

RESEARCH ARTICLE

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Key Points:

- Surprisingly, three tremor sources with different underlying mechanisms were detected in eruptive tremor during the Holuhraun eruption 2014/2015
- Tremor was generated (i) below open vents, (ii) at the margins of a growing lava flow field, and (iii) potentially by intrusions at depth
- Tremor sources need to be accurately selected and located for quantification of effusion rates, for example, if multiple sources are present

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Multiple coincident eruptive seismic tremor sources during the 2014–2015 eruption at Holuhraun, Iceland

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Abstract We analyze eruptive tremor during one of the largest effusive eruptions in historical times in Iceland (2014/2015 Holuhraun eruption). Seismic array recordings are compared with effusion rates deduced from Moderate Resolution Imaging Spectroradiometer recordings and ground video monitoring data and lead to the identification of three coexisting eruptive tremor sources. This contrasts other tremor studies that generally link eruptive tremor to only one source usually associated with the vent. The three sources are (i) a source that is stable in back azimuth and shows bursts with ramp-like decrease in amplitude at the beginning of the eruption: we link it to a process below the open vents where the bursts correlate with the opening of new vents and temporary increases in the lava fountaining height; (ii) a source moving by a few degrees per month while the tremor amplitude suddenly increases and decreases: back azimuth and slowness correlate with the growing margins of the lava flow field, whilst new contact with a river led to fast increases of the tremor amplitude; and (iii) a source moving by up to 25° southward in 4 days that cannot be related to any observed surface activity and might be linked to intrusions. We therefore suggest that eruptive tremor amplitudes/energies are used with caution when estimating eruptive volumes, effusion rates, or the eruption explosivity as multiple sources can coexist during the eruption phase. Our results suggest that arrays can monitor both the growth of a lava flow field and the activity in the vents.

Plain Language Summary We analyzed a type of earthquake that is long lasting, has no sudden start but is slowly getting stronger, and is recorded during eruptions. This so-called tremor is usually thought to be merely caused below the vent where the magma moves up toward the surface. Therefore, it was, for example, used to estimate how much magma and how fast the magma erupts, how high, and where the erupted magma would go. However, using a dense network of seismometers at only 15 km distance from the erupting magma—during the Holuhraun eruption in Iceland in 2014/2015—we found three areas where tremor is caused. These are (i) below the vent where the magma moves up toward the surface, (ii) at the cooling sides of the growing lava flow field, and (iii) probably at less than 2 km depth where the Earth's crust breaks and magma moves horizontally. We warn other scientists to be careful when using the tremor amplitude but also show that we can with our instruments watch in real time where the lava flow field is growing.

1. Introduction

Volcano monitoring commonly includes seismological records and allows the distinction between different types of signals that are characteristic of volcanoes. A long-lasting, emergent signal—tremor—is usually observed during eruptions [McNutt, 1992] and often starts and ends with the extrusion of magma [Battaglia et al., 2005a; Soosalu et al., 2005; Langer et al., 2011]. However, the precise mechanism that generates eruptive tremor is poorly understood because of limited on-site observations and measurements of sufficient quality [Senyukov et al., 2015; Langer et al., 2011] and poor constraints on tremor locations especially at depth.

Published tremor source models can be broadly grouped into four different classes: (i) the normal modes of a linear oscillator with open or closed ends are excited [e.g., Chouet, 1988], (ii) fluid flow excites the conduit

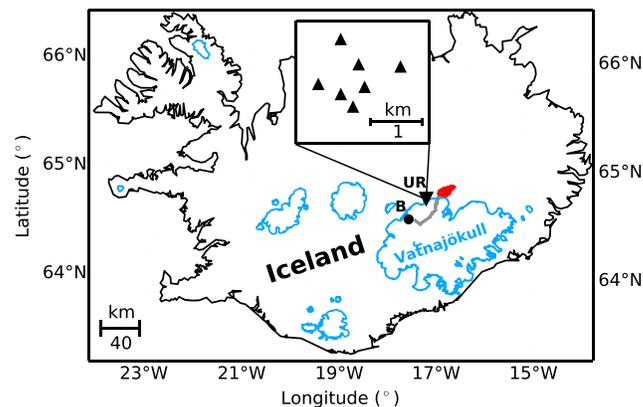


Figure 1. Geometry (inset) and location of seismometers arranged as a seven-element array UR northwest of Vatnajökull glacier, Iceland. Glaciers (blue), the 2014 formed dyke segments as described in *Sigmundsson et al.* [2014] (grey), and the erupted lava flow field in Holuhraun (red) and Bárðarbunga volcano (B, black dot) are marked.

[*Tárraga et al.*, 2014; *Belousov et al.*, 2015; *Falsaperla et al.*, 2005; *Soosalu et al.*, 2005; *Langer et al.*, 2011; *Julian*, 1994]. For correlations of the tremor amplitude and SO_2 emission rate [*Palma et al.*, 2008; *Nadeau et al.*, 2011] or with infrasonic pressure [*Ripepe et al.*, 2009] or correlations of tremor bursts and spattering episodes [*Patrick et al.*, 2011; *Coppola et al.*, 2005] the tremor source was related to boiling activity.

While correlations were established in the above mentioned cases, this was not always the case. *Eaton et al.* [1987] found evidence that tremor amplitude and fountain height did not correlate except for times when the fissure was forced open at the beginning of an eruption episode. Similarly, *Aki and Koyanagi* [1981] observed a high correlation between tremor and volume of erupted material merely at the beginning of an eruption. Subsequently, *Aki and Koyanagi* [1981] described that the tremor amplitude decreased while the amount of erupted material remained high. Such a lack of correlation might be due to more than one simultaneously active tremor source, as *Battaglia et al.* [2005a] suggested at Piton de la Fournaise based on the tremor locations they derived using an amplitude-based location method. Other studies do not attempt to resolve the tremor source model but focus more on forecasting/monitoring eruptions. *McNutt* [1994], for example, suggested the use of the tremor amplitude in order to estimate the size of an eruption and the amount of ash that will be ejected [see also *Bernard et al.*, 2016]. This idea is supported by studies suggesting that the tremor amplitude or energy and the effusion rate are linked [*Koyanagi et al.*, 1987; *Battaglia et al.*, 2005b; *Falsaperla et al.*, 2005; *Coppola et al.*, 2009]. However, others like *Coppola et al.* [2009] and *Allard et al.* [2011] also find that high tremor amplitudes occur when the magma discharge is low ($<0.3 \text{ m}^3/\text{s}$) and link this to a change in eruptive style.

Here we present the eruptive tremor that accompanied the 2014–2015 fissure eruption at Holuhraun, fed from Bárðarbunga volcano in Iceland [*Sigmundsson et al.*, 2014]. The tremor data were recorded with a seismic array at about 15 km distance from the fissure (Figure 1) and compared to effusion rate estimates derived from Moderate Resolution Imaging Spectroradiometer (MODIS) sensor, lava fountain height measurements as derived from video records, and the growing lava flow field.

2. Overview of the Eruption

2.1. General Overview of the Fissures

From 16 August 2014 seismicity at 3 to 8 km depth propagated 48 km from beneath the ice-covered Bárðarbunga volcano first toward the southeast then north-northeast [*Sigmundsson et al.*, 2014]. At 0:02 UTC on 29 August a 4 h long eruption started near the northern end of this migrating seismicity at Holuhraun—about 5 km north of the glacier's northern rim. On 31 August 2014 a fissure opened at the same place, with lava production that continued for 6 months until 27 February 2015. Additionally, a new fissure opened beneath the glacier on 3 September [*Eibl et al.*, 2017] and 2 km north of the ice on 5 September. The latter eruption was detected at 7:00 UTC by a news reporter and ended in the afternoon of 7 September. The vigour of the activity

walls [e.g., *Julian*, 1994], (iii) evenly spaced pulses continuously repeat [e.g., *Neuberg et al.*, 2000; *Hotovec et al.*, 2013], and (iv) hydrothermal boiling [e.g., *Leet*, 1988; *Cannata et al.*, 2010].

