unevenly distributed by hemisphere, with only about 19% located between 10° south and the South Pole
(Global Volcanism Program, 2013).

Figure 1. (a) Record section of broadband seismic data (vertical component, band-pass filtered 0.5–10 Hz, except VER unfiltered) showing the precursory seismicity and two explosive phases of Calbuco. Station distances to Calbuco are VER (6.3 km), LL01 (118 km), PLCA (186 km), and GO07 (216 km). The plot origin time is 16:00 22 April 2015. The eruption start times (Van Eaton et al., 2016) are shown as blue lines with a moveout velocity of 6.8 km/s. Station GO07 is a colocated seismo-acoustic station; (b) its infrasound data band-pass filtered 0.1–18 Hz. Note the asymmetric, positively skewed infrasound waveforms during hours 12 to 15. Also note the strong similarity between PLCA and GO07 seismic data from 15 to 17 h.
2. Regional and Remote Infrasound Observations

The IMS includes a global network of infrasound arrays designed to detect atmospheric explosions anywhere on the planet (Figure 2); 60 stations are planned with an average spacing of about 2,000 km and 49 stations are currently certified (Christie & Campus, 2010). Each infrasound station is an array of at least four infrasonic sensors that digitally sample atmospheric pressure at 20 Hz. The sensors have a flat response compliant with IMS minimum requirements from 0.02 to 4 Hz and a sensitivity of about 0.1 mPa per count. Five IMS stations (IS02, IS08, IS09, IS27, and IS49) detected the April 2015 Calbuco eruption (Figures 2 and 3). A detection is defined here as a coherent array detection sequence using the Progressive Multichannel Correlation (PMCC) method (Le Pichon et al., 2010) that arrives at the appropriate time and backazimuth, and which we can confidently discriminate from persistent background coherent infrasound signals (clutter) (Matoza et al., 2013). IS02 (1,525 km), IS08 (2,809 km), and IS09 (3,698 km) recorded both subplinian explosive phases. Due to varying noise levels (Figure 4), IS27 (4,800 km) detected only Phase 2 and IS49 (5,122 km) detected only Phase 1. Only one channel (H2) of IS41 was functioning during this time, which did clearly record both explosive phases (Figure 4); however, array processing and detection were consequently not possible for this station. The meteorological conditions at station IS27 resulted in high wind-noise levels during the eruption, with wind speeds well above 10 m/s starting on 22 April 2015 in the late afternoon and persisting for at least 3 days. Wind noise levels are usually high at station IS49 given its island location in the Atlantic Ocean.

Analysis of the IMS data from Calbuco reinforces the utility of arrays for the detection of remote volcanic infrasound and its discrimination from incoherent wind noise (Walker & Hedlin, 2010) and clutter (Matoza et al., 2013) (Figures 3 and 4). For example, the predicted arrival time of Phase 1 on IS27 roughly coincides with a broadband, long-duration pressure fluctuation superficially resembling volcanic jetting (Matoza et al., 2009); however, array processing identifies this to be incoherent wind noise (Figure 4). Furthermore, the closest station IS14 (Robinson Crusoe Island, Chile; 1,011 km) registers coherent signals at the right time coming from the same backazimuth as Calbuco, which we identify as clutter, possibly surf (Garcés et al., 2003; Le Pichon et al., 2004; Matoza et al., 2013) based on a longer time series of array detections (not shown).

The April 2015 Calbuco eruption signals were also well recorded by local and regional seismic and infrasound stations (Figures 1, 3, and 4). Our analysis includes one local broadband seismic station (VER) operated by OVDAS (the OVDAS preeruptive monitoring network consisted of four seismic stations and one camera; at the time of writing the network now consists of three seismic stations, one infrasound station, and one tiltmeter) and additional regional data publicly available through the Incorporated Research Institutions for Seismology Data Management Center (IRIS DMC). In particular, the Chilean seismic network operates 10 seismo-acoustic stations, each consisting of a three-component broadband seismometer colocated with a single infrasound sensor, which provide a valuable complement to the global IMS data (IRIS DMC, 2012; http://ds.iris.edu/spud/infrasoundevent/12678628).

