# Dynamics of the Askja caldera July 2014 landslide, Iceland, from seismic signal analysis: precursor, motion and aftermath

Anne Schöpa<sup>1</sup>, Wei-An Chao<sup>2</sup>, Bradley Lipovsky<sup>3</sup>, Niels Hovius<sup>1,4</sup>, Robert S. White<sup>5</sup>, Robert G. Green<sup>5,1</sup>, Jens M. Turowski<sup>1</sup>

Helmholtz Centre Potsdam GFZ German Research Centre for Geosciences, 14473 Potsdam, Germany

Department of Civil Engineering, National Chiao Tung University, Hsinchu 30010, Taiwan

Department of Earth and Planetary Sciences, Harvard University, Cambridge, MA 02138, USA

Institute of Earth and Environmental Science, University of Potsdam, 14476 Potsdam, Germany

Department of Earth Sciences, University of Cambridge, Cambridge CB3 0EZ, UK

Correspondence to: Anne Schöpa (schoepa@gfz-potsdam.de)

Abstract, Landslide hazard motivates the need for a deeper understanding of the events that occur before, during and after catastrophic slope failures. Due to the destructive nature of such events, in situ observation is often difficult or impossible. Here, we use data from a network of 58 seismic stations to characterise a large landslide at the Askja caldera, Iceland, on 21 July 2014, Excellent data quality and network coverage allow us to analyse both long- and short-period signals associated with the landslide, and thereby obtain information about its triggering, initiation, timing and propagation, At long periods, a landslide force history inversion shows that the Askja landslide was a single, large event starting at the SE corner of the caldera lake that occurred at 23:24:05 UTC and propagated to the NW in the following 2 min. The bulk sliding mass was 7- $16 \times 10^{10}$  kg, equivalent to a collapsed volume of  $35-80 \times 10^6$  m $^3$ . The centre of mass was displaced downslope by  $1260 \pm 250$ m, At short periods, seismic tremor was observed for 30 minutes before the Jandslide, The tremor is harmonic, with a fundamental frequency of 2.5 Hz and shows time-dependent changes of its frequency content. We attribute the seismic tremor to stick-slip motion along the landslide failure plane. Accelerating motion leading up to the landslide culminated in an aseismic quiescent period for two minutes before the landslide, We propose that precursory stick-slip, manifest either as seismic tremor or as individual events, might be developed as a landslide early-warning system. The 8 hours after the main landslide failure are characterised by smaller slope failures originating from the destabilised caldera wall decaying in frequency and magnitude. We introduce the term afterslides for this subsequent, declining slope activity after a large landslide.

## 1 Introduction

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Volcanic edifices are prone to landsliding because of their usually steep topography, fresh, unconsolidated deposits, and high seismic, volcanic and hydrothermal activity, and the associated surface deformation. Tsunami-creating landslides at volcanic edifices have Jed to the destruction of infrastructure and high numbers of fatalities. For example, the 1792 Unzen Mayu-

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Yama, Japan, landslide and the resulting tsunami killed more than 15,000 people in the Shimabara Bay (Sassa et al., 2016) and the eruption of Mt. St. Helens on 18 May 1980 initiated a 2.3×10<sup>9</sup> m<sup>3</sup> landslide that ran into Spirit Lake and caused a 260-m-high wave deforesting adjoining slopes (Voight et al., 1981). Seismic networks are often installed around volcanoes for monitoring of magmatic processes and eruption forecasting. Their seismic records can also hold valuable information about landslide events occurring on the edifice.

Seismic signals of landslides are a powerful tool to reconstruct the dynamics of the slope failure including source mechanisms, the failure sequence together with precursory activity, and landslide properties (Brodsky et al., 2003; Favreau et al., 2010; Schneider et al., 2010; Moretti et al., 2012; Allstadt, 2013; Yamada et al., 2013). Long-period seismic signals of landslides from stations several thousand kilometres away can be used as references for inversions (Allstadt, 2013; Ekström and Stark, 2013; Yamada et al., 2013; Hibert et al., 2015; Chao et al., 2016) or models (Brodsky et al., 2003; Favreau et al., 2010; Schneider et al., 2010; Moretti et al., 2012) to constrain the location, mass, duration, displacement, and run-out trajectories of the landslide. Short-period waves, generated by the momentum exchanges within a granular landslide mass and along its boundaries, have been used to study the detachment, moving and reposing phases of landslides (Norris, 1994; Suriñach et al., 2005; Dammeier et al., 2011; Hibert et al., 2011, 2014; Deparis et al., 2008; Vilajosana et al., 2008). Seismic records can also give valuable information about triggers and precursors of slope failures (Amitrano et al., 2005; Caplan-Auerbach and Huggel, 2007; Senfaute et al., 2009; Got et al., 2010; Helmstetter and Garambois, 2010; Dietze et al., 2017). Repeated small earthquakes indicative of stick-slip movement on a small patch were observed before a landslide failed within shale and tuff layers in Rausu, Japan (Yamada et al., 2016). Individual cracking events that occur more frequently in time closer to the main failure were identified at a station 200 m away from the steep, bedrock source area of a  $10^4$  m<sup>3</sup> landslide in the Illgraben, Switzerland (Zeckra et al., 2015). However, the localisation and characterisation of seismic tremor before mass wasting events is often limited by a sparse seismic station coverage, preventing a detailed analysis of the underlying source mechanisms

In this study, we present seismic data from the 2014 Askja landslide. As the landslide was located in the centre of a temporary local network of 58 seismic stations the spatial coverage is exceptionally good and the signal-to-noise ratio of most stations is very high due to their remote locations far away from roads or other places of human activity. The excellent seismic data quality allows for a detailed reconstruction of the landslide dynamics based on the combined analysis of records from stations within a few kilometres of the landslide and at distances of up to 100 km. A force history inversion of the long-period signals of the landslide from distant seismic stations of the network is used to infer its timing, propagation direction, mass and vertical and horizontal displacement. The short-period signals of nearby stations are included in a comprehensive interpretation of the landslide dynamics. These signals also contain information about the processes occurring before and after the catastrophic slope failure. We identified a tremor signal in the seismic data of 38 stations located up to 30 km away from the landslide source area. We attribute the tremor and its time-dependent frequency changes to evolving stick-slip motion along sliding patches at the base of the landslide in the run up to catastrophic failure. After the catastrophic failure of

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Deleted: Continuous tremor was also described before ice-rock avalanches (Caplan-Auerbach et al., 2004; Huggel et al., 2008), during ice-sheet and glacial sliding (Lipovsky and Dunham, 2016), and iceberg collisions (MacAyeal et al., 2008; Martin et al., 2010).

the landslide, the seismic stations a few kilometres from the landslide source area recorded smaller slope failures. These smaller rockfalls and slides initiated from the destabilised section of the caldera wall where the large landslide originated from

# 2 The Askja landslide and its failure preconditions

5 In the following, we first report on the Askja landslide and introduce the reader to the Askja area before we describe the factors that made the landslide source area prone to slope failure. We then focus on the seismic dataset and use it to characterise the landslide and the precursory tremor.