As an attempt to find a possible tremor model, the tremor is usually correlated with other direct observations. For example, a correlation between tremor amplitude and the height of lava fountains [*Alparone*, 2003; *McNutt*, 1987; *Koyanagi et al.*, 1987] has been attributed to a resonating source. Tremor generated by fluid flow was assumed when the tremor amplitude correlated with the gas content in the magma [*Tárraga et al.*, 2014], the constriction of the conduit [*Tárraga et al.*, 2014] or conduit geometry [*Julian*, 1994], or the intensity of the eruption

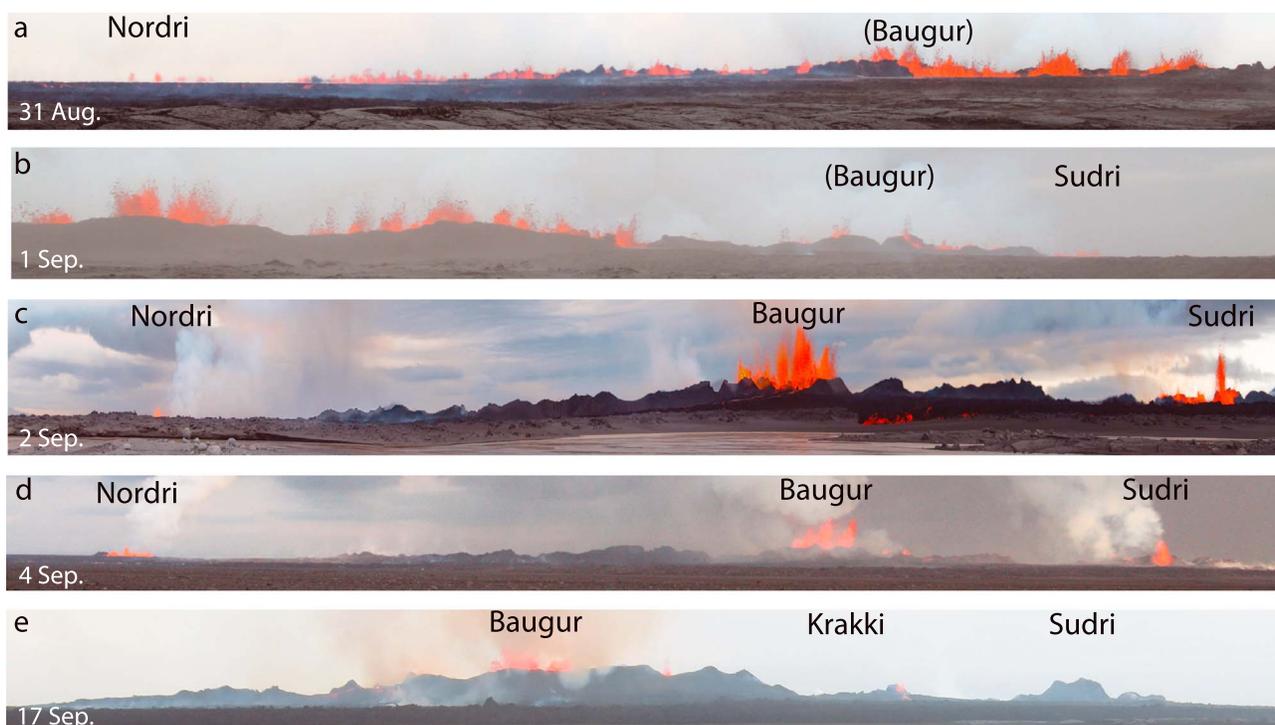


Figure 2. Vent activity along the fissure viewed from the west between 31 August and 17 September 2014. For an overview of vent locations and geometries see Figure 3. (a) On 31 August the activity is continuously visible along the fissure. The southern end is not shown. Photo: Ármann Höskuldsson. (b) On 1 September the activity along the fissure started to focus. The northern end is not shown. Photo: Johanne Schmith. (c) On 2 September the activity focused on Nordri, Sudri, and an elongated middle part consisting of Heimasætan and Baugur. Three feeding channels are visible in Baugur. Photo: Daniel Müller. (d) On 4 September the vent activity is as in Figure 2c. Photo: Ármann Höskuldsson. (e) On 17 September merely Baugur and Krakki are active. Nordri and Sudri show no superficial activity. Photo: Águst Thór Gunnlaugsson.

at the fissure from 5 to 7 September was much less than on the main vent system. A brief overview is given here of the evolution of the vent activity and the progressive growth of the lava flow field.

2.2. Vent Activity

The eruptions on 29 and 31 August began along a 600 m and 1.9 km long fissure, respectively [Hjartardóttir *et al.*, 2016]. They started with a continuous, aligned curtain of lava fountaining [Thordarson *et al.*, 2015] with higher activity on the southern and middle parts of the fissure. On 1 September the activity on the fissure began to localize along specific vents. By 2 September the activity was concentrated on the vents named Nordri and Sudri located on the northern and southern end of the original fissure as well as the vents Heimasætan and Baugur situated along the middle segment of the original fissure (see Figures 2 and 3). Within a few days, the ramparts of Heimasætan and Baugur merged into a single structure with at least three vents surrounded by an elongated rampart. We will refer to the middle part as Baugur hereafter. In the next few days Nordri, Sudri, and Baugur built up ramparts. Nordri shut down between 11 and 12 September. No surface activity was seen from Sudri from 13 September (Figure 2). Apart from two short-lived new vents Krakki (14 to 20/22 September) and an unnamed vent east to the fissure (14 to 16 September), the system stabilized from 22 September when Baugur was the only active part of the fissure with three feeding vents. From early February the lava level in Baugur dropped until the eruption stopped on 27 February 2015.

2.3. Growth of the Lava Flow Field

The growth of the lava flow field (Figure 3) [Pedersen *et al.*, 2017] was mapped in detail using GPS instruments in the field and data from satellites TERRA, AQUA, NOAA (daily), Landsat-8, Landsat-7, EO-1, SENTINEL-1, TerrasarX TandemX Radarsat 2, Cosmo Skymed (weekly), and radar images from the Icelandic coastguard. The extruding basaltic lava initially flowed toward the northeast. It reached the river Jökulsá á Fjöllum on 7 September but continued northeastward until 15 September (Figure 3). Up until 26 September substantial lateral growth of the lava flow field took place both at the northwestern and southeastern margins. Thereafter, the growth was confined to the southeastern margins with minor activity in late October to mid-November

