# Journal of Volcanology and Geothermal Research Multi-parametric characterization of explosive activity at Batu Tara Volcano (Flores Sea. Indonesia)

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Abstract:	Batu Tara is an active but poorly studied volcano located in the Lesser Sunda Archipelago (Indonesia). Its last known long-lasting eruptive phase, dating 2006-2015, was characterized by frequent, short-lived explosions, similar in style and magnitude to those of the well monitored Stromboli volcano (Italy). On September 2014, we collected high-frequency multi-parametric measurements of the ongoing explosive activity to investigate the dynamics of intermediate-size volcanic explosions. We acquired synchronised acoustic, thermal and visible high-speed imaging data, and parameterized different spatial and temporal properties of each explosive event: i) maximum height and ejection velocity of bombs and plumes, ii) duration, iii) amplitude of acoustic and thermal transients, iv) acoustic and thermal energy, v) spectral features of the acoustic signals. The latter ones justify the assumption of a pipe resonance of the uppermost conduit section, likely in response to the arrival of over-pressurized gas at the free magma surface. The variability of the investigated parameters agrees with previous observations of intermediate-size explosions at other volcanoes, reflecting the complexity of the related source processes.
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#### 32 1. Introduction

34 Forecasting the short term progression of volcanic unrest, and defining the physical-chemical processes 35 governing eruptive activity are the main goals of modern volcanology; such objectives require high-quality 36 monitoring data, ideally analysed in near real-time and consistently over long periods (Ebmeier e al., 2019). 37 As such, several volcanoes boast extensive real-time measurements of multiple eruption-related parameters 38 and long-term databases, like Mt. Etna, Vesuvius, and Stromboli (Italy), and Kilauea, Mt. St. Helens, and 39 Yellowstone (U.S.A.) (e.g. Pallister and McNutt, 2015).

40 Data from volcanoes sited in remote areas are harder to collect, and baselines on their behaviour during 41 unrest are often poor or absent. Not surprisingly, nearly half of the active Holocene volcanoes have 42 rudimentary or no monitoring at all (Ebmeier et al., 2019). Yet the detection and characterization of their 43 eruptive activity have fundamental implications, as even remote volcanoes are not exempt from being a 44 source of possible hazards. For instance, a major risk is posed by volcanic ash to aviation (e.g. Prata and Rose, 45 2015). The exponential increase of population growth and the sharply increasing air traffic (Tilling, 2008) in 46 the last century stresses the need of mapping the eruptive behaviour of as many volcanoes as possible. Only 47 to quote an example, from 1935 through 2000 about 100 incidents were related to airplanes finding 48 themselves in volcanic ash clouds (Gordeev and Girina, 2014). Additionally, active volcanoes in the vicinity 49 of the sea (either subaerial or submerged) are potentially tsunamigenic (Paris et al., 2014) and might 50 trigger tsunamis through volcano-tectonic earthquakes, slope instabilities, pyroclastic flows, underwater 51 explosions, shock waves and caldera collapse (e.g. Paris et al. 2014; Paris, 2015).

52 Remote sensing through satellite techniques is a convenient tool to derive near real-time or time-averaged 53 information on the ongoing eruptive activity of remote volcanoes (e.g. Coppola et al., 2019). Nevertheless, 54 the synoptical-scale offered by satellite methods is sometimes not suited to address individual case studies 55 (Pyle et al. 2013), especially considering that the critical spatial resolution for understanding volcanic 56 processes (meter to decametre scale) is uncommon in satellite-based investigation (Ramsay and Harris, 57 2013). Multi-parametric, *in-situ* observation campaigns, on the opposite, offer a high-resolution robust 58 picture of the eruptive parameters, which is fundamental for understanding the source processes of the 59 eruptive activity (e.g. Dalton et al. 2010; Cimarelli et al. 2016; Spina et al., 2017; Taddeucci et al., 2017, 2021).

60 Among remote and sporadically monitored volcanoes, Batu Tara (Pulau Komba, Flores Sea, Indonesia) is well 61 known for its analogies with the well-monitored Stromboli volcano in terms of eruptive style and morpho-62 structural properties (Laiolo et al., 2018). Remarkably, the recent eruptive activity of Batu Tara has posed 63 several concerns for the traffic air, pushing authorities to create alternative commercial routes between 64 Jakarta and Sidney (Sonnabend, 2007). Despite being located on an uninhabited island, its explosive activity 65 threatens the population of nearby islands. In March 2007, 15.000 people were evacuated in response 66 to an increase of the hazard level following a series of stronger explosions. Approximately, 450.000 people 67 reside within 100 km from the volcano, and can be considered exposed to potential risks associated with 68 volcanic activity. Indeed, for Batu Tara, the Population Exposure Index is 2 (out of a maximum of 7; Brown et 69 al 2015). Due to its remoteness, the monitoring of volcanic activity at Batu Tara is mainly realised through i) 70 remote sensing of eruptive plumes (Laiolo et al. 2018; Blackett, 2015), ii) sporadic in-situ field observations 71 from Centre of Volcanology and Geological Hazard Mitigation (a.k.a. CVGHM), iii) guided expeditions 72 providing informative reports (Volcano Discovery website; Smithsonian Institution Global Volcanism 73 Program-hereafter GVP- website), iv) and visual observations from Lembata island (CVGHM). Here we 74 describe the results of an extensive characterization of Batu Tara explosive activity through an *in-situ* multi-75 parametric campaign performed in September 2014 with the aim of drawing a detailed picture of the 76 explosive activity characterizing the volcanic unrest. Using high-quality, high-frequency thermal and acoustic 77 data we i) contributed to the implementation of the baseline knowledge of a scarcely monitored volcano; ii) 78 shed light into the characteristics of intermediate size ash/gas rich volcanic eruptions, a complex end-79 member of Strombolian and Vulcanian eruptive style.

- 80 2. Geological and volcanological setting

82 Batu Tara volcano is an active stratovolcano located in the Flores Sea (Indonesia), about 46 km north of 83 Lembata Island (Lesser Sunda archipelago). Its steep-sided emerged part forms the isolated and uninhabited 84 3-km-wide Komba island (4.7 km<sup>2</sup>, 748 m a.s.l, 7.792°S, 123.579°E; Blackett, 2015). The base of Batu Tara 85 volcanic edifice lies approximately 3.000 m b.s.l. (Stolz et al., 1988, GEBCO website) while its upper portion 86 is characterised by a lateral collapse scar, very similar to the well-known Sciara del Fuoco in Stromboli 87 volcano, opened to the east and hosting a small active crater (Brouwer, 1940; **Figure 1a**). This morpho-88 structural analogy, as well as the similar dimensions of their volcanic edifices and persistent explosive activity, 89 have earned Batu Tara and Stromboli the name of "twin volcanoes" (Laiolo et al., 2018).