In the late evening of 21 July 2014, a steam cloud was seen rising over the Askja central volcano in the Icelandic highlands (Helgason et al., 2014). Field investigations on the following days revealed that a voluminous landslide must have occurred during the night, originating from the southeastern shore of the Askja caldera lake Öskjuvatn, where steep scars and fresh, mobilised material could be seen (Vogfjörd et al., 2015). Parts of the landslide material must have entered the lake and created tsunami waves as flood marks up to 60-80 m above the lake level were found at the shorelines (Gylfadóttir et al., 2017). The flood marks implied that up to ten individual waves inundated the shore and also went into the 200 m wide Víti crater, a popular tourist spot on the northeastern side of the lake. Analysis of the seismic record of the permanent stations of the Icelandic Meteorological Institute showed that the landslide occurred at 23:24 UTC, equivalent to local time (Saemundsson et al., 2015). This timing meant that no eyewitnesses were present. Geodetic surveys estimated the landslide volume to be 12–50×10<sup>6</sup> m³ and that about 10×10<sup>6</sup> m³ entered the caldera lake creating the tsunami waves (Gylfadóttir et al., 2017).

Several factors made the site at the southeastern corner of Lake Öskjuvatn prone to slope failures. These factors are: (i) the geological structures of a young collapse caldera with steeply dipping caldera ring faults; (ii) the geothermal system in this corner of the lake with hydrothermally altered volcanic rocks at the surface and earthquakes at 2\_4 km b.s.l.; and (iii) the weather conditions in summer 2014 with sustained high temperatures and high precipitation during the days before the landslide. We describe these failure preconditions below.

## 2.1 Geological setting

25 The Askja volcanic system is located in the Northern Volcanic Zone of Iceland and consists of a prominent central volcano and an associated fissure swarm. The shape of the Askja central volcano is dominated by nested calderas (inset of Fig. 1). The 7–9 km wide outer caldera (Askja caldera) developed in the early Holocene, and the 3–5 km wide inner caldera (Öskjuvatn caldera) with the lake Öskjuvatn gradually subsided in the 40 years following a rifting event in 1874–1876 (Acocella et al., 2015). The ring faults of the inner caldera dissect Pleistocene glaciovolcanic deposits of the Austurfjöll and the Thorvaldsfjäll mountains at the eastern and southern margin of Lake Öskjuvatn (inset of Fig. 1). There, the steep relief of up to 350 m is dominated by nearly vertically dipping fault surfaces of the cliffs and talus cones (Sigvaldason, 2002). The

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caldera ring faults were the location of minor effusive eruptions in the 20<sup>th</sup> century, that formed, among others, the lavas Suðurbotnahraun, where the landslide originated, and Kvíslahraun in the southeastern corner of the lake in 1922/23 (Hartley and Thordarson, 2012). The last eruptive activity at Askja occurred in 1961 when the Vikrahraun lava flowed out of a fissure at the northern rim of the Holocene Askja caldera (Thorarinsson and Sigvaldason, 1962). During the last decades, continuous subsidence has dominated the Askja caldera (Einarsson, 1991; de Zeeuw-van Dalfsen et al., 2013), associated with contraction of an inferred shallow magma body, and the large-scale rifting of Iceland at a rate of 18.2 mm yr<sup>-1</sup> and an azimuth direction of 106° (DeMets et al., 1994). Nevertheless, fumarolic activity persists at the northern lakeshore in the vicinity of the Viti crater, and at the eastern and southern corner of the lake.

#### 2.2 Seismicity

In the region of the Askja volcanic system, earthquakes occur at two levels in the crust, as shallow crustal seismicity between the surface and mostly 5 km depth, and as deep seismicity in the ductile lower crust at depths of 10–35 km, with magnitudes of usually M<sub>1x≤3</sub> (Jakobsdóttir et al., 2002; Soosalu et al., 2010; Greenfield et al., 2015).

The deep crustal earthquakes are located in distinct regions, (Fig. 1), beneath Kollóttadyngja shield volcano to the north, beneath the hyaloclastite mountain Upptyppingar to the east, location of a dyke intrusion in 2007–2008 (Jakobsdóttir et al., 2008; White et al., 2011), at the northern part of the shield volcano Vaŏalda, and beneath Askja volcano, attributed to melt migration in the lower crust (Soosalu et al., 2010; Key et al., 2011; Greenfield and White, 2015).

Shallow earthquakes cluster in the regions (Fig. 1) around the table mountain Herðubreið, assigned to the differential motion of the Askja and the Kverfjöll rift segments accommodated by bookshelf faulting (Green et al., 2014) and at the southeastern corner of the caldera lake Öskjuvatn, a region of high geothermal activity, the source location of the landslide. This cluster at Öskjuvatn has been seen in seismic data since 1975 (Einarsson, 1991; Jakobsdóttir, 2008; Greenfield and White, 2015) and was hypothesised to be caused by hydrothermal circulation above a shallow magma body (Soosalu et al., 2010) or by thermal cracking and heat extraction in the crust (Einarsson, 1991).

Relocation of 86 earthquakes in this southeastern hydrothermal area at lake Öskjuvatn showed that the events are concentrated at depths between 2–4 km b.s.l. (Greenfield et al., in press). Furthermore, this study showed that the earthquakes were located along a line of 2 km length stretching from the fumarolic vents, i.e. the northern edge of the landslide source area, to the northwest. During the observation period of this study from 2009 to 2015, the earthquakes were randomly distributed in space and at depth with no clear trend over time, and the focal mechanisms did not show a distinct pattern in the years before the landslide.

# 2.3 Meteorology

30 The highlands of Iceland have a subarctic climate with short, cool summers and long, cold winters. In the Askja area, mean January temperatures are around -8°C and mean July temperatures are usually around 6°C (Einarsson, 1984). The

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Vatnajökull icecap shields the central highlands from moisture coming from the southeast and precipitation rates of 600 mm yr<sup>-1</sup> are relatively low compared to the Icelandic coast (Einarsson, 1984). In winter, most precipitation falls as snow and extensive patches of snow usually last well into the summer months at the Askja central volcano. This was also the case in July 2014 (Helgason et al., 2014).

The area around the Askja central volcano experienced a period of warm weather in the middle of July 2014, with average daily temperatures between 8–11°C and maximum daily temperatures between 12–15°C (Fig. 2). The day of the landslide, 21 July, was one of the warmest of 2014 in the Icelandic highlands with temperatures around 22°C. The fair-weather period in mid-July 2014 was relatively dry but weather station Kárahnjúkar, 43 km east of Askja, recorded 9.3 mm of precipitation on 19 July and 8.7 mm on 20 July (Fig. 2). On the day of the landslide, the station recorded minor precipitation events with a total of 0.5 mm in the morning and over mid-day. These meteorological conditions with warm and wet weather in the days before the landslide increased the availability of water, due to snow melt promoted by high temperatures and rain on snow, which may have resulted in enhanced infiltration into the landslide body. This was facilitated by numerous cracks that had developed on top of the landslide mass a year before the failure (Fig. 3). Higher water content increases the pore pressure and, in turn, lowers the critical stress necessary to initiate slope failures (Iverson et al., 1997; Gaucher et al., 2015).

# 5 3 Seismic signal analysis

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A network of 58 seismic stations was in place in the Icelandic highlands clustering around the Askja volcanic system from 2009 to 2015, to investigate the crustal structure and magma migration beneath the Askja central volcano. The stations were equipped with broadband to semi-broadband seismometers of the type Güralp CMG-6TD (30 s – 100 Hz), CMG-ESPCD (60 s – 100 Hz), and CMG-3T (120 s – 100 Hz) with Nanometrics Taurus data loggers, recording at 100 Hz sampling frequency. Based on data availability, the records of 52 stations were used in this study.