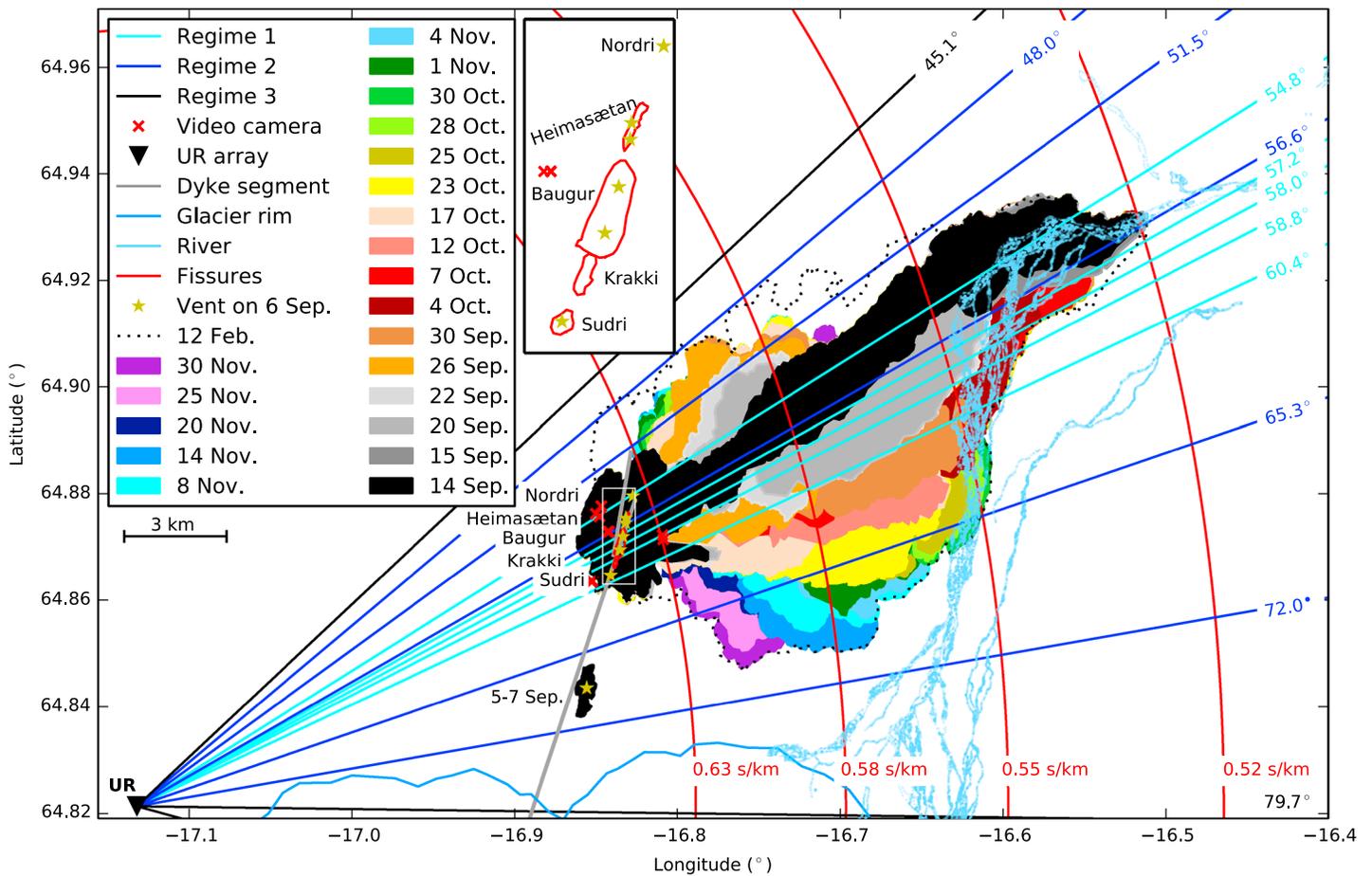


Figure 3. Growth of the lava flow field between 14 September and 30 November 2014. Lines mark the dyke segments as in *Sigmundsson et al.* [2014] (grey), the outline of Vatnajökull glacier (blue), Jökulsá á Fjöllum river (light blue), and the shape of the vents (red) as present in February, i.e., Nordri, Heimasætan, Baugur, Krakki, Sudri, and the fissures active during 5 to 7 September. Red crosses mark the location of the cameras used for lava fountain height calculation. Yellow stars mark the active vents on 6 September, i.e., Nordri, Heimasætan (twice), Baugur (twice), and Sudri (see also inset). To ease comparison with Figure 6, cyan, blue, and black lines mark back azimuths with respect to seismic array UR. All back azimuths are corrected so that the 60.4° back azimuth aligns with Sudri (70.27°) (see text). Cyan lines mark the five back azimuths in Regime 1. Blue lines mark the minimum and maximum back azimuth in Regime 2 until 15 September, the southernmost one between 15 September and 21 October, the overall southern maximum, and the overall northern maximum. Black lines mark the minimum and maximum back azimuth observed for sources in Regime 3. Red circles mark locations on the surface with identical slownesses at UR. Slownesses given are based on a comparison of observed slownesses in Regime 2 and actively growing flow front at the same time (see Figure 6d).

along the northern margins. New lava flows south of and parallel to the first one formed from 15 September, 22 September, 7 October, 12 October, and 31 October.

The key elements of the flow field growth are (i) the lava transport system and (ii) the active flow fronts. While lateral growth of the flow field takes place at the active flow front, growth via inflation takes place within the lava flows and in particular over the internal pathways feeding lava to the active parts of the flow. When the eruption stopped on 27 February 2015, the lava had covered an area of 85 km² and reached a height of 62 m in the vicinity of the fissure and an average lava thickness of 17 m [*Thordarson et al.*, 2015].

3. Methods

3.1. Frequency-Wave Number Analysis With Array Data

We installed an array (Figure 1) from 30 August to 24 November 2014 in order to locate and track eruptive tremor sources spatially and temporally. An array is required as tremor does not have any clearly identifiable *P* and *S* wave arrivals but is recorded as coherent waveforms on different stations in the array. The array initially consisted of seven three-component Güralp 6TDs (30 s to 100 Hz), of which four were replaced by Güralp 3ESPCD (60 s to 50 Hz) on 26 September. From late November only one station in the array continued to record. The array had an aperture of 1.63 km, a minimum station distance of 360 m, no angular dependence, and was

designed to resolve frequencies between 0.4 and 6 Hz based on a typical P wave velocity in the volcanic zone in Iceland of 2.5 km/s [Flóvenz and Gunnarsson, 1991].

We subdivide the recording of the vertical component in 1 h long, not overlapping time windows. We detrend, taper, instrument correct, and downsample to a sampling frequency of 20 Hz. Then we perform a frequency-wave number (FK) analysis between 0.8 and 2.0 Hz with a moving time window of 20 periods (14.3 s) in length and 20% overlap as implemented in *Beyreuther et al.* [2010] and *Megies et al.* [2011].

The FK analysis performs a grid search in a horizontal slowness grid with, in our case, a limit of ± 1.0 s/km and a stepsize of a fourth of the width of the main lobe (0.02 s/km), chosen based on the array response function and the properties of our data. The result is a time series of absolute power, semblance, and jointly inverted back azimuth and slowness. We require a minimum semblance of 0.25 and use the time series of the back azimuth to create histograms with 0.8° wide bins. The dominant back azimuth is picked automatically and the median slowness calculated. By calculating histograms of the back azimuths, we ensure that back azimuths from different sources are not averaged but that we pick the back azimuth associated with the dominating tremor source in each time window.

The back azimuth describes the angle between north and the direction toward the epicenter. The slowness is defined as the inverse of the apparent velocity of the wavefront and contains information about the wave type and potentially the source-receiver distance. We estimate the error of each back azimuth and slowness value based on the shape and location of the main lobe of the array response function in the horizontal slowness grid. We find all points with a power of at least 95% of the maximum, determine their corresponding slowness and back azimuth, and calculate the standard deviation of these values [La Rocca et al., 2008]. Our errors in back azimuth and slowness are 5.5 to 8° and 0.045 to 0.051 s/km, respectively.

3.2. Effusion Rate Derivation From Space-Based Thermal Data

MIROVA (Middle Infrared Observation of Volcanic Activity) is an automated global hot spot detection system run at the Università di Torino [Coppola et al., 2016] based on near-real-time ingestion of Moderate Resolution Imaging Spectroradiometer (MODIS) data. The system completes automatic detection and location of high-temperature thermal anomalies and provides a quantification of the volcanic radiant power (VRP) within 1 to 4 h of each satellite overpass [Coppola et al., 2016]. During the 2014/2015 Holuhraun eruption, MIROVA provided a first-order indication of the ongoing effusive trend [Coppola et al., 2017].

Satellite-based thermal data rely on the observed relationship between lava discharge rate, lava flow area, and thermal flux [e.g., *Pieri and Baloga*, 1986; *Wright et al.*, 2001; *Harris*, 2013, and references therein]. For any given eruptive condition, this relationship allows VRP to be set as proportional to the time-averaged lava discharge rate (TADR), where the coefficient of proportionality ($c_{\text{rad}} = \text{VRP}/\text{TADR}$) takes into account the appropriate rheological, insulation, and topographic conditions of the observed lava flow [Coppola et al., 2013].

The best fit coefficient ($c_{\text{rad}} \pm 50\%$) for the Holuhraun eruption has been calculated [Coppola et al., 2017] on the basis of the silica content of the erupted lava as $c_{\text{rad}} = 6.45 \cdot 10^{25} (X_{\text{SiO}_2})^{-10.4}$. By setting $X_{\text{SiO}_2} = 50.5$ wt % (http://earthice.hi.is/bardarbunga_2014), we obtain a radiant density of $0.6\text{--}1.8 \cdot 10^8$ J m $^{-3}$ which is considered to incorporate the appropriate emplacement conditions for the lava flow. This range of values allowed us to provide a mean (Figure 7b), upper and lower boundary limits for lava discharge rate calculation.

3.3. Lava Fountain Height Estimation From Video Records

Video recordings allow the monitoring of eruption sites and venting activity at high spatial and temporal resolution. In order to quantify changes in fountain height at the Holuhraun fissure during the first few days, we set up daytime video cameras recording the activity. The best locations (except on the first day of the eruption) were northwest of the fissure (see Figure 3). Due to weather conditions, wind direction, and the area covered by lava, the camera had to be moved slightly every day. Its distance was 0.5 to 2 km from the fissure, and it had a field of view of $140 \text{ m} \times 80 \text{ m}$ to $320 \text{ m} \times 180 \text{ m}$ at the distance of the observed fissures. The length of the videos varied from several minutes up to 2 h. The JVC GC-PX10 and Nikon D5100 cameras had a recording frequency set to 50 frames/s and 25 frames/s, respectively. All videos were recording at a resolution of 1920×1080 .

In order to calculate the height of the lava fountains in Baugur, Sudri, and Nordri (see Figure 3), we first convert each frame of a video into a gray scale image mainly based on the red channel of the camera. The red channel enabled us, for this particular case of fountaining, to better distinguish between lava, cloud, and steam. Using a Sobel edge detection algorithm [Zhang et al., 2009], we calculate the edges of the erupted lava fountain of

each vent. All areas that are surrounded by strong edges are labeled by the regionprops algorithm of MATLAB. The difference between the lowest pixel of all areas of one fountain and the highest pixel of the same fountain is the calculated height.