Infrasound is recorded above noise on four regional stations out to 1,540 km (GO07, GO08, GO04, and GO03). Only one station (GO07, 216 km) recorded both infrasound and seismic signals from Calbuco (Figure 1), permitting seismo-acoustic sensor pair analysis (Ichihara et al., 2012; Matoza & Fee, 2014). The infrasound waveform at GO07 contains portions with asymmetric, positively skewed waveforms (Figure 1), similar to previous observations 264 km from the eruption of Nabro volcano, Eritrea that were attributed to a source process linked to supersonic flow of a volcanic jet (section 4) (Fee et al., 2013). Although this was interpreted by Fee et al. (2013) as a source effect, it remains possible for the Nabro case that this is partially or entirely a propagation effect resulting from nonlinear reshocking at thermospheric altitudes (Lonzaga et al., 2015).

Seismic signals associated with the Calbuco eruption are recorded out to ~250 km on stations VER, LL01, PLCA, and GO07 (Figures 1 and 2), consisting of a combination of impulsive volcanic earthquake signals, sustained seismic eruption tremor, and air-ground coupled infrasound. Another local broadband OVDAS station, PES, shows similar waveforms to those shown in Figure 1 for VER but with some telemetry gaps (Van Eaton et al., 2016). Discrete seismic events show clear P and S phases propagating with moveouts of 6.8 km/s and 3.8 km/s, respectively, presumably representing bulk averages of crustal Vp and Vs in the region. The precursory seismicity observed locally at VER (and PES) was partially recorded at PLCA but is obscured by noise at LL01 and GO07 (Figure 1).
The regional seismo-acoustic data provide valuable information on the eruption that is consistent with other observations. Infrasound-derived eruption origin times for the two main phases, assuming a celerity of 0.3 km/s, are 21:04 22 April 2015 and 04:00 23 April 2015, respectively (Figure 3 and Tables 1a and 1b). These origin times are consistent with those derived with local seismic data (21:04 22 April 2015; 03:54 23 April 2015) (Figure 1) and lightning analysis (21:04 22 April 2015; 04:00 23 April 2015) (Van Eaton et al., 2016). The eruption end times are also consistent within a few minutes. Both eruption phases begin

Figure 2. Map showing Calbuco (red triangle), certified stations of the IMS network (empty inverted triangles), detecting IMS stations (green inverted triangles), regional infrasound stations (blue inverted triangles), and regional seismic stations (blue hexagons). Black arrows indicate the direction and relative strength of the ECMWF stratospheric wind field averaged between elevations from 40 to 60 km. The colored grid displays the predicted transmission loss in decibels (dB) relative to a reference distance 1 km from the source at 0.5 Hz using the ECMWF wind field and the method of Le Pichon et al. (2012). Only one channel of IS41 was functioning during this time, which did record the eruption (see Figure 4). IMS = International Monitoring System; ECMWF = European Centre for Medium-Range Weather Forecasting.
emergently in the regional infrasound waveforms and gradually build in amplitude over a few hours, in agreement with the steadily increasing umbrella cloud growth (and mass eruption rate, MER) (Van Eaton et al., 2016). Lightning, pyroclastic density current (PDC) generation, and mass eruption rate were all highest in Phase 2 (Van Eaton et al., 2016). Infrasound amplitudes for Phase 2 are also higher (Figures 1 and 3b). Amplitude variations in the Phase 2 infrasound between ~05:30 and 06:30 23 April 2015 are possibly related to intermittent PDC generation (Van Eaton et al., 2016).

In order to understand the regional seismo-acoustic data, it is helpful to identify air-to-ground coupling in seismic recordings. For the Calbuco eruption, we observe differences in the polarization of the regional seismic eruption tremor signals that help to identify the recorded wave type (Figure 5). Below 2 Hz, transverse signal amplitudes are approximately 25% larger than vertical and radial components (indicating a dominant $SH$ wave or Love wave $L_p$ component). In contrast, above 2 Hz, the vertical and radial components are approximately 10% larger than the transverse (suggesting that $P$, Rayleigh waves, $R_p$ or air-ground coupled waves are the major component of the wavefield). Observations that the radial components of discrete earthquake and explosion signals dominate across a broad frequency band suggest that the frequency variation of the tremor wavefield is not simply a site effect (e.g., Figure 5c). This observation is consistent with air-ground coupled energy on the seismometers at higher frequencies (>2 Hz), in which elliptically polarized seismic
waves are generated within the plane of propagation (Edwards et al., 2007; Ichihara et al., 2012). These air-ground coupled waves are formally guided waves and likely have a short range from the conversion point (i.e., they do not propagate coherently over kilometers, only locally near the stations) (Strick & Ginzbarg, 1956). On the one seismic station that is colocated with infrasound (GO07), cross-correlation and coherence analysis provide a strong indication of air-ground coupling (Figure 6). In addition, local seismic waveforms high-pass filtered above 5 Hz mimic long-range infrasound waveforms corrected for propagation delay, suggesting that air-ground coupling is a significant component of seismically observed eruption tremor even at local distances (Matoza & Fee, 2014).