Coalescence Microseismic Mapping, CMM, was used to automatically detect, locate and classify crustal earthquakes in the Askja region (Drew et al., 2013). Between 21 June and 16 August 2014, twelve events with local magnitudes  $M_L < 2$  were on average detected per day by the whole network. In the days before the landslide, the crustal seismicity was within the background rate and on the day of the landslide the only event occurring within the Askja caldera was a  $M_{L_p} = 0.5$  earthquake at 11 km depth, 1.5 km NE of the landslide source area at 15:15:19  $UTC_{\nu}$  (Fig. S1). Earthquakes occurring close to the surface and down to 5 km depth clustered in the southeastern corner of the Askja caldera beneath the landslide source area during the weeks before and after the landslide, with about two events per day (Figs. S1 and S2).

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## 3.1 High frequency seismic data analysis

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To investigate the characteristics of the seismic signal of the landslide, we removed the instrument response, the mean and the trend, and band-pass filtered the signal between 1-45 Hz. We also computed spectrograms from the deconvolved vertical components of the seismic signals with time windows of 1.1 and 1.5 s and overlaps of 90%.

The high-amplitude short-period signals generated by the Askja landslide can be seen in the data of all stations of the network up to a distance of 110 km (station SKAF, south of Vatnajökull glacier). The seismic signal onset at the closest station MOFO, 3.5 km southeast of the landslide source area, was recorded at 23:24:05 UTC (Fig. 4) and started with a smooth increase in seismic ground velocities in the first 45 s. Amplitudes peaked 45 s and again 75 s after the first wave arrival with ground velocities of up to 80 µm s<sup>-1</sup> (Fig. 5d). Given that the amplitudes were generally higher for the horizontal components of the signal we attribute the signal to surface waves. The short-period signal lasted for about 130 s and the waveform has a symmetric, cigar-like shape. These characteristics of an emergent onset without clear *P* and *S* wave arrivals and no distinct peak amplitudes in the frequency bands >1 Hz are characteristic of seismic signals generated by gravitational instabilities (Suriñach et al., 2005; Deparis et al., 2008; Dammeier et al., 2011; Burtin et al., 2013).

The spectrogram of station MOFO reveals that most energy was released within the first 2 minutes of the landslide until 23:26:00 UTC, with the frequencies between 1–4 Hz containing the largest part of the seismic energy. The spectrogram of the landslide has a triangular shape where the higher frequencies decrease more rapidly in energy over time (Fig. 4). This shape is common for landslides (Bottelin et al., 2014, Dammeier et al., 2015) and has been related to greater ground attenuation of higher frequencies and/or material entrainment during the propagation of the mass movement (Aki, 1980; Surinach et al., 2005, Dammeier et al., 2011). After these 2 minutes of persistent high seismic amplitudes and energies between 1–15 Hz, amplitudes and energies decayed rapidly in the subsequent 4 minutes, followed by 10 minutes during which seismic amplitudes decreased less rapidly. Approximately 40 minutes after the end of the high amplitude signals, the background noise level was re-established.

## 3.2 Landslide force history inversion of long-period signals

Long-period seismic waves radiated by landslides result from the cycle of unloading and reloading of the solid Earth (Fukao, 1995, Takei and Kumazawa, 1994). This broad loading cycle is produced by the bulk acceleration and deceleration of the landslide mass (Okal, 1990). Long-period seismic signals (12.5–50 s, corresponding to frequencies of 0.02–0.08 Hz) were recorded for the Askja landslide at all stations of the network (station furthest away is LAUF, at 130 km distance, located SW of Vatnajökull glacier). As for the short-period signals, the long-period waves first arrived at station MOFO at 23:24:05 UTC and lasted for approximately 130 s. The onset of these long-period waves coincided with the arrival of the short-period waves.

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## Method

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Following the method developed by Ekström and Stark (2013) and Chao et al. (2016), we performed an inversion of the long-period landslide signals between 0.02<sub>e</sub>—0.08 Hz, fitting synthetic waveforms to the data<sub>e</sub>(Fig. S3). This frequency range is suitable for the inversion as higher frequencies would be affected by local-scale structures and inaccuracies in the velocity model, and lower frequencies have insufficient signal-to-noise ratios. We tested frequency ranges of 0.02–0.05 Hz, 0.02–0.08 Hz and 0.04–0.08 Hz to analyse the sensitivity of the inversion to the chosen frequency range. For the inversion, we used the 1-D velocity model for the Askja region developed by Mitchell et al. (2013) and the record of eleven broadband stations of the seismic network<sub>e</sub> We selected those stations because their data has high signal-to-noise-ratio and they were equipped with CMG-ESPCDs or CMG-3Ts<sub>e</sub> capable of recording frequencies between 0.0167<sub>e</sub>—100 Hz, low enough for the Jong-period landslide signals. For the synthetic waveforms, we used a signal length of 130 s corresponding to the length of the recorded long-period signals.

## Results of the landslide force history inversion

The results of the inversion give the magnitudes, the velocities and the displacements for the north, east and upwards components of the forces acting on the Earth (Fig. 5 a, b, c). They show that the unloading forces due to the accelerating mass of the landslide are oriented towards the SE<sub>v</sub>(red arrows in Fig. 5d). In turn, the reloading forces due to the decelerating and depositing mass of the landslide strike to the NW<sub>v</sub>(blue arrows in Fig. 5d). These directions are in agreement with the NW-directed propagation path of the landslide that we inferred from direct field observations of the landslide source and deposition area in August 2015. The inversion also gives the location history of the centre of the landslide mass (Fig. 5e) moving to the NW in about 130 sec. From the inversion, we obtained a total horizontal displacement of 1260±250 m and a vertical displacement of 430±300 m for the centre of the landslide mass.

The inversion results give a maximum force of 3.219x10<sup>10</sup> N and 7–16×10<sup>10</sup> kg of mobilised mass and the potential energy released during this landslide is estimated to be 8.2–51.5×10<sup>13</sup> J. Assuming an average density of 2000 kg m<sup>-3</sup>, representative of typical values for highly fractured and hydrothermally altered Pleistocene hyaloclastites and Holocene basaltic lava flows (Moore 2001), the collapsed volume was 35–80×10<sup>6</sup> m<sup>3</sup>. This is in the range of values estimated from field observations and bathymetric surveys of the lake, giving 12–50×10<sup>6</sup> m<sup>3</sup> for the landslide volume (Hoskuldsson et al., 2015; Saemundsson et al., 2015; Gylfadóttir et al., 2017). Sonar investigations detected the deposits of the landslide in the lake as far as 2000 m away from the entry point of the material into the water (Hoskuldsson et al., 2015) and a calculation of the landslide volume deposited in the lake based on the rise of the water level is 10×10<sup>6</sup> m<sup>3</sup> (Gylfadóttir et al., 2017). This is less than half the total landslide volume, consistent with our finding that the centre of mass came to rest almost at the lakeshore (Fig. 5a).