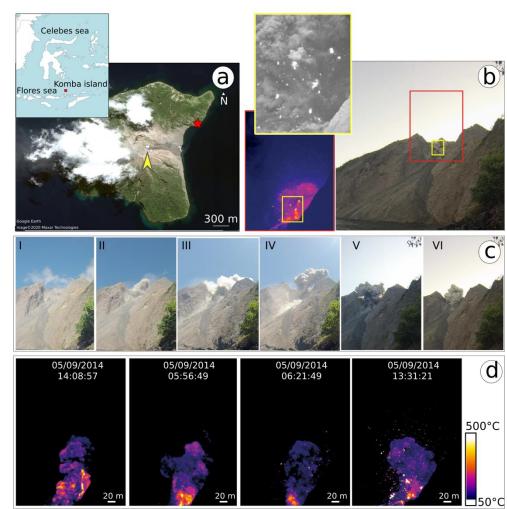
90 The magmatism of Batu Tara is linked to the active subduction processes of the 3000 km-long Sunda-Banda 91 volcanic arc system (Hamilton et al., 1979, Van Bergen et al., 1992; Stolz et al. 1988) and is characterised by 92 high-potassium calc-alkaline lavas (Hilton & Craig, 1989). Erupted volcanic products are silica-poor (Stolz et 93 al., 1988; Hoogewerff et al., 1997) potassic to ultrapotassic tephrites, trachybasalt, tephrite basanite, 94 trachyandesite, and basaltic trachy-andesite (Van Bergen et al. 1992, Hilton & Craig, 1989, GVP website, 95 Brouwer, 1940).

96 The eruptive history of Batu Tara volcano is nearly unknown. Geological evidence at Batu Tara shows that 97 before entering the present explosive cycle, started in 2006, the eruptive style was predominantly effusive, 98 driven by the input of primitive magmas. The transition from predominantly effusive to predominantly 99 explosive activity is attributed to a significantly higher content of volatiles retrieved in recent magmas (Herrin 100 and Costa, 2015). The only documented eruptive phase pre-2006, characterised by explosions and lava flows, 101 dates back to the period 1847-1852 (VEI-2; Stolz et al., 1988) although some sources extend this eruptive 102 period up to 1932 (Brouwer 1940; Badan Geologi Website).

103 The present-day activity of Batu Tara initiated on 1 July 2006, when an ash cloud was reported (VEI-1; GVP 104 website, 2007), interrupting an over a century-long period of dormancy. In the period 2007 – 2015, the 105 activity was characterised by the persistent occurrence of Strombolian to Vulcanian explosions emitting gas, 106 ash and ballistic blocks in variable proportions, and was documented by: i) the Darwin Volcanic Ash Advisory

107 Centre, who issued a total of 2652 advisories for Batu Tara (Volcanic Ash Advisories: 4 in 2006, 134 in 2007, 108 251 in 2008, 532 in 2009, 380 in 2010, 348 in 2011, 482 in 2012, 333 in 2013 with an archive gap for December 109 2013, 90 in 2014, and 98 in 2015; source VAAC Darwin Archive), and ii) thermal anomalies detected by the 110 Moderate Resolution Imaging Spectroradiometer (MODIS) on NASA's Terra satellite from Hawai'i Institute of 111 Geophysics and Planetology (MODIS website). A continuous ash emission characterised the beginning of this 112 eruptive phase, then the activity shifted toward frequent (i.e. several per hour) ash-rich Strombolian 113 explosions and more energetic Vulcanian-type explosions occurring several times per day. These latter ones 114 ejected bombs and blocks up to 500 meters above the crater. On 24 March 2007, a series of stronger 115 eruptions (VEI-2) forced Indonesian authorities to raise the alert level to 3 (out of a maximum of 4) and 116 evacuate 15,000 people from Lembata Island, 50 km to the south (Volcano Discovery website, Volcano Live 117 website). The alert level was then lowered to level 2 on 12 April 2007 (GVP website, 2007). On 5 April a lava 118 flow on the eastern slope created a lava delta 450 m across and extending 100 m offshore (GVP website, 119 2007). In 2015, explosive activity waned, followed by only rare MODIS thermal anomalies detection, the last 120 of which on 16 July 2016 (MIROVA Team pers. comm.; methodology in Coppola et al., 2015).

121 During the above-described period, and the period investigated in this work, the explosive activity was 122 ejecting ash, and lapilli- to bomb-sized pyroclasts, with some ash plumes reported by the Darwin VAAC 123 reaching as high as ~ 3 km a.s.l. and drifting laterally up to 200 km from Batu Tara. A small pyroclastic flow 124 was observed on 3 July 2015 travelling down the eastern scar and for about 250 m out to sea (GVP website, 125 2016; Volcano Discovery website).



**Figure 1:** (a) Geographical position (top-left inset), and aerial view (2012; Image ©Maxar Technologies) of 128 Komba Island. The active vent of Batu Tara is marked by a yellow arrow, below a small eruptive cloud. The 129 position of the multi-parametric setup is marked by a red star. The distance between the recording site and 130 the active vent is 1226 m. (b) Picture of Batu Tara volcano showing the field of view of the camera (FOV). 131 Thermal (bottom left inset) and visible (top left inset) camera images with horizontal FOV of 244 m and 60 132 m, respectively. (c) Snapshots from different eruptive events recorded by a GoPro camera corresponding to 133 the acoustic events in Figure 3 marked by an event serial number of 3 (I,05/09/14 00:28), 11 (II, 05/09/14 134 01:47), 17 (III, 05/09/14 04:44), 18 (IV, 05/09/2014 04:56), 31 (V, 05/09/14, 10:12), 33 (VI, 05/09/14 11:00). 135 (d) Still frames of four selected explosions as recorded by the FLIR thermal camera (FOV 244x346m), showing 136 the observed events ranging from ash-dominated explosions (left) to bomb-dominated explosions (right).