The videos are scaled by the distance to the lens and the lens type. Furthermore, we validated the resulting scaling by analysis of falling particles (assuming frictionless conditions) as in *Witt and Walter* [2017]. Due to different focal lenses and distances to the vents, the minimum size of detectable particles varied for every video, being in the range of 0.07 to 0.17 m pixel size. To compare the different heights, we only calculated heights of particles larger than ~ 20 cm. We give the error of the mean height as one standard deviation. The error of the maximum height is based on the accuracy of the edge detection (± 2 pixel unless the picture is very noisy) and the corresponding scaling from pixel to meter.

4. Results

The eruption was accompanied by harmonic, seismic tremor strongest between 0.7 and 1.5 Hz with overtones at a spacing of 0.1 Hz (Figure 4). It was present throughout the whole eruption and with a constant frequency pattern.

The seismic array results (see Figures 6b and 6c) indicate that the tremor came from a northeasterly direction during our 3 month long record. Upon closer inspection of the back azimuth we subdivided the eruptive tremor into three regimes. Tremor in these three regimes had identical characteristics in the seismograms and spectrograms recorded at UR at 15 km distance. The regimes are active at the same time, are differentiated based on their source location and speed of source movement, and are described in the following.

4.1. Correlation of the Vent Activity and Tremor Regime 1

The eruptive tremor started on 31 August at 4:14 UTC which we assume is the time when the fissure reopened. The open fissure was confirmed by recordings of a webcam located on a hill 16 km northeast of the vents at 5:51 UTC when the fog had lifted.

In the time domain the tremor signal in Regime 1 shows five strong, 4 to 26 h long pulses (Figures 4a–4d) during the first 8 days of the eruption (see Table 1). The initial increase is sudden, while the following decrease in amplitude is exponential. The first pulse can be linked to the opening of the fissure on 31 August and the fourth one to the opening of the southern fissures on 5 September. The third pulse is not further described here as it is associated with a pre-eruptive, shallowing tremor source beneath the glacier that is interpreted as the formation of a new dyke at less than 2 km depth [*Eibl et al.*, 2017].

Camera monitoring of the fountain heights at the distinct vents suggests that the other two tremor bursts (see Figures 4a–4d) coincide with increases in fountain height. We observed a strong increase in lava fountain height at Baugur and Nordri from 31 August to 1 September (see Table 1) when the activity focused on fewer vents. At the same time the tremor amplitude decreased from the initial peak amplitude on 31 August (Figure 5a) while parts of the fissure became inactive. The fountain height at Baugur and Nordri increased further on 2 September coinciding with an increase in tremor amplitude. Following a slight decrease in lava fountain height and tremor amplitude until 3 September, both increased on 4 September. The fountain height of Sudri seems to decrease between 31 August and 2 September. However, as the fountaining on 31 August is continuous, the fountain height in Sudri cannot be separated from Baugur.

Apart from an increase in tremor, the opening of the southern fissures on 5 September is visible as an increase of back azimuth, a decrease in slowness (see Table 1), and higher-frequency content between 1.3 and 1.8 Hz. Although these fissures remained active until 7 September, no tremor signal related to their activity was detected after 4:00 UTC on 6 September primarily because of more intense activity in the northern fissure. However, the tremor indicates that the fissures opened around 4:20 UTC on 5 September, 2 h and 40 min before it was detected by a news reporter.

The back azimuth from UR array was—even in the first 24 h of the eruption—stable in the range of 54.8 to 60.4°. This is about 10° off the vents. In other studies a systematic offset between the actual source and array back azimuths was observed [*Krüger and Weber*, 1992; *Schweitzer*, 2001]. The reasons for this might be topographic features or heterogeneities in the bedrock that bend the seismic rays. In our case the systematic offset was stable in time and consistent for Regimes 1 and 2 where the tremor location can be well constrained.

The tremor in Regime 1 (see Table 1) is characterized by five stable back azimuths (54.8, 57.2, 58.0, 58.8, and 60.4°) and slownesses in the range of 0.53 to 0.61 s/km (see Figure 6b). We correct for array squinting by

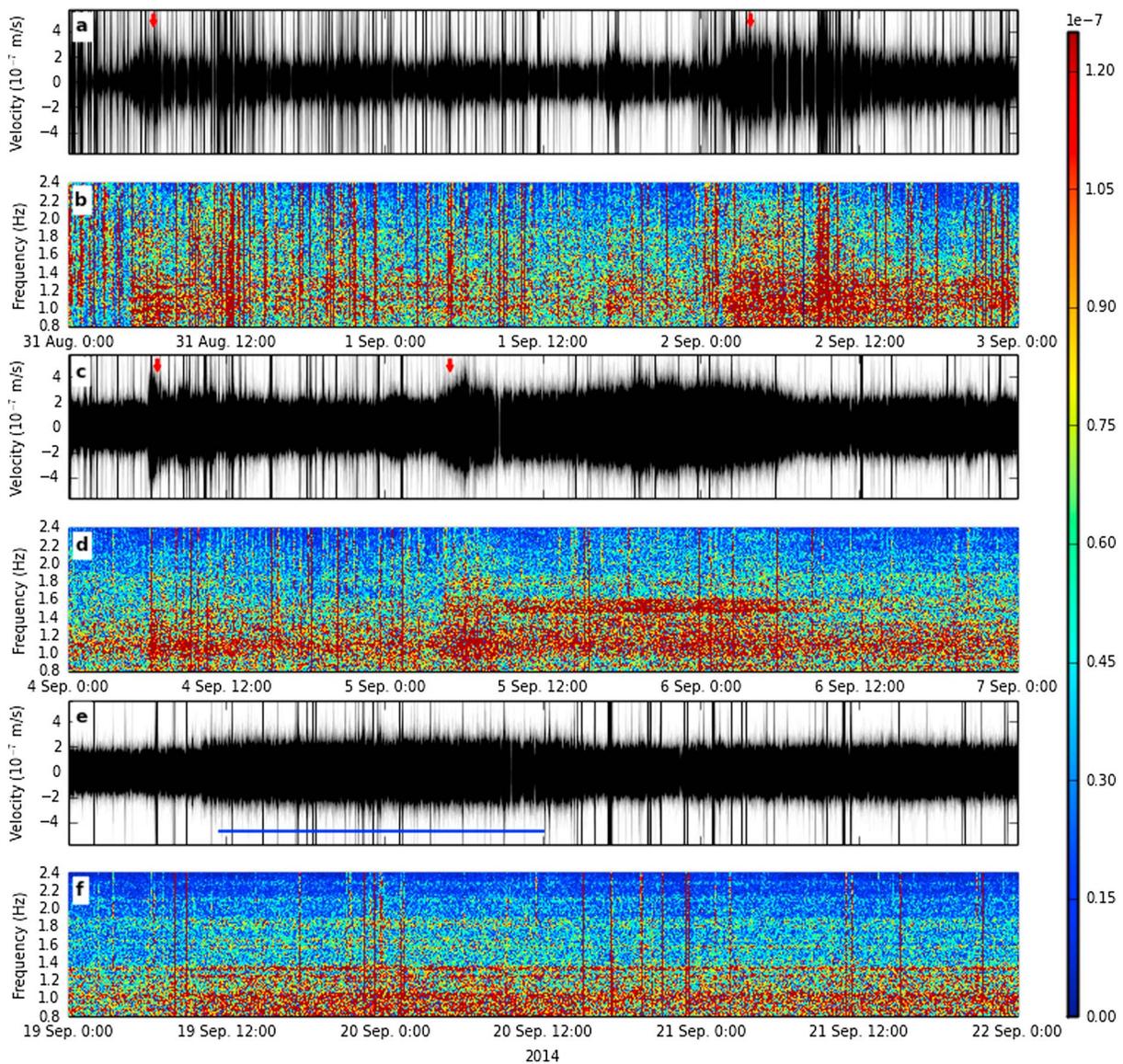


Figure 4. Instrument-corrected seismogram and amplitude spectrogram of the eruptive tremor at UR array filtered between 0.8 and 2.4 Hz. The earthquakes appearing as vertical lines are mostly from the dyke and the continuing Bárðarbunga caldera collapse. We show all four tremor bursts in Regime 1 (red arrows) from (a and b) 31 August to 3 September and (c and d) 4 to 7 September. (e and f) One exemplary sudden increase and decrease in tremor amplitude in Regime 2 between 19 and 22 September is shown, while the visually verified lava contact with the river is marked with a blue horizontal line.

adding about 10° to the back azimuths and can align the back azimuths in Regime 1 with Nordri, the three lava fountains in Baugur and Sudri. This squint correction also aligns the back azimuths on 5/6 September with the eruption on 5 to 7 September.