In order to compare available constraints on eruption timing and duration, Table 1a summarizes observations from the closest recording infrasound station (GO07) and the closest recording IMS infrasound station (IS02). We estimate signal onset and duration times for both explosive phases at the stations using two methods: (1) by manual examination of the waveforms and (2) using seismo-acoustic sensor pair analysis (GO07) or PMCC (IS02). The waveforms from both explosive phases at both stations start and end gradually; our manual analysis (1) represents approximate times based on when waveforms appear and disappear below the noise level. For the seismo-acoustic sensor pair analysis (GO07), we manually measure onset and duration from the cross-correlation (XCOR) pattern (Ichihara et al., 2012). Seismo-acoustic cross-correlation relies on a signal

<table>
<thead>
<tr>
<th>Station</th>
<th>Waveform first break</th>
<th>Waveform duration (s)</th>
<th>XCOR or PMCC onset</th>
<th>XCOR or PMCC duration (s)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Phase 1</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>IS02 (1,525 km)</td>
<td>2015-04-22 22:46:40</td>
<td>4,600</td>
<td>2015-04-22 23:00:55</td>
<td>3,040</td>
</tr>
<tr>
<td>Phase 2</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>GO07 (216 km)</td>
<td>2015-04-23 04:12:20</td>
<td>22,360</td>
<td>2015-04-23 04:12:20</td>
<td>21,280</td>
</tr>
<tr>
<td>IS02 (1,525 km)</td>
<td>2015-04-23 05:21:40</td>
<td>22,700</td>
<td>2015-04-23 05:25:40</td>
<td>20,680</td>
</tr>
</tbody>
</table>

Note. All times in UT. Dates are formatted as year-month-day.
on the seismometer, while PMCC has a detection threshold based on waveform correlation; thus, the XCOR- and PMCC-derived durations are shorter than those based on visible waveforms. Therefore, we judge that the manual waveform analysis of GO07 infrasound provides the most accurate timing estimates available. The relative arrival times for Phase 2 onsets at both stations are consistent with a celerity of 0.3 km/s. Based on this, Table 1b shows our best estimate for the start time and duration of both explosive phases. The inferred timings and durations from IS02 are similar to those derived from GO07 (Table 1a), confirming that remote IMS infrasound observations can provide useful constraints on the eruption timing and duration. However, the remote infrasound estimates of timing and duration contain errors of up to tens of minutes due to the emergent nature of the signals, varying wind-noise levels, and signal-to-noise ratios (Figure 4). Variations in celerity as a function of azimuth and range due to multipathing will introduce additional uncertainties in estimated eruption start time and duration, which we do not consider in this study.

3. Source Location Using Remote Infrasound Arrays

The April 2015 Calbuco eruption is a useful case study to test and validate remote infrasound signal association and source location methodologies using the IMS network. We apply the method of Matoza et al. (2017) to detect and locate the eruption signals using a brute-force, grid-search, cross-bearings approach (Figure 7). The method involves determining locations on the Earth’s surface where a maximal number of signal backazimuth great-circle trajectories from multiple arrays intersect. The method described by Matoza et al. (2017) is a first-order simplified approach that does not include corrections for infrasound propagation. However, it is well known that stratospheric crosswinds (winds perpendicular to the propagation direction) result in significant azimuth deviations that translate the source location solutions (e.g., Evers & Haak, 2005; Matoza, Le Pichon, et al., 2011), as is observed in Figure 3. Observed azimuth deviations from the true great circle path (mode of the observed minus true) are IS02 (+10.8°), IS08 (−4.5°), IS09 (−5.1°), IS27 (+6.7°), and IS49 (−3.0°).