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#### 138 3. Field deployment

139 The field campaign at Batu Tara was performed from 4 to 6 September 2014. Multiple, time-synchronized

140 devices were deployed at sea level in direct view of the active vent, which was located at a straight distance

141 of 1226 m and at an elevation of 540 m a.s.l. The multiparametric setup included: i) a high-speed camera 142 (OPTRONIS CR600x2, recording at 500 frames per second (fps) with a pixel size of 0.06 m) acquiring videos 143 of the vent in the first 20 seconds of explosions; ii) a thermal infrared camera (FLIR SC655 , 50-200 fps, pixel 144 size of 0.51 m), acquiring videos at a larger spatial and temporal scale; iii) a time-lapse camera (GO-PRO, 1 145 frame every 5 s) (**Figure 1b**), and iv) a broadband microphone (freq. range of kHz to 0.1 Hz) sampled at 10 146 kHz. The multi-parametric station recorded discontinuously several seconds- to minutes-long traces each one 147 comprising one or two explosive events. In this study, we primarily focus on the integrated analyses of 148 thermal and acoustic data, since these two datasets captured the whole explosion dynamics for a large 149 number of events at a comparable spatial/temporal resolution. High-speed videos are here used to obtain 150 quantitative constraints on the vent geometry and exit velocity as detailed in **Section 4.1**.

151 During the recorded period, the activity was characterized by impulsive, ash-rich explosions lasting seconds 152 to minutes. The explosions ejected ash-loaded jets, with variable proportions of hot lapilli- to bomb-sized 153 pyroclasts and spatters 100-300 m above the crater, that eventually fell/rolled down the eastern collapse 154 scar. The ash was rapidly dispersed buoyantly in small plumes rising up to a few hundred meters above 155 the vent before being drifted away by local wind (**Figure 1c**). The activity spanned from pure ash venting with 156 negligible amounts of incandescent material to bomb-dominated explosions (**Figure 1d**). Rarer, significantly 157 more powerful blasts were also observed ejecting meter-sized blocks to distances of several hundred meters 158 in all directions.

#### 159 4. Data analysis

160 4.1 Thermal infrared video analysis

161 Thermal videos captured several explosions with a horizontal field of view ranging from 61 to 244 m in width 162 and up to ca 350 m above the vent (bottom inset in **Figure 1b** and **Figure 1d**). The vent was not directly visible 163 from our point of observation. However, using high speed and thermal images of different events, we 164 estimated the horizontal width of the jet just above the crater rim at the very beginning of the explosions to 165 be in the range 6 - 20 m, suggesting that the eruptive vent might have a similar size at its exit. Thermal images  166 were corrected for the atmospheric absorption through the software after air temperature, humidity, and 167 target distance input, and then scaled by knowing pixel pitch size (17μm), lens focal length (41.3 mm), straight 168 distance (1226 m), and dip angle of the camera (20°). Quantitative analysis of the thermal infrared videos 169 was carried out by using different image processing in-house-built algorithms.

170 In a first approach, for each video frame we integrated the apparent brightness temperature of all pixels in a 171 100x50 pixel control area (A) above the vent and subtracted the background temperature, i.e. the minimum 172 temperature of each frame; then, dividing by A we obtained a mean temperature value representative of the 173 whole frame. Variations of this value over the different frames of the video provides thermal signal variation 174 over time, or the 'thermal waveform' (**Figure 2**). In this way, each explosion, characterised by a single thermal 175 pulse or by a sequence of two or more pulses, can be quantitatively detected from the thermal waveform 176 analysis, after de-trending and de-meaning the signal, by using a Short Time Average/ Long Time Average 177 (STA/LTA) algorithm (Withers et al., 1998), and using STA window = 1 s, LTA window 40 s, trigger threshold 178 STA/LTA=3, de-trigger threshold STA/LTA=1). Moreover, we estimated the thermal energy radiated from 179 each explosion according to the Stefan–Boltzmann Law, by integrating the radiant flux emitted in the control 180 area (A) over time (t) (Bombrun et al., 2016, Marchetti et al., 2009) as follows:

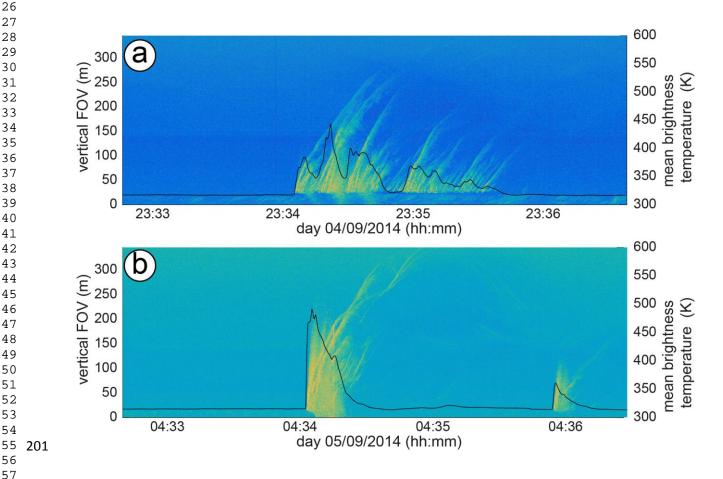
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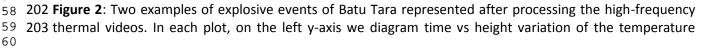
$$E_{th} = \int_{t_i}^{t_f} \int_A \sigma \varepsilon (T^4 - T_0^4) dA dt$$
<sup>(1)</sup>

182 where  $t_i$  and  $t_f$  are the initial and final times of the event obtained from the STA/LTA detection (and  $t_{f}$ - $t_i$  being 183 the event duration),  $\varepsilon$  is the emissivity of the surface (assumed constant, 0.96),  $\sigma$  is the Stefan-Boltzmann 184 constant (5.670373x10<sup>-8</sup> Wm<sup>-2</sup> K<sup>-4</sup>), and T and T<sub>0</sub> the pixel and the ambient environment temperature (K). 185 From this analysis, 67 out of 72 detected vents were selected.

186 In a second approach, we used a Matlab algorithm (Gaudin et al., 2017) to discriminate the dynamics of each 187 explosion as a function of time as follows: for each frame in a video, the maximum temperature ( $T_{max}$ ) value 188 is computed for each row after the background temperature ( $T_b$ ) is subtracted considering the minimum 189 temperature of each pixel in a 2-second moving time-window preceding the frame. In this way, the quantity 190 (T<sub>max</sub>-T<sub>b</sub>) of each frame row is represented graphically as a function of height above the vent (in the y axis), 191 and time (on the x axis) allowing to visualize the time evolution of the temperature anomaly generated by 192 the erupted material (**Figure 2**). In these 'rise diagrams' hot gas and ash and bombs appear as blurred stripes 193 and well-defined parabolic curves, respectively, with an inclination proportional to their rise velocity. From 194 these diagrams, we retrieved manually the following quantities: i) explosion starting time, ii) maximum bomb 195 elevation, and iii) maximum plume elevation, from which we computed their maximum height and mean rise 196 velocity.