The activity in the three main ramparts fits to the visibility of the back azimuths in Regime 1. This regime was the dominating tremor source until 15 September. The northern tremor source in Regime 1 became less visible shortly after Nordri stopped erupting in mid-September. The lava fountain activity in Baugur slowed down to vigorous boiling with periodic bursting of bubbles in October, while the three middle back azimuths were visible from time to time (see Figure 6b). The highest lava fountains were, in general, associated with Baugur which is consistent with the fact that the middle three back azimuths dominated (Figure 5b).

Apart from the above mentioned correlations between vent activity and tremor back azimuths in Regime 1, Sudri did not show any surface activity from mid-September although the southernmost tremor source in Regime 1 continued to be active (see Figure 6b). It is, however, possible that the tremor source after

Table 1. Comparison of Back Azimuths in Regime 1 With the Active Vents and Times of Tremor Bursts With Lava Fountain Height and Opening Fissures^a

Date (Time) (UTC)	Tremor Amplitude	Back Azi- muth (deg)	Slowness (s/km)	Mean Fountain Height (m) (Maximum Fountain Height)	Tremor Source in Regime 1
31 Aug to 16 Sep		54.8			Nordri
31 Aug to 26 Nov		57.2			Baugur
31 Aug to 22 Nov		58.0			Baugur
1 Sep to 20 Nov		58.8			Baugur
31 Aug to 26 Sep		60.4			Sudri
31 Aug (4:14–9:00)	Peak, exp. decrease	57.2	0.59–0.63	N: 6.9 ± 2.4 (15.0 ± 0.2)	New fissure opened
"	"	"	"	B/S: 46.5 ± 6.6 (91.5 ± 0.4)	"
1 Sep	Low			B: 64.1 ± 12.4 (91.5 ± 0.3)	-
"	"	"	"	N: 48.7 ± 5.7 (84.8 ± 0.4)	"
2 Sep (2:00–20:00)	Peak, exp. decrease	57.2	0.56–0.63	B: 92.2 ± 6.9 (105.7 ± 0.5)	Higher lava fountains
"	"	"	"	N: 62.9 ± 10.8 (108.9 ± 0.6)	"
"	"	"	"	S: 28.7 ± 7.1 (69.8 ± 0.6)	"
3 Sep (2:00–21:35)	Three peaks	119–134	0.57–0.75	B: 96.9 ± 13.3 (109.2 ± 0.2)	Shallow dyke formed
"	"	"	"	"	subglacially
"	"	"	"	"	[Eibl et al., 2017]
4 Sep (6:03–22:00)	Peak, exp. decrease	57.2	0.53–0.60	B: 126.4 ± 4.2 (133.0 ± 0.7)	Higher lava fountains
5 Sep (4:20) to 6 Sep (6:00)	Two peaks	63–71	0.48–0.55		New fissure opened
"	"	"	"	"	2 km north of the ice

^aN, B, and S denote Nordri, Baugur, and Sudri, respectively.

mid-September was generated in the lava flow field as it points to a location where the feeding channels changed multiple times.

4.2. Correlation of the Lava Flow Field Growth and Tremor Regime 2

The tremor back azimuths in Regime 2 (see Table 2) gradually changed a few degrees southward per month (see Figure 6c). This regime dominated from 15 September to 21 October and from 2 to 24 November. From mid-September the back azimuth gradually changed from around 62.5 to 65.5° (southward), while back azimuths from 2 November were in the range of 64 to 70°. We subdivided the back azimuths in Regime 2 with five blue lines (see Figure 6c). These lines are also shown in Figure 3 in order to ease comparison. It can be seen that the tremor back azimuths correlate with the growth of the lava flow field. For example, from 15 September when the back azimuths indicate a gradual southward movement (see Figure 6c), lava flows were emplaced farther and farther south (Figure 3).

Slownesses scattered over 0.05 s/km but increased on average from around 0.55 to 0.6 s/km between 11 and 25 September, decreased back to 0.55 s/km until 5 October, and increased again to 0.6 s/km until 21 October. From 2 November slownesses ranged from 0.51 to 0.59 s/km (see Figure 6d). These gradual changes in slowness correlate with changes in distance between the newly formed lava flow field and UR array (Figure 6d). In September and October increasing slownesses coincided with decreases in distance whilst decreases in slowness coincided with increases in distance. As the tremor source moves away from UR, body waves travel through deeper regions and arrive at UR more steeply and therefore at lower slownesses. This correlation supports a tremor source at the growing margins of the lava flow field at the surface of the bedrock.

In the time domain fast increases in tremor amplitude in Regime 2 occurred on 7, 19, 27, and 29 September, decreases on 15, 20, and 28 September and 7 and 17 October (see Figures 4e and 4f). On-site observations show that new lava flows flowed into Jökulsá á Fjöllum River four times (see Figures 3 and 6a and Table 2 for the exact times). The first three contacts were accompanied by sudden increases and decreases in the tremor amplitude (see Figure 6) without any change in slowness or back azimuth. The fourth contact cannot be seen as the tremor source in Regime 3 dominated. One decrease on 17 October could not be attributed to a source.

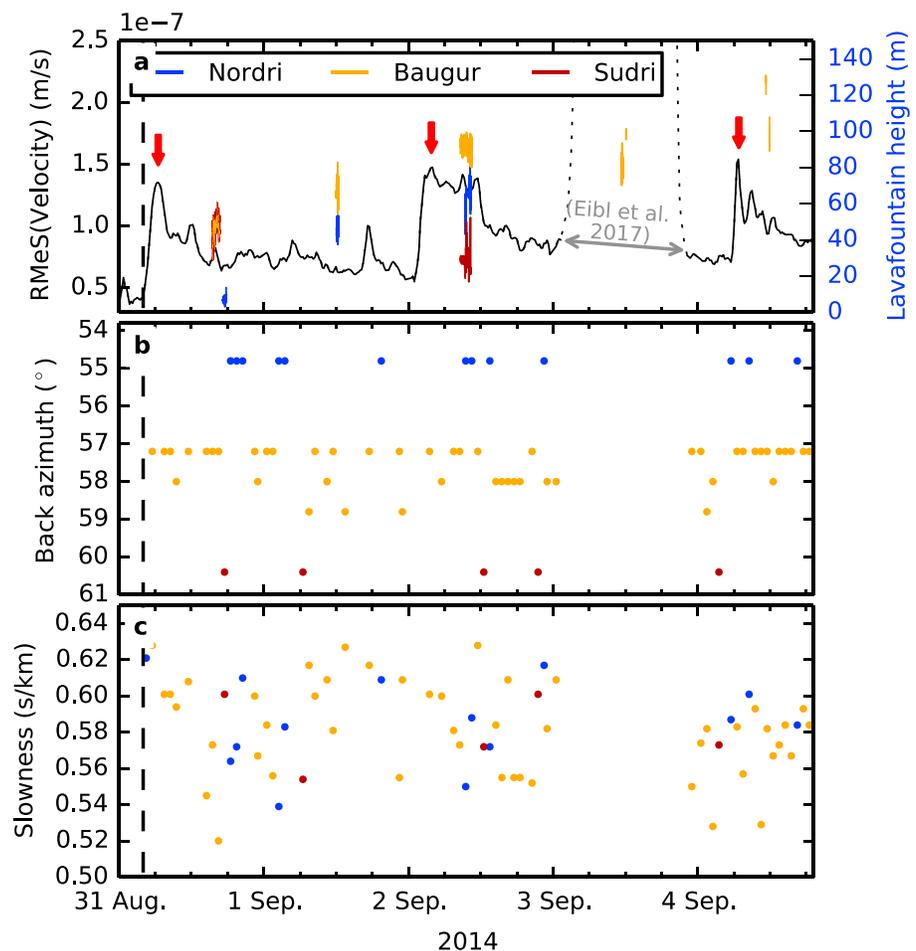


Figure 5. Tremor amplitude in comparison to the lava fountain height from 31 August to 5 September 2014. (a) The black line shows the tremor Root Median Square (RMeS) of the vertical component of station URB filtered between 0.8 and 2.0 Hz. Red arrows as in Figure 4. The vertical, black, dashed line marks the start of the eruption. The RMeS on 3 September is dotted and truncated as this is shown and interpreted in *Eibl et al.* [2017]. The blue, orange, and dark red lines show the lava fountain height in Nordri, Baugur, and Sudri, respectively. (b) Colored dots mark each 1 h long time window where one of the five stable back azimuths in Regime 1 is dominating. Dots are colored according to the vents in Figure 5a. (c) Same as in Figure 5b but showing the associated slownesses.