We apply the combined signal association and source-location procedure with and without a crosswind correction (Figure 7). The grids shown in Figure 7 are constructed from all signals from the five IMS arrays during the time from 22 to 23 April 2015 and have been corrected for a background prior rate of clutter predicted from the previous 10 days (Matoza et al., 2017). We apply a static azimuth deviation correction to all array detections within ±30° of the true source location. Static azimuth corrections are derived using 3-D ray tracing with the WASP-3D program (Dessa et al., 2005; Virieux et al., 2004) and the ECMWF (European Centre for Medium-Range Weather Forecasting, part of the Integrated Forecast System cycle 38r1, http://www.ecmwf.int/)

Table 1b
GO07 Best (Waveform) Inferred Eruption Timing Assuming 0.3 km/s Celerity

<table>
<thead>
<tr>
<th>Phase</th>
<th>Eruption start</th>
<th>Eruption duration (min)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Phase 1</td>
<td>2015-04-22 21:04:15</td>
<td>90.4</td>
</tr>
<tr>
<td>Phase 2</td>
<td>2015-04-23 04:00:20</td>
<td>372.6</td>
</tr>
</tbody>
</table>

Note. All times in UT. Dates are formatted as year-month-day.
specifications averaged over 22–23 April 2015. We note that this procedure requires the source location to be known a priori. We aim in future work to modify this approach for implementation as a blind search by computing rays from every trial source node to every receiver; however, the method used here provides an indication of the results that could be achieved with such a method.

Figure 6. Seismo-acoustic cross-correlation and coherence analysis for station GO07. (a) Infrasound (red) and vertical seismic (black) waveforms filtered 3–13 Hz, (b) infrasound spectrogram, (c) vertical seismic spectrogram, (d) cross-correlation, and (e) coherence. The cross-correlation is performed with waveforms filtered 3–13 Hz, chosen based on the coherence spectrogram. Cross-correlation and coherence are performed in sliding time windows of 10 s. An unknown noise source (likely local and anthropogenic) with fixed spectral peaks from 0 to 1 h (Figure 6c) generates a similar cross-correlation signature to the eruption signals (Figure 6d).

Figure 7. Automated source location 22–23 April 2015 from the five detecting IMS stations using the brute-force, grid-search, cross-bearings method of Matoza et al. (2017). (a) Without azimuth deviation correction (source location 522 km from true Calbuco location) and (b) with azimuth deviation correction using 3-D ray tracing and ECMWF (source location 172 km from true). The apparent discontinuity in the source image to the north results from the IS27 contribution and maximum distance parameter of 5,000 km. The large red circle is the source location solution (grid maximum). In Figure 7b, the small blue circle is the source location derived without using a maximum distance cutoff (coincident with red circle). The small black circles are the source locations from jackknife tests (e.g., label “27” corresponds to the location derived when station IS27 is not used). The jackknife solutions for IS08 and IS49 are coincident with the main source location (red and blue circles). An animation of the grid construction is shown in supporting information Movie S1. IMS = International Monitoring System; ECMWF = European Centre for Medium-Range Weather Forecasting.
Although ray tracing provides a prediction of azimuth deviations, in practice, explaining infrasound observations with currently available atmospheric specifications requires interactive manual analysis (e.g., Matoza, Le Pichon, et al., 2011). In particular, identifying eigenrays between the source and receiver is nontrivial, and propagation paths can be strongly dependent on stochastic small-scale perturbations to the available atmospheric profiles, often interpreted as gravity waves not captured in spatially smoothed atmospheric specifications (Assink et al., 2014; Green et al., 2011; Le Pichon et al., 2015; Smets et al., 2016). Our emphasis is on developing methods that could be applied rapidly to produce analysis products to aid volcano monitoring, or that could be applied automatically to large data archives; thus, we choose a more robust and simple approach.

We assume a source at Calbuco (source altitude fixed to 3 km) and launch rays at 5 azimuth values toward each station (from −5° to +5° of the great-circle azimuth in increments of 2.5°). For each azimuth, we launch 80 rays, with the elevation angles ranging from 0 to 40° in increments of 0.5° (sampling is done in elevation angle, not ray parameter). Among the 400 rays launched, those with stratospheric trajectories (defined as having a maximum turning height between 30 km and 60 km altitude) intercepting a box centered on the station of dimension 50 km × 50 km × 5 km (in longitude, latitude, elevation, respectively) are identified as a candidate. We define the final azimuth deviation values as the median of all candidates to represent averages over multiple propagation paths. We note that the observed and modeled azimuth deviations are up to 11° and 7°, respectively. Such large values can be expected for nearly southward propagation under a stratospheric wind jet (e.g., Le Pichon et al., 2005).