197 Using the rise diagrams and high-speed video footage we assessed semi-quantitatively the bomb content of 198 the events, attributing a 'bomb-index value' ranging from zero for ash-dominated, bomb-free explosions to 199 one for bomb-dominated explosions (**Figure 1d**).





204 anomaly generated by the explosive event, or 'rise diagram', whereas on the right y-axis, we plot the average 1 205 brightness temperature in a control area, or 'thermal waveform'. The thermal anomaly is the maximum <sup>2</sup> 206 temperature computed for each row of thermal image after background subtraction (T<sub>max</sub>-T<sub>b</sub>, color-coded). 207 Gas puffs and bombs appear as streaks and parabolas, respectively, with a slope related to their rise (or fall) 208 velocity. The thermal waveform is calculated as the frame-by-frame sum, after background subtraction of T 209 values in a 100x50-pixel box above the vent. This quantity is superimposed in the previous diagram, showing 210 that events are characterised by an initial jet phase, followed by the one or more bursting pulses, and a final <sup>8</sup> 211 waning phase.

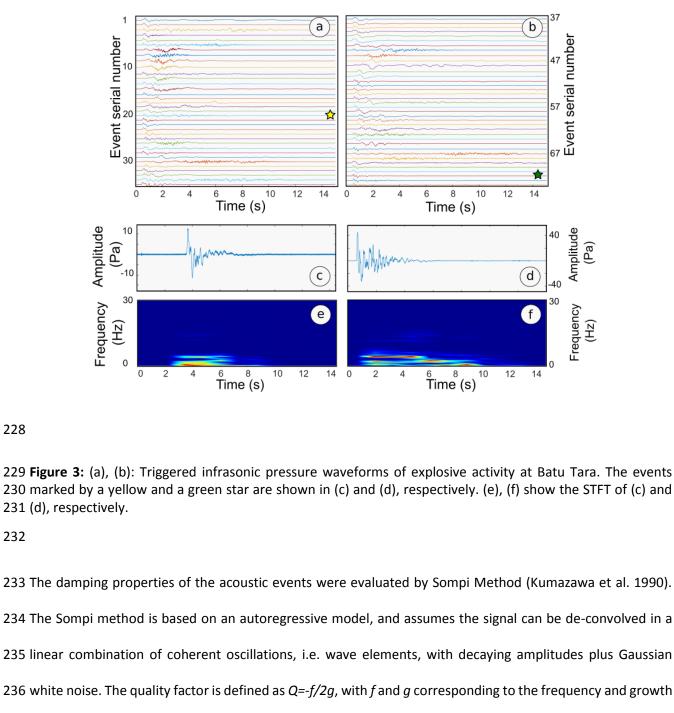
#### 13 213 4.2 Acoustic signal analysis

15 214 Acoustic signals were decimated to 100 Hz to improve processing speed. The decimation does not affect 215 signal properties, given that the bulk of energy content of Batu Tara explosions lies in the infrasound range. 216 To pick acoustic transients from the data, we applied the STA/LTA algorithm using a short-time window 217 and a long-time window, a trigger and a de-trigger threshold of respectively 1 and 5 seconds, 4 and 1.5. Such 218 parameters have been broadly texted to maximize the detection capability of the algorithm.

219 Accordingly, 72 acoustic transients with good signal to noise ratio have been selected (Figure 3) and 220 characterised using different parameters. Event duration was computed as the time interval between trigger 221 and de-trigger thresholds. Spectral and time-domain properties of the events were computed on a window 222 of 10.24 seconds. In particular, we evaluated the peak-to-peak and Root Mean Square (RMS) amplitude of 223 the events and their peak frequency. We additionally computed a parameter that account for the 224 contribution of higher frequencies to the spectrum, the mean frequency  $f_{mean}$ :

$$f_{mean} = \frac{\sum_{i=1}^{N} (pxx_i * f_i)}{\sum_{i=1}^{N} pxx_i}$$
(2)

226 with  $pxx_i$  corresponding to the power spectral density evaluated at each of the N frequencies  $f_i$  (Carniel et 49 227 al., 2005; Spina et al., 2016a).



237 rate (growth rate of the wave element amplitude), respectively (Kumazawa et al. 1990). A higher quality

238 factor corresponds to slower amplitude decay of the investigated events. We found that an autoregressive

239 order of 16 was producing the best results, and was therefore chosen for our analysis.

240 Successively, we attempted a classification of acoustic waveforms in different families by correlating their 241 spectra, as previously proposed by Milluzzo et al. (2010) building on Green and Neuberg (2006). To this extent

242 we applied the following steps: 1) A window of 15 seconds of signal was selected and a Butterworth filter in 243 the range 0.5-5 Hz was applied;2) the spectra of these windows were calculated; 3) a cross-correlation matrix 244 was obtained by comparing the spectra using cross-correlation; 4) the spectrum exhibiting the highest 245 number of cross-correlation coefficient above the threshold of 0.9 was selected as master spectrum; 5) the 246 spectra of those events that have cross-correlation coefficient above the above-mentioned threshold were 247 stacked to obtain an average spectrum; 6) the latter was cross-correlated with the original dataset, and all 248 the spectra with a cross-correlation coefficient greater than the threshold were grouped into a family. Then 249 steps 4-6 were repeated for the remaining dataset of events.

250 The acoustic energy radiated during the explosion was evaluated as follows (e.g. Johnson and Aster, 2005):

$$Ea = 2\pi r^2 \rho_{atm}^{-1} c_{atm}^{-1} \int_{T_1}^{T_2} \Delta P(t)^2 dt$$
(3)

252 Where T1 and T2 are the initial and final times of the acoustic signal, *r* is the distance between the vent and 253 the microphone (1226 m),  $\rho_{atm}$  is the air density assumed to be equal to 1.2 kg/m<sup>3</sup> and  $c_{atm}$  is the sound speed, 254 corresponding to 340 m/s. It has to be noted that equation (3) might represent an underestimation of the 255 actual acoustic energy within the conduit, due to topographical effects and to the impedance contrast at the 256 vent. Indeed, Lacanna and Ripepe (2020) investigated by 3D finite-difference time-domain analysis the 257 effects of plane-to-spherical acoustic wave conversion in the conduit, assuming volcanic conduit behaves as 258 a classical duct system. The amplitude and radiation patterns outside the duct are controlled by the acoustic 259 impedance at the open end, which is a function of vent radius and pressure wavelength; as a result, at the 260 vent-atmosphere interface a large part of the energy is reflected back to the conduit.