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## 4 Tremor

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Seismograms recorded 30 minutes before the high-energy landslide (~22:55 UTC) show gradually increasing amplitudes in the 1–45 Hz band. This amplitude increase is visible on stations up to 30 km away from the landslide area. For the nearest station MOFO, the seismic amplitudes were up to three times higher than the background 7 minutes before the onset of the high-energy landslide signal (23:17 UTC, Fig. S6). This amplitude increase was followed by an amplitude drop to values slightly below the background 2 minutes before the onset of the landslide signal (Fig. 6). We refer to this signal as seismic tremor. Here, we use the term seismic tremor to refer to any emergent, long duration seismic signal that lacks clear body wave arrivals (McNutt, 1992; Beroza and Ide, 2001), rather than to describe the source process responsible for generating seismic waves.

The observed seismic tremor has energy that is contained in spectral peaks centred at 2.5, 5, and 7.5 Hz. Tremor with a sharply peaked spectra consisting of a fundamental frequency with overtones is called harmonic tremor; harmonic tremor that gradually evolves in time is said to be gliding (McNutt, 2005). A particularly eye-catching aspect of the Askja tremor is the occurrence of up-gliding and down-gliding, followed by a quiet period, 2 minutes before the high-energy signals of the main landslide can be seen in the seismic data (Fig. 6). Specifically, at about 23:14 UTC, the spectral content of the tremor started to change and both up and down gliding frequency bands can be observed simultaneously (Fig. 6a). Tremor amplitudes are higher for the horizontal components than for the vertical component, as it is the case for the landslide signal. In contrast to the signal of the landslide that also contains long-period seismic waves, the tremor is confined to frequencies above 1 Hz. Concurrent with the amplitude drop, the gliding spectral lines stopped at about 23:22 UTC and a period of 2 minutes of quiescence can be seen in the spectrograms before the high-energy signal of the landslide starts.

# 4.1 Tremor Jocation

For a rough estimation of the tremor location and to check whether it is not only temporally but also spatially correlated with the landslide, we computed the amplitude ratio of prince of the tremor starting at 23:17:00 UTC, 21 July 2014, to 3 minutes of background seismic noise starting at 00:10:00 UTC of the same day for the components of all stations of the network. The amplitude ratio is highest at the stations closest to the source area of the landslide and decays the further away the station is located from Lake Öskjuvatn (Fig. S6). However, we note that this decay has an elliptical outline with a long axis oriented NE-SW, parallel to the orientation of the general structural trends at the Askja volcanic system, which are probably responsible for seismic wave attenuation effects.

To further refine the location of the tremor, we used the procedure of Burtin et al. (2013) to locate the tremor signal on a DEM grid. This statistical approach assigns a probability of being the source of the signal to each grid point based on cross-correlation of the waveforms at different stations. The resulting probability density function is normalised to its maximum value giving this grid point a likelihood of 1 to be the source location of the signal (Burtin et al., 2014). We used 21 stations

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for the location that showed the gliding spectral lines in the spectrograms and a DEM with a grid spacing of  $100 \times 100$  m. We used a frequency range of 1.5-3 Hz as this frequency band shows the highest tremor energy and time windows of 1 minute starting at 22.54.00 UTC. With this location method, we found that the tremor signal most likely located at the southeastern shore of the caldera lake, where fumaroles are the surface expression of the hydrothermal system (Fig.  $\sqrt{2}a$ ). This is the northern corner of the landslide source area. Over 30 minutes before the landslide, the likely tremor location only changed of the order of a few  $100 \text{ m}_e$  We tested the influence of the seismic wave velocity on the results by varying this parameter in the Jocation routine between 500 and  $3700 \text{ m s}^{-1}$ . The best-fit locations for the different wave velocities differ up to 500 m from each other but remain at the southeastern lakeshore.

## 4.2 Numerical simulations of seismic tremor

## Method

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To investigate further the seismic tremor observed before the Askja landslide, we conduct numerical simulations of stick-slip motion and elastic wave propagation. Our approach calculates the force balance between elastic stresses, including elastic wave propagation, and an interfacial strength set by rate-and-state friction. More details about these simulations are given by Lipovsky and Dunham (2016).

The aseismic-seismic transition is a central feature of sliding under rate-and-state friction (Rice et al., 2001). This transition is commonly expressed as a critical patch size  $R_c$ , defined such that \_with all other parameters held constant\_ a given interface will experience stick-slip oscillations if  $R \ge R_c$ , with  $R_c$  defined as

$$R_{\mathcal{C}} = \frac{d_{\mathcal{C}}G}{(b-a)\sigma - \eta \, v_0} \tag{1}$$

In this expression,  $\sigma$  is the effective normal stress, G is the shear modulus,  $d_C$  is the frictional state evolution distance, a is the magnitude of transient peak strengthening during step loading, b is the magnitude of strength change between peak strength and steady state,  $\eta = \rho c_s$  is the shear wave impedance with density  $\rho$  and shear wave speed  $c_s$ , and  $v_\theta$  is the nominal loading velocity. The parameter (b-a) must be positive for stick-slip cycles to occur; an interface with this property is called rate weakening. Frictional parameters are taken from laboratory experiments (Marone, 1998) and we use typical values for crustal rocks (Table 1). The interface normal stress must be prescribed, and for this value we use an overburden stress calculated from a landslide thickness of 30 m, consistent with previous work (Gylfadóttir et al., 2017).

Under rate-and-state friction, a change in the repeat time T of the stick-slip events may occur for a number of reasons. Near the transition between steady and stick-slip sliding, T scales approximately as

$$\frac{T}{\sqrt{c}} = \frac{R}{R_C} \tag{2}$$

where  $T_c$  is the lowest achievable repeat time (Lipovsky and Dunham, 2017).

$$T_c = 2\pi \sqrt{\frac{a}{|a-b|} \frac{d_c}{v_0}} \tag{3}.$$

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## Results of the tremor simulations

By matching synthetic and observed seismograms, we are able to explain two prominent observations (Fig. 8). First, we find that the gliding of the spectral tremor lines can be produced by stick-slip earthquakes occurring with changing frequency. Second, we reproduce the aseismic period immediately before the main landslide failure. As both up- and down-gliding spectral lines occur simultaneously in the Askia dataset, we infer that more than one source was active at the same time, each producing tremor. Hence, we use two simulations.

In the first simulation, by increasing the initial loading velocity  $v_{\underline{0}} = 0.6 \text{ mm s}^{-1}$  by 0.01 (mm s<sup>-1</sup>) min<sup>-1</sup> (see Tab. 1 for the simulation parameters), the repeat time T between the stick-slip events decreases and the synthetic spectrogram shows upgliding spectral lines with a fundamental frequency of 2.5 Hz and overtones of 5 Hz and 7.5 Hz (Fig. 8c). The spectral lines contain less energy with time and fade at 13 minutes.

In the second simulation, the repeat time T between the stick-slip events increases with time and downward spectral gliding can be seen in the synthetic spectrograms. The increase in T can be achieved by a deceleration in loading velocity or by an expanding stick-slip region. We elaborate on these possibilities in the Discussion section. Here, we report that simulations with a patch radius of R = 30 m that grows by  $10 \text{ mm s}^{-1}$  show spectral lines starting at frequencies of 4 Hz, 8 Hz and 12 Hz and gliding down to frequencies of 3 Hz, 6 Hz and 9 Hz before abruptly disappearing at 12 minutes (Fig. 8d).

Although the stick-slip simulations can reproduce the fundamental frequency and some overtones of the observed tremor we acknowledge that some overtones of the simulations are not clearly visible in the data. The overtone labelled with number two (Fig. 8b and c) is less strongly observed than others, for example. We believe that the simplest explanation for this is that our simplified model of wave propagation fails to account for certain propagation phenomena that may diminish wave amplitudes. Wave propagation in the complicated, 3D, layered, attenuating media surrounding the Askja volcanic complex is far richer than we have attempted to capture.