A natural extension of the method would be to include a crosswind correction in all look directions computed from each receiver to every trial source node based on the current atmospheric specification. We do not attempt that here, but our approach provides a preliminary indication of the importance of incorporating more realistic propagation corrections. Without the crosswind correction, the derived source location is 522 km from true (Figure 7a); with the correction, we obtain a source location at 172 km from true (Figure 7b). Thus, as expected, the crosswind correction significantly aids with signal association and attributing a detected event to a volcano.

We perform jackknife tests to investigate the contribution of individual stations to the source location solution (Figure 7b). For example, the location labeled “27” in Figure 7b corresponds to the source location derived without IS27 and using only the other four IMS stations (IS02, IS08, IS09, and IS49). In most cases (IS02, IS08, IS27, and IS49), the removal of one station has only a minor effect on the source location. However, IS09 has a slightly more important contribution given the source-receiver geometries and azimuthal coverage. We use a maximum distance cutoff of 5,000 km for the grids shown in Figure 7; however, removal of the distance cutoff produces an identical source location (blue circle, Figure 7b), indicating that the source locations are primarily controlled by backazimuth intersection.

4. Discussion

The two main explosive phases of the April 2015 eruption of Calbuco are well recorded on regional seismic stations out to 216 km (Figure 1), on regional single-sensor infrasound stations from 216 km to 1,540 km (Figure 4) and on IMS infrasound arrays at distances from 1,525 km to 5,122 km (Figures 3 and 4). For a real-time monitoring scenario, this case study exemplifies how incorporating regional seismo-acoustic data would help to dramatically reduce latency for eruption detection and notification compared to using the IMS data alone. For a celerity of 0.3 km/s, propagation time to GO07 (216 km) is 12 min, whereas to IS02 (1,525 km) it is 84 min.

Overall, the signal timing and duration determined from the remote IMS infrasound stations is consistent with the explosion chronology determined by Van Eaton et al. (2016) and as recorded on the regional seismic and infrasound stations, building confidence that volcanic explosion chronologies can be accurately inferred from remote infrasound observations for events of this magnitude (Figure 3b) (e.g., Matoza, Le Pichon, et al., 2011). Furthermore, our results indicate that an eruption event of this size can be automatically detected and located using remote IMS infrasound data, with improvements to the source location achieved by accounting for stratospheric crosswinds (section 3). The remaining source mislocation (172 km) is most likely a result of inaccuracies in the atmospheric specifications, leading to errors in simulated raypaths. For example, stratospheric wind speeds are often underestimated in atmospheric specifications (Le Pichon et al., 2005, 2015).
In addition, neglecting submesoscale variations in atmospheric specifications, including gravity waves, may lead to errors in predicted paths. In the case of a marginal duct, small perturbations to the atmospheric profile (e.g., gravity wave induced horizontal wind fluctuations) may be required to enable ducting (e.g., Green et al., 2011). Thus, gravity waves may establish a separate duct, with a different azimuth deviation prediction than that obtained without the gravity waves. The direct effect of gravity wave perturbations on along-path azimuth deviations is not yet understood but could be small if random wind direction perturbations average out along the propagation path. Uncertainties in backazimuth estimation using infrasound arrays provide additional error (Szuberla & Olson, 2004), which is approximated in our approach with the ±2° azimuth deviation tolerance used for the combined association and location (Matoza et al., 2017).

For a real-time detection scenario, the source location error of 172 km is not sufficient to identify a specific volcano and may lead to ambiguity as to which particular volcano erupted. However, for a remote volcano not monitored with local instrumentation, a source location with error of ~200 km could still be useful to trigger a search of satellite or other data. Completing the IMS network (e.g., planned station IS01, Bariloche, Argentina) and adding more regional infrasound arrays would both improve the location accuracy.