261 The temporal rate of acoustic energy, i.e. acoustic power, has been broadly used in literature to retrieve 262 information on the flow velocity at the source (e.g. Woulff and McGetchin, 1976; Ripepe et al 2013). Building 263 on the source model theory, the relationship between the amplitude of the first positive infrasonic peak and 264 the exit velocity of the gas at the vent for a monopole (3), dipole (4) and quadrupole (5) source (e.g. De 265 Angelis et al. 2019 for details) has been shaped as follows (Vergniolle and Caplan-Auerbach,2006; Delle 266 Donne and Ripepe, 2012 Ripepe et al., 2013):

$$\langle p \rangle = \frac{\rho_{atm} R \sqrt{\kappa_d}}{r} v_e^2 \qquad \dots \qquad (4)$$

$$= \frac{\rho_{atm} R \sqrt{K_d}}{r c_{atm}} v_e^3 \tag{5}$$

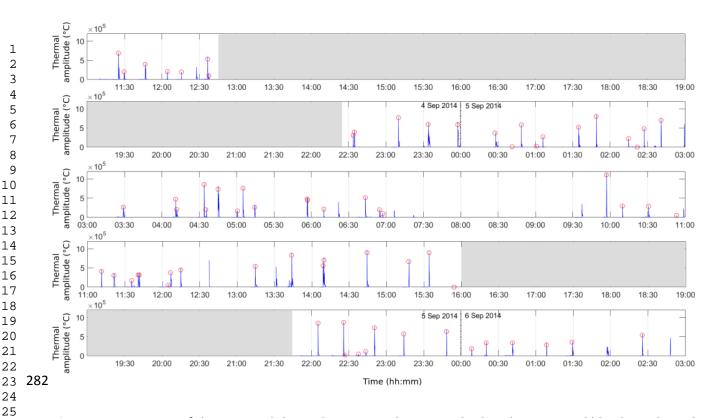
- - $= \frac{\rho_{atm} R \sqrt{K_d}}{r c_{atm}^2} v_e^4 \dots (6)$

270 Where  $K_d$  is an empirical constant equal to 1, 10<sup>-2</sup>, 10<sup>-5</sup> for a monopole, dipole and quadrupole sources 271 respectively (e.g. Vergniolle and Caplan-Auerbach, 2006) and R is the radius of the source. Equations (4) to 272 (6) have been used here to evaluate the gas/particle exit velocity at the vent, assuming different possible 273 source models. The radius of the source has been estimated assuming it is equivalent to half of the average 274 length of the jet at the source (i.e. 6.5 m; see **Section 4.1** for details).

#### 275 5. Results

#### 276 5.1 Thermal infrared video results

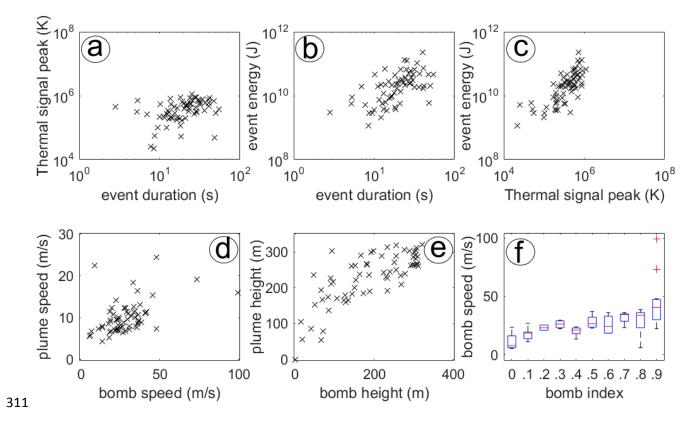
277 In the investigated period of data acquisition, explosive events were occurring at a frequency of 2 to 6 events 278 per hour, with the exclusion of a 2-hour interval (5 Sep 7:15 -9:15 UTC) where no events were detected 279 (**Figure 4**). The events recurrence time is between 2 and 36 minutes, with the most frequent intervals being 280 ca. 5 and ca. 12 minutes. There is no obvious correlation between recurrence interval and explosion thermal 281 amplitude during the time span considered.



283 Figure 4: Time series of the triggered thermal events. Each event is displayed as a vertical blue line. The red 284 circles indicate the position of the thermal amplitude peak of the event detected with the STA/LTA algorithm. 285 Grey boxes mark time intervals where no video/audio-recordings are available. Dotted black lines highlight 286 different days.

288 Thermal waveforms show a unimodal distribution in terms of event duration ranging 2 to 60 seconds, with 289 more than 60% of the events ranging in the 10-30 s interval, and a broad unimodal distribution of amplitudes 290 centred around 2-4x10<sup>5</sup> K. Event thermal energy ranges between 1.1x10<sup>9</sup> and 2.2x10<sup>11</sup> J, with a bimodal 291 distribution (major peak at 2x10<sup>10</sup> J and secondary peak at 5x10<sup>9</sup> J). No obvious correlation is observed 292 between peak amplitude and duration (Figure 5a-c). The ejection velocity of the bombs and plumes was 293 retrieved from the time/height diagrams of the maximum temperature. Nearly half of the events (33 out of 294 67) are characterised by one individual bomb ejection pulse, 19 events have two main pulses, whereas the 295 rest show 3 or more ejection pulses. Bomb velocity ranged in the 10-50 m/s with a mode around 20-30 m/s, 296 whereas plumes were ejected at lower velocities (5-25 m/s) with a mode at 6-9 m/s. Maximum bomb 297 elevation widely ranged from 50 to larger than 300 m, exceeding the limit of vertical FOV in ca 20% of the 298 events. Ash and gas plumes can be detected up to 200 -300 m in 90 % of the cases, above that height they

299 become thermally transparent (**Figure 5d-e**). We note a correlation between bomb content, discriminated 300 by visual inspection, and bomb velocity (**Figure 5f**), bomb-rich explosions displaying the highest values (30-301 50 m/s, with 2 events up to 100 m/s), and ash-dominated ones showing the lowest values (10-20 m/s). We 302 manually tracked a few particles exiting the vent during three selected explosive events using high-speed 303 videos and retrieved speeds in the range 92-331 m/s (04/09, 23:10), 220-460 m/s (05/09, 00:25) and 100-304 500 m/s (05/09, 00:40), respectively. Such values of velocity are in line with values measured at Stromboli 305 and Yasur (Vanuatu) (e.g. Taddeucci et al. 2012, Spina et al.,2016b), and are representative of the highly 306 accelerated portion of the jet at the vent exit. Velocity values measured from the thermal infrared videos are 307 significantly lower because of the lower spatial and temporal resolution of the FLIR thermal camera 308 compared to high-speed one and to the fact that our thermally derived velocities are retrieved from the slope 309 of the bomb's trajectories (**Figure 2**) and thus are to be considered as representing an average velocity of the 310 bomb from the exit position to its maximum elevation.