We calculated the stress drop in each small, repeating stick-slip event as

$$\Delta \tau = \alpha G \frac{u}{R}$$
 (5)

where  $\alpha$  is a geometrical constant usually taken to be 7/16  $\pi$  ~1.37, and u is the slip in each event. With the parameters of our best-fit model, u=0.24 mm, R=30 m, and G=7 GPa, we calculated a stress drop of 56.2 kPa. The scalar moment is  $M_0=8.4\times10^9$  Nm, which is equivalent to a moment magnitude  $M_{w_0}=0.58$ . This is comparable to the moment magnitudes of most of the earthquakes recorded in the hydrothermal system below the southeastern lake shore at Öskjuvatn that are usually smaller than  $M_L \sim 1$  (Greenfield et al., in press).

# 5 Afterslides

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During 8 hours after the main landslide, several other high-amplitude short-period signals of much lower amplitude were recorded (for example, at 23:41:10 UTC, Fig. 4). Their waveforms are spindle-shaped with dominant frequencies of about 1—

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2 Hz. The signals are only visible at frequencies >1 Hz and a force history inversion of low-frequency signals is not possible. These events lasted between a few seconds and a minute and have characteristics such as emergent onsets, slowly decaying tails, and triangularly shaped spectrograms that have been described elsewhere from slope failures (Norris, 1994; Dammeier et al., 2011; Burtin et al., 2013; Chen et al., 2013). We attribute these signals to smaller slope failures that occurred after the main landslide. Following the nomenclature for earthquakes with the main shock and subsequent, smaller aftershocks happening in the same area, we here introduce the term afterslides for smaller mass movements occurring after a large landslide on the same landslide scar.

We used the same <u>Jocation method</u> of Burtin et al. (2013) that we applied for the tremor localisation to locate the seismic signals of the afterslides on a DEM grid. Their locations cluster at the destabilised walls from which the main landslide originated (Fig. 9b). The afterslides <u>become</u> less and less frequent and smaller in amplitude during the 8 hours following the main landslide (Fig. 9a).

### 6 Discussion

## 6.1 Dynamics of the landslide sequence from high- and low-frequency signals

Combining seismic data analysis and field observations reported in the literature and made during a field campaign in August 2015, we are able to summarise the factors that lead to the landslide and describe the precursory tremor, the landslide and the subsequent rock falls in detail.

Crack opening started years before the landslide at the head wall of the slide as documented in pictures taken from 2011 onward (Helgason et al., 2014). The warm weather with a number of precipitation events in July 2014 further promoted this crack opening by bringing moisture to the Askja caldera and increasing the snowmelt, both giving rise to higher pore pressure. On 21 July 2014, at about 22:55 UTC, that is half an hour before the main failure, a complex harmonic tremor signal with a fundamental frequency of 2.5 Hz and several overtones, emerged from the background noise in the seismic data, which we interpret as the start of the slow downslope movement of the landslide mass. The spectral lines of the tremor signal change their frequency content during an 8 minutes period starting at 23:14 UTC. Synchronous up- and down-gliding of the frequency bands could indicate that several sliding planes at the base of the landslide experienced stick-slip motion at the same time. As the waveforms of the stick-slip earthquakes have to be similar for their merged signal to be visible as harmonic tremor with overtones we envisage that this happens because the moving patches gradually slide over asperities at their base.

The stick-slip sliding accelerated to an aseismic, stable sliding period, 2 minutes before the bulk landslide mass failed catastrophically. Based on combined inspection of the high- and low-frequency signals generated by the Askja landslide, we distinguish three phases of landslide motion: initiation, propagation and termination (Hibert et al., 2014; Chao et al., 2016). The initiation phase of the landslide started immediately before surface waves arrived at about 23:24:05 UTC at the nearest station. The landslide force history inversion shows a sharp increase in the accelerating force during the first 30 sec of the

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landslide signal generated by the onset of motion of the landslide's bulk mass. The high-frequency signals show an emergent onset during these first 30 sec. They reach maximum amplitudes about 45 sec after the signal onset, which coincides with lower acceleration and the transition to decelerated motion in the force history inversion of the propagation phase. We infer from this lag time in the high-frequency signal that the main slope failure along the southeastern caldera wall was a single, large event, starting with aseismic sliding of a relatively coherent mass that gradually fragmented during down-slope acceleration (Allstadt, 2013; Hibert et al., 2015). In this interpretation, the high-frequency signals are caused by the momentum exchanges of block impacts, and frictional processes within the moving slide and along its boundaries, especially when the moving mass traverses small-scale topographic features on the sliding base (cf. Dammeier et al., 2011; Allstadt, 2013). These multiple sources, along with the diversity of propagating waves, are responsible for the multiple amplitude pulses and the lack of a clear maximum of the seismic amplitudes in the higher frequencies (Deparis et al., 2008; Dammeier et al., 2011). The deceleration phase of the landslide force history inversion lasts for about 70 sec, a period during which the high-frequency amplitudes also gradually decline. This termination phase of the landslide is associated with material deposition at the shore but also into Lake Öskjuvatn.

From the landslide force history inversion, we calculate that about  $30-80\times10^6$  m<sup>3</sup> of hyaloclastitic material was involved in the slide and about  $10\times10^6$  m<sup>3</sup> entered Lake Öskjuvatn creating a tsunami (Gylfadóttir et al., 2017). As a result of the removal of overlying mass, the hydrothermal system below the landslide source area was depressurised and a steam cloud rose above the caldera (Helgason et al., 2014).

During the 8 hours after the main landslide, subsequent small slope failures occurred at the destabilised caldera walls. The rolling, jumping, colliding and impacting blocks created seismic signals with emergent onsets, spindle-shaped envelopes (Dammeier et al., 2011; Allstadt, 2013; Hibert et al., 2015; Moretti et al., 2015) and with higher seismic amplitudes than the background level at the stations closest to the Askja caldera. Such a chain-reaction with subsequent slope collapses is not uncommon after landslides (Iverson et al., 2015). Similar to earthquakes and their aftershocks that occur less frequently and with smaller amplitudes with time after the main shock (Omori, 1894, Gutenberg and Richter, 1956), we observe a decay in the size and frequency of the afterslides.

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# 6.2 Source process of the seismic tremor

Seismic tremor has been observed in a variety of settings including in tectonic subduction zones, volcanoes, subsurface reservoirs, glaciers, ice sheets, and landslides. Reflecting these diverse settings, an equally diverse collection of physical processes may explain the source process responsible for creating seismic tremor. Possible sources of seismic tremor include: (i) fluid-flow-induced oscillations of conduit or fracture walls (Julian, 1994; Hellweg, 2000; Rust et al., 2008; Matoza et al., 2010; Corona-Romero et al., 2012; Dunham and Ogden, 2012; Unglert and Jellinek 2015); (ii) resonance of fluid-filled cracks or pipes with open or closed ends (Chouet, 1985, 1986, 1988; Benoit and McNutt, 1997; Jousset et al.,

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2003; Neuberg, 2006; Jellinek and Bercovici, 2011; Röösli et al., 2014; Sturton and Walter et al., 2015; Lipovsky and Dunham, 2015); (iii) bubble growth or collapse due to hydrothermal boiling of groundwater (Leet, 1988; Kedar et al., 1998; Cannata et al., 2010); and (iv) continuously repeating processes such as stick-slip motion (Neuberg, 2000; Powell and Neuberg, 2003; Dmitrieva et al., 2013; Hotovec et al., 2013; Lipovsky and Dunham, 2016; see also reviews by McNutt, 1992 and Konstantinou and Schlindwein, 2003). We note that the first three of these processes are hydraulic in origin.