4.3. Regime 3: Back Azimuth Changes Up To 25° in 4 Days

Tremor from Regime 3 dominated from 21 October to 2 November and is characterized by back azimuths that changed up to 25° in 4 days (see Figure 6c). There are two fast southward movements from 21 to 25 October (65 to 90°) and from 26 October to 2 November (45 to 74°). These movements correspond to a minimum horizontal movement (at the distance of the fissure) of about 10 km.

The corresponding slownesses gradually decrease from 0.58 to 0.48 s/km and 0.70 to 0.51 s/km, respectively (Figure 6d). Decreasing slownesses indicate that the tremor source either moved away from UR or that it is composed of more body waves. Consequently, we assume that the tremor source either deepened in time or moved at the same depth laterally toward the southeast away from the vents (and UR array). A combination of both is also possible.

No change in tremor amplitude is visible at that time.

4.4. Correlation of Effusion Rate and Tremor Amplitude

The array—installed on 30 August—detected harmonic tremor from 4:14 UTC on 31 August to about 24 February. Apart from four peaks in the tremor within the first 8 days and erratic sudden increases or decreases, the tremor amplitude decreased gradually with time with occasional increases or decreases in amplitude.

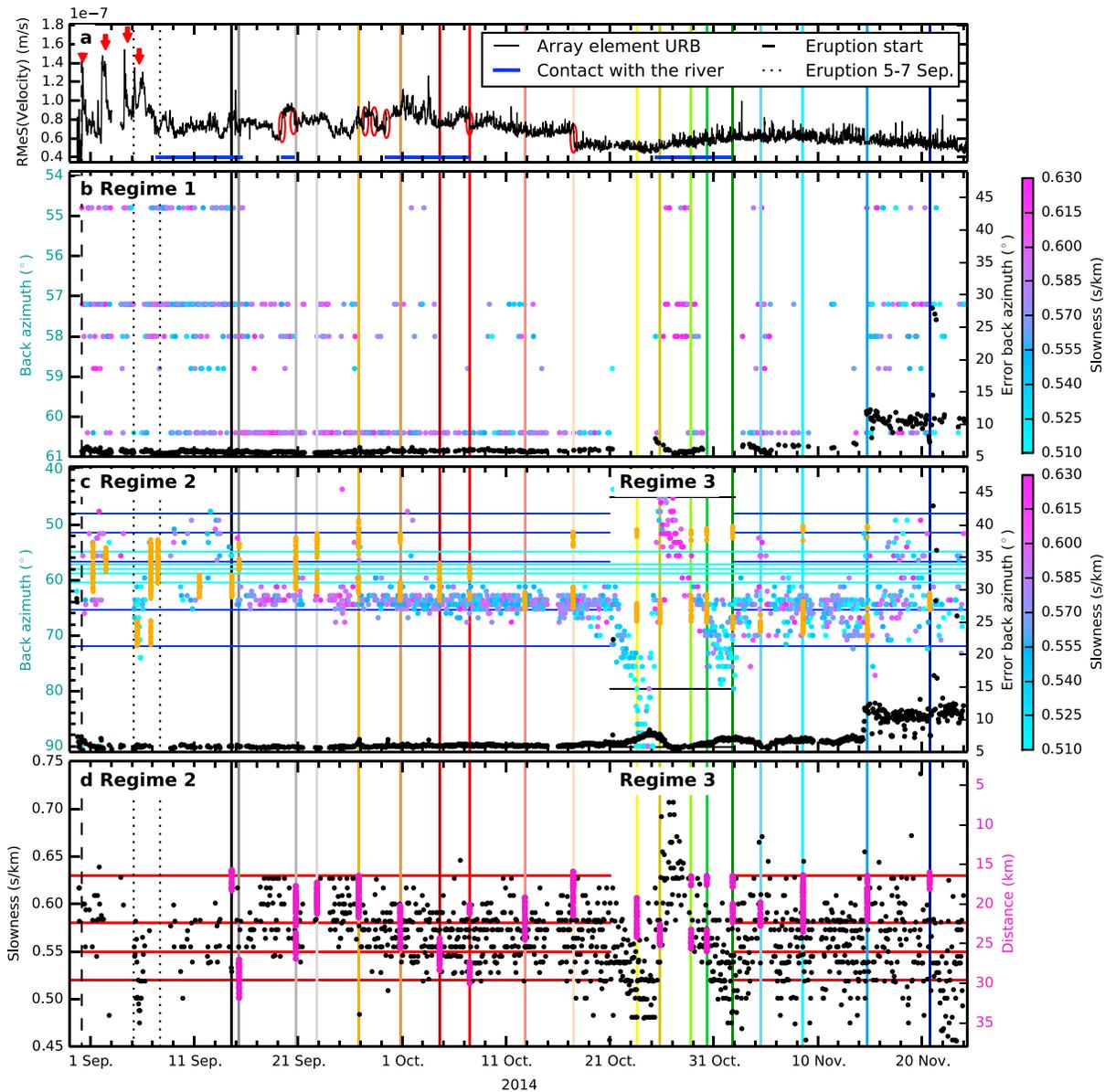


Figure 6. Separation of tremor sources based on the back azimuth between 31 August and 24 November 2014. (a) RMeS (black), black dashed line, and red arrows as in Figure 5. Red ellipses mark sudden increases or decreases in tremor amplitude, and blue horizontal lines mark when the lava flow field flowed into Jökulsá á Fjöllum River. Dotted lines mark the start and end of the eruption on 5–7 September. Colored vertical lines indicate when the lava flow field was mapped with colors corresponding to Figure 3. (b) Dots colored according to slowness mark each 1 h long time window where one of the five stable back azimuths in Regime 1 is dominating. Black dots indicate the corresponding error of the back azimuth. It increased on 14 November when stations started to fail. Black and colored vertical lines as in Figure 6a. (c) Dots colored according to slowness mark each 1 h long time window in Regimes 2 and 3 where the back azimuth is none of the five stable directions in Regime 1. Black dots as in Figure 6b; colored and black vertical lines as in Figure 6a. Orange dots indicate the back azimuth of the actively growing flow front. Cyan horizontal lines mark the five stable directions in Regime 1, and black lines mark the minimum and maximum back azimuths in Regime 3. Blue lines mark the overall northernmost direction, northern and southernmost directions before 15 September, the southernmost direction between 15 September and 21 October, and the overall southernmost direction in Regime 2. Projections are shown in Figure 3. (d) Same as Figure 6c but for slowness instead of back azimuth marked with black dots. Red horizontal lines mark minimum and maximum slowness observed before 21 October, minimum slowness on 23 September and on 27 September to 1 October, and are projected in Figure 3. Magenta dots mark the distance between the newly formed lava flow field and UR array as visible in Figure 3.

Table 2. Comparison of Back Azimuths and Slownesses in Regime 2 With the Growing Lava Flow Field and Times of Sudden Increases and Decreases in Tremor Amplitude With the Contact With the River^a

Date (Time in UTC)	Tremor Amplitude	Back Azimuth (deg)	Slowness (s/km)	Features of the Growth of the Lava Flow Field (Regime 2)
11 Sep to 25 Sep		62.5→	0.55→0.6	Flow field grows toward UR
25 Sep to 5 Oct		...	0.6→0.55	Flow field grows away from UR
5 Oct to 21 Oct		→65.5	0.55→0.6	Flow field grows toward UR
2 Nov to 15 Nov		64–70	0.51–0.59	
7 Sep (18:20)	Increase			River reached
15 Sep (3:20)	Decrease	64	0.55 ± 0.02	River left
19 Sep (10:55)	Increase	63	0.59 ± 0.04	River reached
20 Sep (16:30)	Decrease	63	0.58 ± 0.03	River left
27 Sep (8:35)	Increase	63.8	0.57 ± 0.02	First snow
28 Sep (8:35)	Decrease	63.8	0.57 ± 0.02	
29 Sep (10:05)	Increase	63.8	0.57 ± 0.03	River reached
7 Oct (11:45)	Decrease	64.2	0.56 ± 0.04	River left
17 Oct (12:25)	Decrease	64.2	0.58 ± 0.03	

^aArrows indicate gradual movements in back azimuth or slowness.

However, on 2 February the tremor amplitude increased and only reached the detection threshold of our array at 15 km distance from the fissures about 3 days before the eruption was officially declared over.