312 Figure 5: Duration of the event plotted against amplitude of the thermal waveform peak (a) and (b) thermally 313 radiated energy. (c) Amplitude of the thermal waveform peak against thermal energy; bomb vs plume speed 314 (d) and height (e) as computed from time vs height plot of the thermal anomaly (see text); (f) correlation 315 between bomb velocity and bomb index, reflecting purely ash, bomb-free (=0) vs bomb-rich (=1) explosive 316 events.

319 The 72 acoustic signals are characterized by discrete transients, mostly exhibiting a compressive impulsive 320 onset followed by a nearly symmetrical rarefaction peak and by a differently developed coda. These are 321 occasionally related to secondary pulses (confirmed by thermal and high-speed images), as also frequently 322 recognized for other volcanoes (De Angelis et al., 2019). Waveforms variability (Figure 3a and 3b) reflects on 323 the widespread distribution of event durations, spanning 2-22 seconds (Supplementary Figure 1a). The peak-324 to-peak amplitude of the events lies mostly in the range 0-100 Pa; three exceptional high-amplitude events 325 with peak-to-peak amplitude of ca. 184, 272, and 384 Pa lasting around one-tenth of second were observed

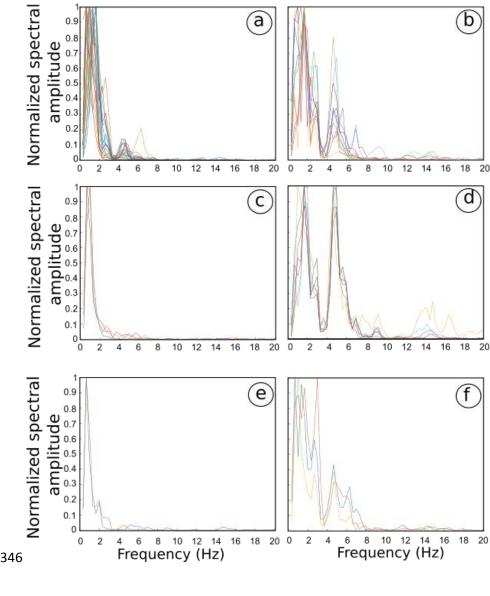
#### 326 (Supplementary Figure 1b).

327 The peak frequency of the acoustic events mostly lies below 1 Hz (Supplementary Figure 1d), whilst mean 328 frequency can reach values up to 15 Hz, with a mean value of 3.5±3, suggesting a relatively broadband 329 spectrum at least for some of the events (Supplementary Figure 1e). The quality factor spans over two orders 330 of magnitude (0.33 up to 50), although it is mostly clustered below 10 (Supplementary Figure 1f). Acoustic 331 energy lies mostly in the range  $10^4$ - $10^9$  J, with few exceptions as low as  $10^2$ J (Supplementary Figure 1g).

332 The exit velocity of gas at the vent has been computed by using equations (4), (5), and (6), assuming different 333 radiation patterns. For a monopole source ranges between 5 and 165 m/s with an average value of 38 m/s. 334 Dipole sources correspond to exit velocity of 44-450 m/s (average 160 m/s) whereas a quadrupole source 335 implies exit velocities between 176 and 999 m/s with an average of 450 m/s.

336 Spectra cross-correlation successfully classified 54 events (up to 75% of the dataset) in six families. Family I, 337 II, and IV gather the highest number of events. All three families include mostly dichromatic spectra (Figure

**6a, b,** and **d**), but with different partitioning of spectral energies among the two peaks. In particular, Family I 339 displays the greatest variability of the dataset and is characterized by the first spectral peak falling in the 340 range 0.66-1.6 Hz and overpowering the higher frequency peak (4.3-4.6 Hz). Family II exhibits relatively 341 higher spectral content on the second peak, at ca. 4.6 Hz compared to the Family I, but the low-frequency 342 peak (0.99-1.6 Hz) still remains dominant in terms of energy. Family IV exhibit an almost perfectly dichromatic 343 spectrum, mostly peaked at 1.6 Hz and 4.6-4.9 Hz. Family III and V are monochromatic and exhibit very low 344 spectral peaks (ca. 0.7-0.99 Hz; **Figure 6c** and **e**). Finally, Family VI has a relative tendency to a broad-band 345 distribution of the spectral energy (**Figure 6f**).

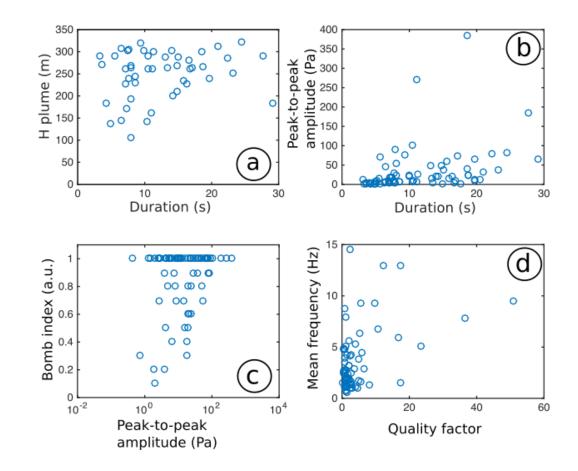


347 Figure 6 (a) to (e) Overlapped normalized frequency spectra of the family I-VI.

#### **5. Discussion**

#### 350 5.1 Eruption dynamics at Batu Tara

351 In the studied period, the correlation among the investigated parameters characterizing acoustic or thermal 352 transients revealed that the duration of the acoustic events tends to be positively correlated with the 353 height of the ash plume (Figure 7a): events lasting longer than 10 seconds exhibit plume height above 180 354 meters. This evidence suggests that longer acoustic events correspond to longer source emission. It is worth 355 noting that thermally detected durations are, on average, from 1.2 to 2 times higher than acoustically 356 detected ones. Acoustic duration does not scale with the peak-to-peak amplitude of the events (Figure 7b; 357 longer events are not necessarily characterized by stronger overpressure, oppositely to the observation of 358 Matoza et al. 2014). Interestingly, comparison to the bomb index suggests that high-amplitude events are 359 related to bomb-dominated explosions (Figure 7c). This observation also matches with the evidence that 360 bomb-dominated explosions display higher velocities of the bombs (Figure 5f) pointing to the evidence that 361 bomb-dominated explosions have more explosive energy than ash-dominated ones. Coherently, at Yasur 362 volcano (Vanuatu) a progressive shift from bomb-rich explosion to ash-rich ones has been linked to 363 progressive volatile reduction and/or increase in magma viscosity (Simons et al. 2020). Finally, with only one 364 exception, acoustic events with Quality factors above 10 (Figure 7d), exhibit mean frequencies above 5 Hz. 365 This suggests that broadband-spectrum-events are related to source processes exhibiting low rates of energy 366 losses.