Mechanical analyses of hydraulic sources for seismic tremor showed that fluid-flow instabilities producing wall oscillations (Julian, 1994) require flow speeds on the order of the speed of sound (Dunham and Ogden, 2012), thus suggesting that the applicability of these physics is limited to situations such as high velocity volcanic jets. As the Askja landslide was not associated with any volcanic activity that would support this mechanical model of tremor generation through hydraulic processes, we conclude that a hydraulic source is unlikely to explain the phenomena observed at Askja.

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Several additional lines of reasoning support the interpretation of tremor as being due to small, repeating earthquakes along the landslide failure plane. Small, repeating earthquakes have been observed as precursors to other landslides (Yamada et al., 2016; Poli, 2017), although in these cases individual stick-slip events could be distinguished. In the case studied by Yamada et al. (2016), however, the source-to-station distance was <1 km whereas our closest station is 3.5 km from the landslide source area. Thus, we argue that individual stick-slip events before the Askja landslide may not have been detectable kilometres away and that the events must occur very close in time and transmit enough energy that they can be detected from a longer distance as a continuous tremor signal. We further note that stick-slip motion has previously been proposed to cause seismic tremor on the sliding planes of sudden surface mass movements including ice-rock avalanches (Caplan-Auerbach et al., 2004, Huggel et al., 2008) and during glacier sliding (Caplan-Auerbach and Huggel, 2007; Winberry et al., 2013; Allstadt and Malone, 2014; Helmstetter et al., 2015; Lipovsky and Dunham, 2016).

When tremor occurs due to repeating stick-slip cycles, gliding of the frequency bands is the result of a changing recurrence time (Lockner et al., 1991; Neuberg 2000; Dmitrieva et al., 2013; Hotovec et al., 2013; Lipovsky and Dunham, 2016). In Section 4.2, we demonstrated this phenomenon using a simplified numerical simulation of stick-slip motion. We are able to produce the up-gliding spectral lines in our model by increasing the loading velocity  $v_0$  (Fig. 8c). The down-gliding spectral lines can be simulated in two ways: (i) by decreasing the loading velocity or (ii) by a growing stick-slip patch. Given the ensuing landslide motion, deceleration of a patch would be only realistic with a subsequent accelerating patch taking over

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the momentum. However, the observations show up-gliding spectral lines, the expression of an accelerating tremor patch, before the down-gliding spectral lines (Fig. 8). Therefore, we find the explanation of a decelerating patch to be physically unrealistic and explain downward gliding spectral lines as being due to an expanding stick-slip region. Changes in the stick-slip patch size additionally explains the several minutes of increasing tremor amplitudes (Fig. 6b) as being due to a proportional increase in the moment release in each stick slip cycle. Observed seismic amplitudes increased by a factor of three over seven minutes (Fig. S6), which would correspond to an increase in patch dimension by a factor of  $\sqrt{3}$ . If the initial patch radius was 30 m (as fits the data from the up-gliding patch), then this corresponds to an average radial growth rate of 70 mm/s.

These simulations additionally predict the disappearance of the tremor signal shortly before the landslide, as is consistent with the theoretical prediction of a transition from stick-slip to stable sliding at high loading rates (Rice et al., 2001; Gomberg et al., 2011). We suggest that two different mechanisms are responsible for this behaviour in our case. First, the patch that experiences accelerated loading eventually crosses the stability threshold and begins to start sliding stably (R < Rc in Eq. 1). In the simulations, this can be traced by the up-gliding spectral lines whose energy contents decrease with time until they fade into the background at 13 minutes (Fig. 8c). Second, the patch that experiences growing area experiences a commensurate increase in recurrence time (recurrence time and patch size are proportional, see Eq. 2); eventually the recurrence time becomes so large that a quiescent period ensues. This can be seen in the simulations of the down-gliding spectral lines that disappear at 12 minutes (Fig. 8d).

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To further gain insight into the nature of the tremor, we stacked the signals of the eight closest stations operating at the occurence time of the tremor (DREK, GODA, HOTT, JONS, KLUR, MOFO, STAM, VADA, see inset of Fig. 7 for locations, and the supplement for the stacked and single-station spectrograms) and computed the mean fundamental frequency. The maximum standard deviation to this mean of 2.5 Hz for the eight closest stations is only 0.3 Hz. This confirms that the gliding tremor includes the same frequencies at the tested stations. Hence, we conclude that the nature of the tremor signal is a source property rather than a site or wave propagation effect.

To conclude, we propose that the Askja seismic tremor is most likely caused by repeated stick-slip motion on small, frictionally unstable patches along the landslide failure plane. The occurrence of accelerating stick-slip motion is also consistent with the onset of a large landslide. This interpretation implies that the landslide mass had already started to move before the high-energy signals emerged in the seismic data. We envision the stick-slip patches to be located at the base of the landslide, developing along heterogeneities such as the lithological contact between the hyalocastites and the 1923 Suðurbotnahraun lavas, and pre-existing material heterogeneities within the hydrothermally altered hyaloclastites (Fig. 7b). Stick-slip sliding taking place at the base of the landslide rather than predominately within a highly damaged rock mass would result in a better coupling and thus higher energy transmission to the ground. This explains why the tremor can be observed over 30 km away from the landslide source region. In addition, we note the observation that cracks in the head wall of the landslide started to open after 2011 (Helgason et al., 2014) and that numerous cracks had developed at the surface of the landslide mass a vear before the failure (Fig. 3). This implies that the failure planes bounding the landslide developed

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years before the bulk movement of the landslide mass and just needed to be activated. The warm and wet weather, promoting pore pressure increase in July 2014 may have played an important role in this. Slight increases in pore water pressure can induce stick-slip motion, as has been observed on blocks of a seasonally active landslide in the French Alps (Genuchten and Rijke, 1989).

# 6.3 Tremor and rapid stick-slip as early-warning signs of landslide failure

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The risk to human life posed by landslides compels us to explore the possibility of designing a landslide early-warning system based on the existence of precursory seismic tremor, Furthermore, because seismometers may be placed at a distance from the landslide site, such a system would provide safety benefits compared to other types of monitoring. While landslide early-warning systems may not be possible at the present time, our goal here is simply to outline several scientific and engineering considerations for such a system.

First, future observations should be made to determine whether accelerating stick-slip, manifested as either individual events (e.g., Yamada et al., 2016; Poli, 2017) or as seismic tremor (e.g., as before the Askja landslide), are in fact a sufficiently common precursor to large scale slope failures. There is evidence that this may be the case. Many voluminous slope failures do start as slow-moving landslides (Palmer, 2017). Furthermore, some already monitored slow-moving landslides show displacement rates that scale with the seismicity rates of cracks and stick-slip tremor signals (Tonnellier et al., 2013, Vouillamoz et al., 2017) and could serve as test sites.