A general decrease in both effusion rate derived from satellites and tremor amplitude over 6 months can be observed (Figure 7). On a smaller scale the effusion rate peaked from 7 to 11 September and around 5 October, whilst the tremor amplitude was highest on 31 August to 5 September and 2 October. Excluding the increases and decreases in tremor amplitude, for example, on 29 September, which are due to the contact with the river, the peak in tremor amplitude on 2 October is not as prominent as the peak in effusion rate. The offset between the MODIS-derived effusion rates and the tremor amplitude during sources in Regime 1 might be due to the fact that the satellite-based effusion rates assume that the lava flow has reached a steady state thermal state [Garel *et al.*, 2012]. In basaltic flows this generally takes a few hours to a few days so that sharp variations in the lava flux are not immediately reflected by sharp variation of the radiant output.

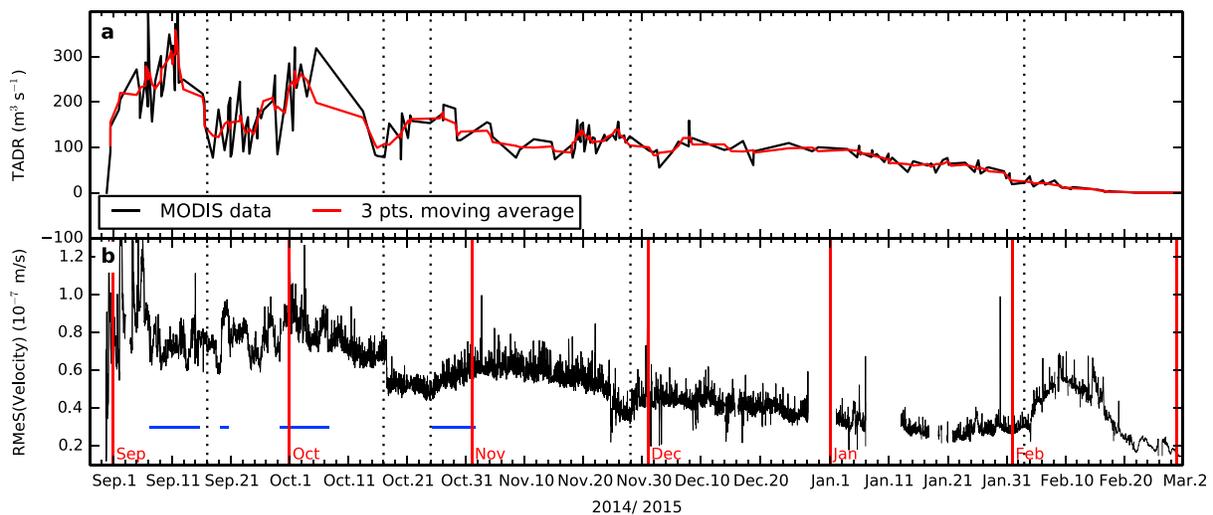


Figure 7. Comparison of RMeS of the tremor with effusion rate from 31 August 2014 to 2 March 2015. Dotted lines are for orientation. (a) MODIS-derived Time Averaged lava Discharge Rate (TADR). [Coppola *et al.*, 2017] (b) RMeS of array station URB (black line). Blue horizontal lines mark times of contact between the growing lava front with Jökulsá á Fjöllum River. Red vertical lines mark the beginning of months.

In contrast, lows in effusion rate and tremor amplitude broadly coincide in mid-September and mid-October. From then on small-scale fluctuations of tremor amplitude and effusion rate do not seem to correlate. However, the tremor increase by a factor of 3 in February roughly coincided with the deviation of the effusion rate from an exponential decreasing trend on 27 January [Coppola *et al.*, 2017] and was also observed by Allard *et al.* [2011] on Piton de la Fournaise. A lack of correlation might be due to multiple coincident tremor sources or a dominant tremor source not related to processes in the vents.

5. Discussion

Eruptive tremor is usually interpreted to be associated with only one source in the literature. In contrast, we found three coexisting tremor sources in the eruptive tremor during a well-recorded eruption in Iceland. Below we discuss possible tremor generation models and implications for studies that use the tremor amplitude or energy to estimate input parameters for other models, for example, plume height models.

5.1. Regime 1: Vent Tremor Model

We summarize our observations regarding tremor Regime 1 below in order to find a possible vent tremor model:

1. The eruptive tremor started/ended with the opening/closing of the fissure (see Figure 7c).
2. Tremor was very narrow banded, harmonic ($\Delta f = 0.1$ Hz), and strongest from 0.7 to 1.5 Hz (see Figure 4).
3. There were no frequency glidings or frequency jumps during these 6 months of eruption (see Figure 4).
4. The vents (especially Baugur) had a temporary lava pond on top, which exhibited lava fountaining and spattering over the rampart.
5. The tremor was generated locally below open vents, not while magma flowed horizontally in the 48 km long dyke (see Figure 3).
6. Although a 1.9 km long fissure opened on the first day, the tremor source was already focused on certain directions where Nordri, Sudri, and Baugur formed subsequently (see Figure 6b).
7. Tremor was stronger when a new vent opened, and lava fountains were higher (see Figure 5a).
8. In the first few days of the eruption there were peaks in the tremor amplitude as well as in the effusion rate (see Figures 7b and 7c).
9. Comparing the slownesses with the slownesses on 3 September [Eibl *et al.*, 2017], we suggest that the tremor source was at less than 2 km depths, but not on the surface.

Based on GPS and interferometric synthetic aperture radar (InSAR) data (Andrew Hooper, personal communication, 2016) and mapping of superficial faults [Hjartardóttir *et al.*, 2016], the dyke was inferred to be as shallow as 300 m below the eruptive site on the day before the eruption. Tremor was from the very first day generated in five distinct regions presumably at a few hundred meters depth, above which vents formed later. Two scenarios regarding the evolution of the feeding system are possible:

1. The dyke remained at about 300 m depth whilst magma was fed through five distinct “fingers” to the surface. Three of these fingers feed Baugur, whilst two feed Nordri and Sudri. The initial 1.9 km long fissure was fed sideways from these fingers reflecting merely the weakness of the crust, not the feeding system.
2. The whole dyke reached the surface visible as a 1.9 km long fissure. However, from day 2 merely regions with more or faster flow remained open, whilst other parts of the dyke shut down. These five regions generated tremor beneath Baugur, Nordri, and Sudri (illustrated in Figure 8). The latter scenario seems more likely to us given that the dyke reached at least 300 m depth and that the lava fountains increase with the focusing on single vents on day 2.

As eruptive tremor started only once the fissure opened, it might be related to degassing processes as suggested, for example, by Soosalu *et al.* [2005]. Ripepe and Gordeev [1999] proposed that the tremor is the result of a viscoelastic response of the magma to a sudden pressure drop that is generated when bubbles coalesce. As decompression dominates over diffusion in the uppermost few hundred meters of the dyke, bubble growth speeds up. They propose that tremor is generated in a region merely 100 to 200 m beneath the surface. Based on a clear correlation between eruption type (effusive-Strombolian-lava fountain-sustained column) and tremor amplitude (increasing), Alparone [2003] suggested similarly that the tremor is generated at shallow depth. They observed systematic depth changes of the tremor source and link it to rising magma that starts to fragment and allows gas bubbles to coalesce and migrate.

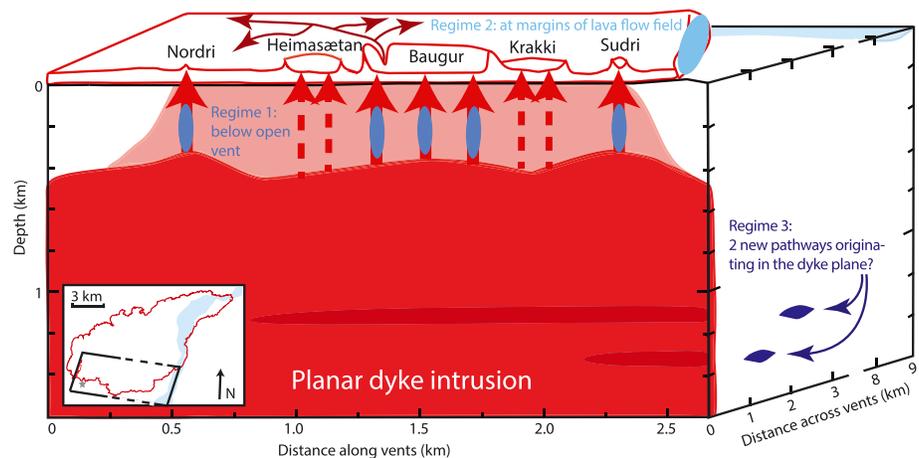


Figure 8. Schematic illustration of the locations of the three tremor regimes. It was inferred from InSAR, GPS, and superficial fault mappings that the tip of the dyke (red plane) was located at a few hundred meters depth beneath the eruptive site on the day before the eruption started. In the first 24 h the whole dyke might have reached the surface as indicated by the light red region. The vents that remain open from day 2 are marked with red, solid arrows. Red dashed lines mark regions that fed vents for a few days only and generated no or weak tremor. Light, medium, and dark blue regions mark the array located tremor source regions. This is mainly at the margins of the lava flow field (Regime 2), shallow in the open vents (Regime 1), and potentially whilst new intrusions happened (Regime 3). Note that even on the first day tremor is preferably generated in the medium blue regions and that the dark blue tremor in Regime 3 appears red when it is located behind the planar dyke intrusion. Dark red arrows indicate the main feeding system in the lava flow field. The inset indicates the illustrated part of the lava flow field and vent area where the gray star marks the location of oblique superficial fractures (Ásta Rut Hjartardóttir, personal communication, 2016).