369 Figure 7: Comparison among different investigated parameters. In (a) and (b) the duration of the acoustic 370 events is plotted against the height of the erupted plume and the peak-to-peak amplitude of the acoustic 371 events, respectively. In (c) the latter is charted together with the bomb index, that provides a qualitative 372 evaluation of the bomb content in the eruptive plume. In (d) the quality factor of the acoustic events 373 computed by Sompi method is plotted against the mean frequency.

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375 Exit velocities of particles at the vent computed from high-speed images fall within the range of 90-500 m/s. 376 This range of values nicely fits gas exit velocities computed for dipole sources (54-464 m/s) that could in fact 377 represent a reasonable choice for short-lived (few tens of seconds) explosive events associated with plumes 378 rising up to their highest elevation within few minutes (De Angelis et al., 2019), despite their inherent 379 uncertainties. Indeed, exit velocities computed following equation (4) to (6) suffer from limits in the 380 assumption and in the spatial sampling of data, as reported in several studies (e. g., Matoza et al., 2013 381 and De Angelis et al., 2019. For instance: 1) waveform inversion demonstrated that the most realistic 382 source models are a combination of monopole (as the injection of mass in the atmosphere) and dipole 383 sources (Johnson et al. 2008) or eventually even higher-order source term (including quadrupole sources 

384 when, for instance, turbulence is dominant) when dealing with sustained eruptions; 2) Matoza et al. (2013) 385 observed that in the absence of good spatial sampling of jet noise directionality, that is in practice usually 386 not possible in volcano acoustic field experiments, the power evaluated might not be representative of the 387 source; 3) the derivation of gas exit velocity from equation (3) neglects the effects of topography and 388 attenuation, factors that have been often demonstrated to be a relevant contribution (De Angelis et al. 2019). 389 Consequently, cross-validation with thermal imagery, here performed, is strongly recommended (De Angelis 390 et al., 2019).

391 The different families of acoustic events identified by spectra cross-correlation can address differences in the 392 geometry of the plumbing system (e.g. Johnson et al. 2018). The analysis of the identified acoustic families 393 suggests that the acoustic source of Batu Tara explosive events correspond to an open-closed pipe resonance 394 of the upper conduit. Noteworthy, pipe resonance associated with the dipole streamline of the acoustic 395 sound field have been postulated (Rayleigh, 1945; Elder, 1992; Chanaud, 2010).

396 Pipe resonance of the volcanic system has been widely documented at different volcanoes worldwide, 397 providing several information on the geometry of the feeding system (e.g. Garces and McNutt, 1997; Jhonson 398 et al. 2018; Yokoo et al., 2019; Witsil and Johnson, 2018; Watson et al. 2020). Watson et al. (2019) 399 investigated the effects of volcanic crater geometries, temperature profiles, gas compositions, and source 400 descriptions on infrasound by a linearized model of quasi one-dimensional (1D) wave propagation inside 401 volcanic crater coupled with 3D axisymmetric radiation into the atmosphere from the crater. They found that 402 crater geometry has a most prominent role compared with temperature and gas composition. A volcanic 403 conduit represents an open-closed pipe resonator open to the atmosphere on one side and having an 404 impedance contrast (e.g., the surface of the magmatic column, the fragmentation level, or a conduit cross-405 section variation) at the other side. In the case of a flanged open-closed pipe resonator, the fundamental 406 frequency is a function of sound speed (c) and resonator length (L) and radius (R<sub>r</sub>) as follows (Kinsler et al. 407 1999):

$$fo = \frac{c}{4(L + \frac{8R_r}{3\pi})}$$

409 Harmonic frequencies are generated as odd multiples of the fundamental. In our case, a fundamental peak 410 corresponding with the main peak at 1.5-1.6 Hz would have a second harmonic at 4.6-4.9 Hz, in agreement 411 with the second peak we observe. This is evident especially in Family IV (**Figure 6d**) and can be hypothesised 412 also for Family I and II that suffer from a much wider distribution of the fundamental frequency due to a 413 higher number of events gathering in the acoustic families, including lower frequencies events (0.6-0.99 Hz). 414 Hence, Family III and V are likely to represent an end-member low-frequency case where harmonics are 415 missing at all. Indeed, monochromatic acoustic infrasound waves have been described and related to conduit 416 pipe resonance at Aso Volcano (Yokoo et al. 2019). For a fundamental frequency in the range 0.6-1.6, 417 assuming a conduit radius equal to 6.5, the length of the conduit resonating span from a minimum value of 418 almost 50 m (assuming c equal to 340 m/s and f0 corresponding to 1.6 Hz) up to a maximum of ca. 290 m 419 (assuming c equal to 700 m/s, equal to that of magmatic gases at eruptive temperature; Weill et al. 1992), 420 and f0 corresponding to 0.6 Hz).

421 The different partitioning of spectral energy among different peaks that motivate family classification can be 422 tentatively explained in analogy with musical instruments such as clarinet, i.e. an open-closed pipe resonator. 423 Computer-based studies addressing the behaviour of a clarinet demonstrated that for the same note (same 424 fundamental and duration) the spectral centroid (i.e. a sort of centre of mass of the spectrum) moves toward 425 higher frequencies with increasing mouth pressure or reed opening (Barthet et al. 2007). We can speculate 426 therefore that differences in the input source triggering the conduit resonance or in the conduit geometry 427 (e.g. flaring), resulting from the erosion or accumulation of products within the vent, are likely to produce 428 the different partition of acoustic energy in the spectra of the sorted families. The latter hypothesis is 429 justified by the evidence of coupling between volcanic flow and conduit shape in time and depth (e.g. 430 Macedonio et al. 1994), that is known to affect seismic and acoustic signals (Johnson et al., 2018, Spina et al., 431 2019), and also by the evidence that the presence of a debris clog or a vent plug can increase the explosivity 432 of the eruption (Del Bello et al., 2015; Capponi et al., 2016).