Second, any seismicity-based landslide early-warning system, will require seismic data to be analysed in near-real time by a fast and reliable algorithm. Early-warning systems for tectonic earthquakes have been designed that meet this standard (Allen et al., 2009; Cua et al., 2009). Machine-learning methods could form the basis for such an algorithm as they are a powerful and promising tool to detect and classify signal classes, also of precursory slope activity, in seismic data (Hammer et al., 2012; Esposito et al., 2013; Zeckra et al., 2015). Other anticipative signals of natural gravity-driven instabilities such as those of cracking could also be detected and identified in this way. Cracking and fracturing signals have been identified in seismic data before cliff collapses (Amitrano et al., 2005; Zeckra et al., 2015), slope instabilities (Sima, 1986; Kilburn and Petley, 2003; Kolesnikov et al., 2003; Dixon et al., 2015; Faillettaz et al., 2016; Yamada et al., 2016), and break-off of hanging glaciers (see review by Faillettaz et al., 2015).

Third, seismic networks must be able to observe landslide-related seismicity. In the case of Askja, a well-positioned network of seismic stations located a few kilometres away from the slope instability was able to detect precursory tremors. Future study will be required to test the detectability thresholds of seismic networks as a function of network design parameters including station spacing and sampling rate. Regional scale landslide monitoring with a seismic network has only been attempted on a few occasions (Burtin et al., 2013; Hibert et al., 2014) and the challenge persists to detect landslide signals in a continuous seismic data stream in near-real time (Dammeier et al., 2016; Manconi et al., 2016; Chao et al., 2017).

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## 7 Conclusions

We analysed seismic data from a voluminous landslide its precursory tremor and successively following small slides that occurred at the southeastern shore of the caldera lake Öskjuvatn of the Askja central volcano in the Icelandic Highlands on 21 July 2014. The seismic data is of exceptionally high quality because (i) the 58 stations were centred around the Askja caldera, and (ii) anthropogenic noise sources are far away. We performed a detailed analysis of the seismic data that showed that the short-period signals of the landslide mainly consist of surface waves, which arrived at the closest station at 23:24:05 UTC and lasted for about 130 s. The seismic signal of the Askja landslide is characteristic of voluminous slope failures with an emergent onset without clear P and S wave arrivals and a cigar-shaped envelope. Inversion of the long-period signals of the landslide reveals that the bulk mass of  $30-80\times10^6$  m $^3$  propagated to the northwest starting at the caldera ring fault at the southeastern shore of Lake Öskjuvatn, which is consistent with field observations.

We detected harmonic tremor with a fundamental frequency of 2.5 Hz commencing about 30 minutes before the landslide and diminishing into 2 minutes of seismic quiescence. By numerically simulating stick-slip motion and elastic wave propagation, we were able to reproduce the aseismic period and the simultaneously up\_ and down<sub>e</sub>gliding of the spectral tremor lines with models where stick-slip earthquakes, occur with changing frequency. We propose that upward spectral gliding occurs because of an increase in the recurrence frequency of stick-slip events on an accelerating sliding patch. In contrast, we explain downward spectral gliding by an expanding stick-slip region where the recurrence frequency of stick-slip earthquakes decreases. The transition from stick-slip to stable sliding is marked by a seismically quiet period of 2 minutes before the bulk landslide mass failed catastrophically. We emphasise the utility of seismic networks to detect and characterise not only landslides but also the precursory signals that might otherwise go unnoticed. This is of utmost importance for sites with a high hazard potential and encourages the development of early-warning systems based on seismic data for monitoring slope failures.

# Acknowledgements

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Table 1 Parameters of the stick-slip simulations

Parameter	Symbol	Value
Epicentral distance	L	3.5 km
Quality factor	Q	25
Shear wave speed in rock	c <sub>s</sub>	1878 m s <sup>-1</sup>
Density of rock	ρ	2000 kg m <sup>-3</sup>
Thickness of landslide	H	30 m
Frictional state evolution distance	$d_c$	$15x10^{-6}$ m
Frictional direct effect parameter	a	0.03
Frictional ageing effect parameter	b	0.04
Static coefficient of friction	$\mu_0$	0.7
Initial loading velocity	$\mathbf{v}_0$	0.6 mm s <sup>-1</sup>
Repeating earthquake patch radius	R	<u>30</u> m
Creep acceleration on the accelerating patch		
(only on up-gliding patch)	$\dot{v}$	0.01 (mm s <sup>-1</sup> )_min <sup>-1</sup>
Rate of patch size change on the decelerating patch		
(only on down-gliding patch)	₽Ř	10 mm s <sup>-1</sup>

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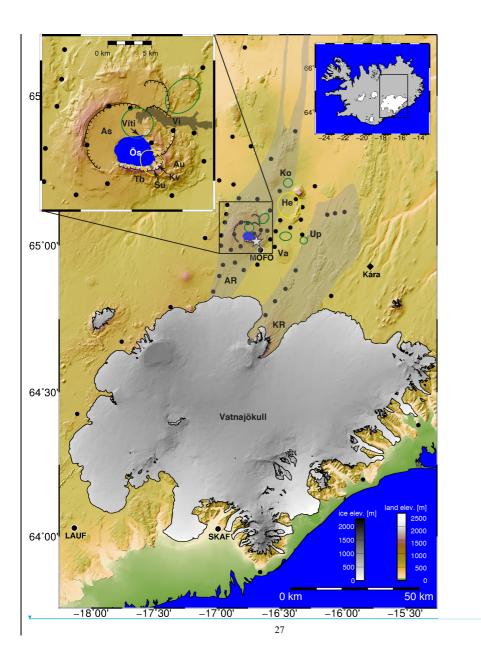
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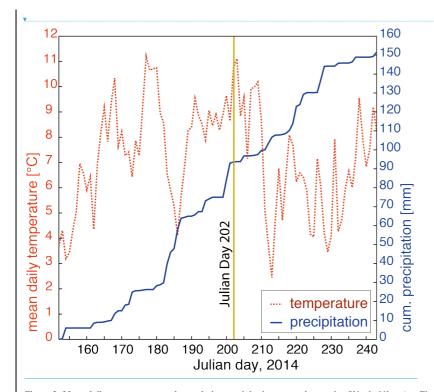
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Figure 2: Mean daily temperatures and cumulative precipitation at weather station Kárahnjúkar (see Fig. 1 for location) in June, July and August 2014. Note the two days with high precipitation immediately before and the increased temperature at the day of the landslide (Julian Day 202, yellow line).

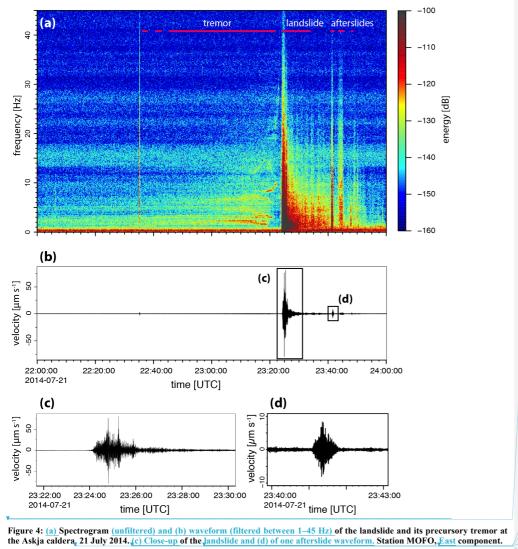


Figure 3: Surface opening cracks on top of the landslide body in August 2013, a year before the failure. Location of the image is indicated on Fig. 5e, view is to the west. Image taken by Daniele Trippanera.