The seismo-acoustic cross-correlation and coherence analysis and observed polarization change above 2 Hz for the seismic data indicate that air-ground coupling is a significant component of the seismic eruption tremor waveforms at regional distances (Figures 5 and 6). Thus, existing seismic networks can help improve the infrasonic network detection capability (e.g., Cochran & Shearer, 2006; Fee et al., 2016; Hedlin et al., 2012).

We further investigate atmospheric influence on the propagation and detectability of the Calbuco eruption by modeling transmission loss (TL) from Calbuco using a frequency-dependent, semiempirical attenuation relationship derived from parabolic equation simulations (Figure 2) (Le Pichon et al., 2012; Tailpied et al., 2016). We chose this approach as it is fast to implement, requires relatively few model parameters, and is thus suitable as a near-real-time analysis tool. A rapid and simple model of infrasound propagation conditions would help volcano observatories to interpret observed signal detection for a given eruption, network geometry, and current atmospheric state. The attenuation relation accounts for the effects of source frequency, geometrical spreading, and absorption. The temporal and spatial variability of the atmosphere is described using the ECMWF operational high-spatial resolution forecasts. Along-path stratospheric wind averaged between altitudes 40 and 60 km is the primary atmospheric parameter in the empirical relation (Le Pichon et al., 2012).

The color scale in Figure 2 shows infrasound TL at 0.5 Hz from Calbuco at the ground surface; this frequency approximately corresponds to the highest observed signal-to-noise ratio for the Calbuco signals at the IMS infrasonic stations. This map provides a prediction of the IMS network detection capability for this event.
given the atmospheric specification. Overall, the geographic distribution of detecting stations is well explained to first order, which predicts <70 dB TL at detecting IMS stations (Figure 2). At the time of the eruption, steady stratospheric currents favor long-range propagation eastward. The observed celerity of 0.3 km/s is also consistent with stratospheric ducting (e.g., Brown et al., 2002). The lack of detection at IS14 is explained by the combined effects of signal attenuation and high background noise and clutter on oceanic islands (Brown et al., 2014; Matoza et al., 2013).

Recorded infrasound waveforms represent a convolution of the source-time function and the Green’s function describing propagation from source to receiver. At regional to remote distances, propagation effects on recorded waveforms are significant and it is challenging to relate waveform features uniquely to source effects. The infrasound waveforms at station GO07 (216 km) during the first ~1.5–2 h of Phase 2 (~04:00–06:00 23 April 2015) exhibit repeated asymmetric, shock-like pressure pulses with positive waveform skewness, similar to those associated with the “crackle” phenomenon in audible noise from supersonic, heated jet, and rocket engines (Gee et al., 2007, 2009) (Figures 1 and 8). Asymmetric waveforms similar to those associated with crackle have been recorded associated with turbulent jetting at other volcanoes (e.g., Fee et al., 2013; Goto et al., 2014). Asymmetric infrasound waveforms are also associated with “chugging” (Lees et al., 2004), although chugging has a different spectral signature to that associated with turbulent jetting (e.g., Fee et al., 2013). The waveform shape and skewness of infrasound between ~04:00 and 6:00 23 April 2015 resemble that associated with crackle from supersonic jet and rocket engines, as well as the infrasound from the 2013 eruption of Nabro Volcano, Eritrea (Figure 8) (Fee et al., 2013).

The asymmetric GO07 waveforms may result from source effects, propagation effects (Lonzaga et al., 2015), or a combination of both. Nonlinear reshocking can occur for both thermospheric and stratospheric propagation, but is more severe for thermospheric paths (Lonzaga et al., 2015). To investigate propagation effects, full-waveform, broadband, and nonlinear numerical propagation modeling is required (e.g., de Groot-Hedlin, 2016; Lonzaga et al., 2015) but is beyond the scope of the present study. For the 2011 Nabro eruption, ray tracing and high trace-velocity estimates indicated a thermospheric path from the source to the receiver at 264 km range (Fee et al., 2013). For the 2015 Calbuco eruption, WASP-3D ray tracing using ECMWF fails to predict any arrivals at GO07 (216 km), likely because the atmospheric specifications are spatially smoothed. Nonlinear and broadband propagation effects can also explain infrasound observations in ray shadow zones in some cases (de Groot-Hedlin, 2016). The range of 216 km is short, but not unprecedented, for thermospheric arrivals; thermospheric arrivals at ~200 km have previously been observed (Gibbons et al., 2015; Reed, 1969; Whitaker & Mutschlenner, 2008).