An alternative model might be flow in the conduit as favored by *Hibert et al.* [2015] when they found a correlation between extrusion rate and tremor energy but no correlation with the infrasonic signal. However, as there were no infrasonic recordings in early September when the tremor in Regime 1 dominated, we cannot comment on the applicability here.

5.2. Regime 2: Lava Flow Field Tremor Model

We summarize our observations in tremor Regime 2 in order to discuss sources related to the lava flow field:

1. The tremor amplitude increased when lava was in contact with water from the river Jökulsá á Fjöllum (see Figure 6a).
2. Although the lava flow field inflated and lava flowed in open or roofed channels, the tremor back azimuth (see Figure 6c) and slowness (see Figure 6d) correlated with the growing margins of the lava flow field (see Figure 3).
3. Tremor was very narrow banded, harmonic ($\Delta f = 0.1$ Hz), and strongest from 0.7 to 1.5 Hz (see Figure 4).

The observed correlations indicate that the tremor in Regime 2 was generated at the surface of the bedrock (Figure 8). As changes in height were less than 60 m at a distance of 15 km to 30 km from UR array, changes in slowness were mainly caused by horizontal changes in distance as visible in Figure 6d.

If the hot lava comes in sudden contact with cold water from the river, the water beneath the flow is converted into steam. This hydrothermal boiling is a viable tremor source as observed, for example, at Old Faithful Geyser [*Kedar et al.*, 1998]. However, at Old Faithful Geyser the associated tremor amplitude at 30 m distance was less than $2 \cdot 10^{-8}$ m/s. We therefore doubt that tremor from hydrothermal boiling could be recorded at more than 15 km distance.

Once the lava reaches the surface, it forms a lava flow field that is mainly cooled by the contact with air, water, and the ground. While lava is continuously fed into the lava flow field, it inflates until margins start to fail. This failure of newly formed viscoelastic crust creates repeated microcracks that might merge into low-frequency tremor. Tremor is generated on all surfaces of the lava flow field but, in contact with water the steam, can migrate up through cooling cracks and enhance the cooling of the lava flow, therefore allowing larger microearthquakes and stronger tremor from the sides. Rock deformation in the form of regularly repeating earthquakes was observed as a possible source of tremor in *Hotovec et al.* [2013] and *Eibl et al.* [2017].

During other eruptions the appearance of a lava flow was not seen to affect the tremor amplitude [Alparone, 2003]. Lava flows were also observed at times when no change in the tremor amplitude occurred [Langer *et al.*, 2011; Battaglia *et al.*, 2005a] or when tremor amplitude was low [Soosalu *et al.*, 2005]. Here we similarly observed no change in tremor amplitude at times when the array results suggest a change from vent-related to lava flow field-related tremor.

5.3. Regime 3: Dyke Intrusions

The dominating tremor source in Regime 3 showed two fast southward movements (see Figures 6c and 6d). This tremor source dominated over the tremor from the vents and lava flow field although the overall tremor amplitude increased only slightly. The slownesses indicate that these fast southward movements happened farther from UR array (slowness of 0.48–0.58 s/km) than the lava flow field-related tremor in the month before (0.55–0.60 s/km).

As this tremor source moved about 10 km southward in 4 days—much more than the extent of the lava flow field—we suggest that they might be related to processes in the subsurface such as further dyke formations (see Figure 8). A tremor source at depth can also easily explain lower associated slownesses as it creates more body waves than a superficial tremor source. However, it seems unlikely to us that a shallow tremor source would move downward. We therefore speculate that the tremor source moved laterally toward the southeast with a slight decrease in depth to explain the slowness pattern.

According to the back azimuths, the dykes originated at different locations: at depth north of Nordri and in the region below Sudri (see Figure 8). Oblique, curved, slightly widening faults, originating around Sudri trending toward the south, are visible up to 200 m south of the lava field about 1 km east of Sudri (Ásta Rut Hjartardóttir, personal communication, 2016, gray star in the inset of Figure 8). They might mark the location of these slightly deepening intrusions on the surface. It was observed that the seismic expression of shallow dyke intrusions at less than 2 km depth is tremor and need not necessarily generate high-frequency earthquakes [Eibl *et al.*, 2017]. However, InSAR data that could clearly detect deformation associated with the opening fissures on 31 August and 5 September do not show any sign of intrusions after September (Stéphanie Dumont, personal communication, 2016). Alternatively, this tremor could be unrelated to the volcanic activity.

5.4. Possible Applications of the Tremor Amplitude

In the past the tremor amplitude/energy was used to find a suitable tremor source model, to estimate the effusive rate [Battaglia *et al.*, 2005a; Hibert *et al.*, 2015], erupted volume [Battaglia *et al.*, 2005a; Hibert *et al.*, 2015], to track changes in the degassing regime [Coppola *et al.*, 2009] or to predict the explosivity index and amount of ash [McNutt, 1994; Bernard *et al.*, 2016].

Studies that found a correlation between the tremor energy and effusion rate [Hibert *et al.*, 2015; Battaglia *et al.*, 2005b] favored a tremor source representing flow of magma in the conduit. However, correlation of tremor amplitude and effusion rate [Coppola *et al.*, 2009; Koyanagi *et al.*, 1987] suggest that the degassing is the main tremor source (for underlying assumptions see Coppola *et al.* [2009]). Coppola *et al.* [2009] also suggested that a lack of correlation between effusion rate and tremor amplitude reflects a change in the degassing regime. They suggest that changes between fast and slow flow regimes can be tracked by comparing effusion rate derived from MODIS sensors with tremor amplitude.

The three tremor sources during the Holuhraun eruption were active at the same time with similar frequency and time domain properties and similar slownesses and back azimuth ranges. We might expect a correlation between the tremor amplitude/energy linked to the vents (Regime 1) with explosivity, effusion rate, or the eruptive volume as suggested above. However, we would not expect a correlation with the overall tremor amplitude due to the tremor generation at the margins of the lava flow field (Regime 2) and its dependence on contact with water. In our case we cannot interpret the lack of correlation between effusion rate and tremor amplitude as a change in degassing regime as in Coppola *et al.* [2009].

6. Conclusions

We observed 6 months of continuous eruptive tremor during a basaltic fissure eruption that started and ceased with the opening/closing of the vent. The eruptive tremor was harmonic, continuous, and strongest between 0.7 and 1.5 Hz with no frequency changes. We used it to pinpoint the eruption starts to 4:14 UTC on 31 August and 4:20 UTC on 5 September 2014. Additionally, we identified three eruptive tremor sources which is exceptional: (i) below open vents, (ii) at the margins of the growing lava flow field, and (iii) migrating

at less than 2 km depth beneath the surface. We speculate that the eruptive tremor was linked (i) to bubble generation, (ii) repeating microearthquakes, and (iii) to horizontal dyke formations. However, based on the spectral content of the three tremor sources, they cannot be separated.

We further note that even at the beginning of the eruption when a 1.9 km long fissure opened, the tremor focused in five regions where the vents formed later. This fast focusing from an elongated fissure to distinct vents was also visible in videos and photos of the lava fountaining.

Increases in tremor amplitude could be associated with different processes. Increases in vent-related tremor were associated with stronger lava fountaining activity and new opening vents. Increases in lava flow field-related tremor were associated with contact with water or snow. In order to get a first-order estimate of, for example, the effusion rate, only tremor sources related to the vents should be considered. However, our results suggest that if satellite data are not available (clouds, low repeat times), the region is not accessible, and the array is close enough, arrays can be used to monitor the growth of a lava flow field in addition to the activity in the vents.

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