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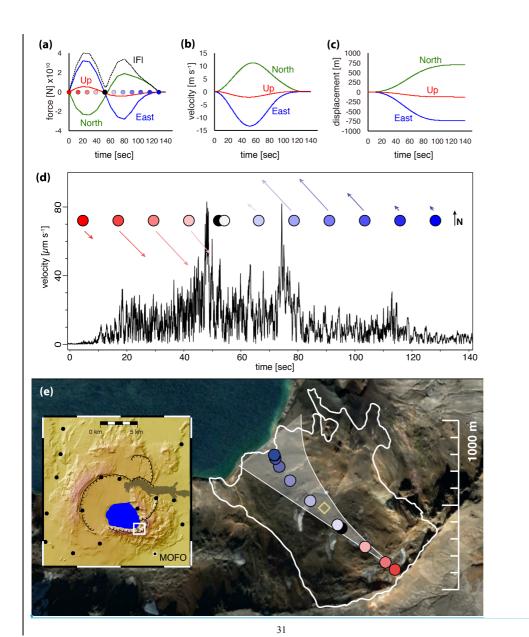
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Figure 5: Results of the landslide force history inversion. (a) Force-time evolution, (b) velocity-time and (c) displacement-time plots for the north, east and upwards component of the loading force. Red circles in a), d) and e) mark the acceleration phase and the black circle is the transition to the deceleration phase (blue circles) of the landslide motion. (d) Time evolution of the landslide acceleration and deceleration with horizontal force vectors (arrows) for each time step (North is up). Envelope of the East component of station MOFO (see inset in e) for location), filtered between 1-45 Hz for comparison. The start of the x-axis is at 23:24:05 UTC. (e) Path of the landslide bulk volume from the landslide force history inversion of the seismic waveforms between 0.02-0.08 Hz. Shaded white area is the range of the inversion results with different frequencies of the band pass filter (0.02-0.05 Hz, 0.04-0.08 Hz). The white line is the outline of the landslide source area plotted on top of a Google Earth image taken on 7 August 2012. The yellow diamond is the location of Fig. 3. The white square on the inset shows the location of the main image.

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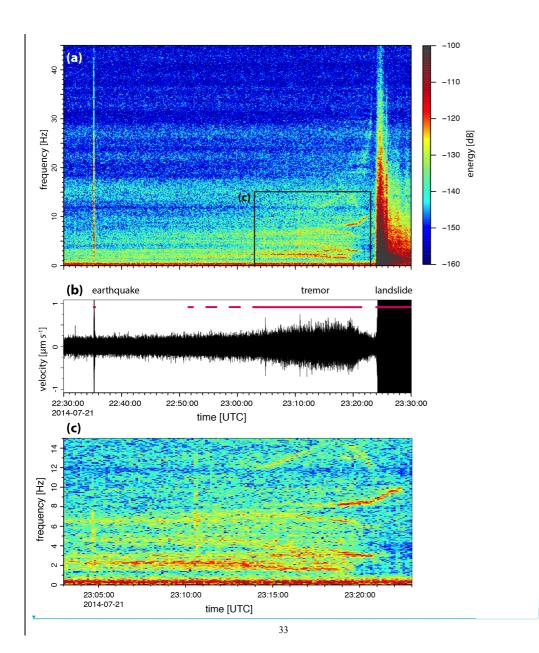
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**Deleted:** (b) Envelope of the East component of station MOFO (see inset for location), filtered between 1–45Hz and the time evolution of the landslide acceleration (red circles) and deceleration (blue circles). Start of the x axis is at 23:24:05 UTC.



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Figure 6: (a) Spectrogram (unfiltered) and (b) waveform (filtered between 1–45 Hz) of the tremor signal preceding the 21 July 2014 landslide. (c) Close-up of the tremor signal with up- and down-gliding spectral lines. Station MOFO, East component.

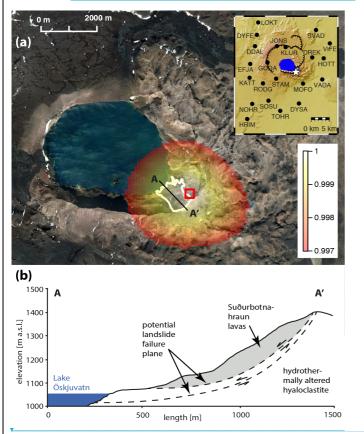


Figure 7: (a) Example of the localisation results of the tremor using the tremor record of the stations shown in the inset between 5 23:00:00 and 23:01:00 UTC, filtered between 1.5-3 Hz and a seismic wave velocity of 2300m/s. The open red square is the best-fit location and the ellipse around it is the likelihood quantile from 0.997 (red) to 1 (translucent white). The white line is the outline of the landslide source area. The inset shows the locations of the seismic stations used in the localisation and the location of the landslide source area (white star). (b) Hypothetical cross section of the landslide showing the potential stick-slip tremor planes.

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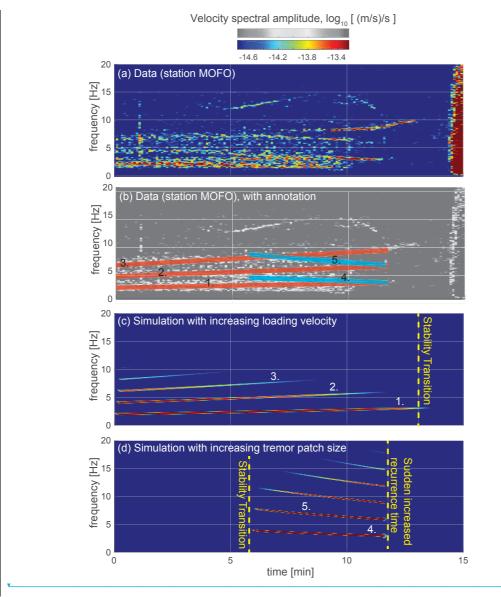
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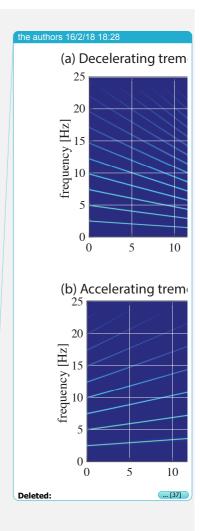


Figure 8: Comparison between observed and simulated seismic tremor showing, (a) a data spectrogram from the station MOFO and (b) an annotated data spectrogram showing three up-gliding spectral bands (labelled 1, 2, 3) and two down-gliding spectral bands (labelled 4 and 5). The time of large-scale landslide motion is visible in the data at about 14 minutes time. (c) and (d) show numerical simulations with increasing loading velocity and increasing patch size, respectively. Simulation parameters are given in Table 1. The spectrograms in (a), (c), and (d) are created using the same colour scale and are therefore comparable.

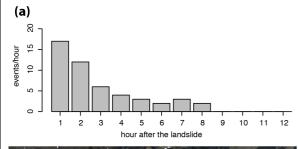




Figure 9: (a) Numbers of small slope failures after the Askja landslide per hour. (b) Location of small slope failures after the Askja landslide (grey circles). Only the best-fit locations are shown, the ellipses of the likelihood quantile are omitted for clarity (cf. Fig. 7a). The white line is the outline of the landslide source area.