The celerity estimates for arrivals at GO07 (0.3 km/s) are consistent with stratospheric propagation when using the explosion origin times of Van Eaton et al. (2016) or when fitting a constant celerity model to all recording infrasound stations (Figure 4 and Tables 1a and 1b). However, due to the emergent onsets of the signals, lack of local infrasound data, variations in signal-to-noise ratio across the network, and uncertainties in the derived explosion origin times, it is difficult to conclude with confidence that the GO07 observations are stratospheric arrivals based on available celerity information. Furthermore, for a long-duration, sustained eruption signal, the first-arrival celerity is not a robust indicator of the propagation path for the full waveform (Matoza, Le Pichon, et al., 2011). Steady transitions in trace velocity, dominant frequency, and backazimuth deviation have been observed in sustained eruption signals at arrays at remote distances, indicating a gradual transition from dominantly tropospheric, through dominantly stratospheric, to dominantly thermospheric trajectories in a continuous waveform (Matoza, Le Pichon, et al., 2011).

The observed GO07 infrasound waveform skewness is a broadband feature; a band-pass filter results in a waveform that is significantly less skewed (e.g., 0.5–9 Hz filter used in Figure 3). However, for the GO07 signals, low-frequency components (<0.5 Hz) are more important than high frequencies (>5 Hz) in forming the asymmetric waveforms. Applying a high-pass filter (>1 Hz) removes the waveform skewness. Applying a low-pass filter (<5 Hz) preserves the waveform skewness. That said, Figure 6 shows significant signal power at frequencies extending to the Nyquist frequency near ~18 Hz for the GO07 waveforms. These high-frequency signal components at a range of 216 km suggest propagation along a low attenuation path (turning below the thermosphere), and they could be produced at the source or by reshocking at altitude; numerical propagation modeling would be required to confirm the propagation path and the likely generation mechanism.
However, it remains possible that the wavefield is a superposition of phases including thermospheric phases; thus, the presence of high frequencies does not rule out that the asymmetry (which is dominant at lower frequencies) is a thermospheric effect. Waveform skewness is not observed at the IMS stations, which we interpret as due to attenuation of high frequencies at the greater ranges (>1,525 km) as well as lower signal-to-noise ratios at low frequencies (<0.5 Hz).

Although the cause of positive waveform skewness at volcanoes is currently unclear, it is possible that these observations are explained by supersonic flow during the beginning of Phase 2 and possibly a more gas-rich eruption region (Fee et al., 2013). The skewed infrasound waveforms also correspond temporally to the deposition of low-density pumice (Deposit C in Romero et al., 2016) and end approximately when the PDCs begin (Van Eaton et al., 2016). After this portion, the tephra consists of higher-density pumice (Deposit D) (Romero et al., 2016). These observations suggest a significant change in the plume density and dynamics at around 06:30 23 April 2015.

5. Conclusions

The two major explosive phases of the 22–23 April 2015 eruption of Calbuco volcano, Chile, were recorded on seismic-acoustic stations out to 1,540 km and on five stations of the IMS infrasound network out to 5,122 km. The remote IMS infrasound arrays provide an accurate explosion chronology consistent with the regional and local seismic-acoustic data, increasing confidence in the use of remote infrasound observations for automated detection, location, and characterization of explosive volcanism. Augmenting the IMS in regions of dense volcanism, even with relatively sparse regional seismic-acoustic networks, will dramatically enhance volcanic signal detection, reduce latency, and improve discrimination capability.

Acknowledgments
We used data from seismic network codes C (Chilean National Seismic Network), C1 (Red Sismologica Nacional), and GT (Global Telemetered Seismograph Network), downloaded from the IRIS DMC (http://www.iris.edu). Data from the CTBT IMS infrasound network are available through the CTBTO-VDEC platform (https://www.ctbto.org/specials/vdec/). Our analysis included the use of ObsPy (Beyreuther et al., 2010) and PMCC (Le Pichon et al., 2010), and we used GMT for plotting (Wessel & Smith, 1991). We thank Danny Bowman, Weston Thelen, and an anonymous reviewer for their comments that helped to improve the manuscript. This work was supported by NSF grants EAR–1614855 and EAR–1614323.

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