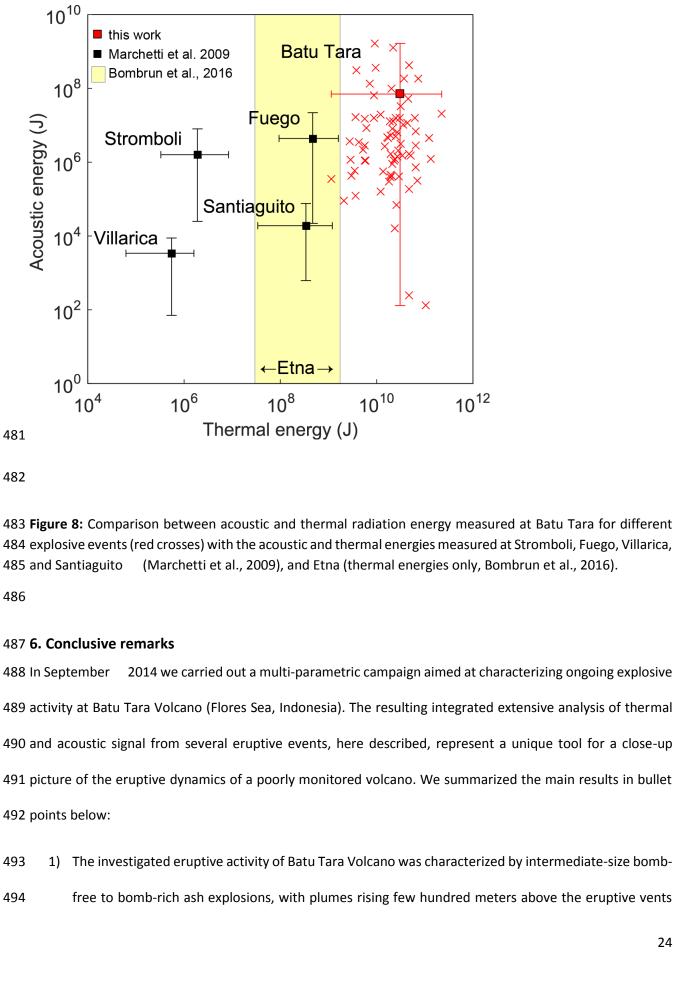
#### 434 5.2 Strombolian or Vulcanian explosions

435 The acoustic amplitudes and durations measured at Batu Tara are comparable to Vulcanian explosions 436 observed at Popocatepetl (Mexico) (e.g. Aràmbula-Mendoza et al., 2013), to violent Strombolian activity at 437 Yasur (Vanuatu) (e.g. Marchetti et al. 2013), to the so called ash-explosions at Karymsky (Russia) (Lopez et 438 al., 2013) and partly to vulcanian explosion at Sakurajima (Japan) (Johnson and Miller, 2014) volcanoes. 439 Explosion duration and mean bomb velocity/height fall well in the range displayed by small Strombolian 440 activity at Etna, Yasur, and Stromboli (Bombrun et al., 2016; Gaudin et al., 2017), despite more frequently 441 observed values of durations at Batu Tara are on the high-end member. Acoustic energy, spanning  $10^2$ - $10^9$  J, 442 overlaps the range found by Marchetti et al. (2009) for Fuego, Stromboli, Villarica and Santiaguito volcanoes 443 (10<sup>1</sup>-10<sup>8</sup>) as closely resembling also values provided for Strombolian eruptions at Aso, Yasur, and Arenal (10<sup>4</sup>-444 10<sup>8</sup>) by Zobin et al. (2019). Thermal energies, spanning 3 orders of magnitude, (10<sup>9</sup> - 10<sup>11</sup>) show minimal 445 overlap and are mostly higher than the values for Strombolian to Fire-fountaining activity at Mt. Etna (10<sup>6</sup>-446 10<sup>9</sup>, Bombrun et al. 2016), and those for Stromboli, Villarica, Santiaguito and Fuego volcanoes (10<sup>5</sup>-10<sup>9</sup>, 447 Marchetti et al., 2009). This is consistent with the general longer thermal duration of the events of Batu Tara 448 compared to Santiaguito, Fuego, and Etna volcanoes, reflecting higher thermal radiation energy values, but 449 cannot be the only factor. According to Marchetti et al. (2009), infrasonic energy reflects the contribution of 450 the gas-thrust phase of the explosion, i.e. the release of over-pressurized gas, whereas thermal radiation 451 energy mostly accounts for the whole explosion dynamics, including the buoyant ascent phase, i.e. the 452 floating ascent of the jet/plume into the atmosphere. In the case of Batu Tara, despite acoustic energies are 453 very similar to those at Stromboli and Fuego (Figure 8), thermal radiation energy exhibits higher values. A 454 dominance of buoyancy processes (as expected when thermal energies are much higher than infrasonic 455 energies) has been related by Marchetti et al. (2009) to the efficiency of fragmentation processes, i.e. to the 456 amount of ash in the explosive jet. Investigated explosions of Batu Tara are all ash-rich, as opposed to 457 those of Stromboli and Fuego, that are more frequently emitting coarsely-fragmented ejecta. Therefore,

458 embracing the same simplifying assumptions as in Marchetti et al. (2009), we assume that despite the 459 amount of gas over-pressure generating Batu-Tara explosions may be similar to Stromboli and Fuego 460 explosive activity, the fragmentation mechanism at Batu Tara could be more efficient, producing higher 461 proportion of fine vs coarse fragments, and thus a different volumetric concentration of the solid fraction in 462 the plume.

463 Such uncertainty in quantitatively discriminating the eruptive type, i.e. Vulcanian or Strombolian, of Batu 464 Tara explosions result from the complexity of establishing a clear boundary for intermediate terms among 465 the two end-members. Intermediate-intensity ash-rich explosions have been widely investigated in the 466 attempt of defining a quantitative classification scheme, often comparing eruptive activity at the same 467 volcanoes and at different volcanoes worldwide. For instance, Matoza et al. (2014) investigated three 468 datasets of acoustic events from Sakurajima, Karymsky, and Tungurahua volcano, finding an inherent 469 complexity and variability in explosion styles at individual volcanoes, and at the same time, bulk similarities 470 (Matoza et al. 2014). Houghton and Gonnermann (2008) attempted to define novel criteria to identify 471 different eruptive styles at basaltic volcanoes and pointed to the lack of clear correlation between eruptive 472 rate/steadiness and style, whereas the duration of the eruptive event is considered a more distinctive 473 parameter. A recent review of the classification schemes for Strombolian activity, based on thermal images 474 and including events from Stromboli, Yasur, Etna and Batu Tara, revealed commonalities in the eruptions, 475 which formed a continuum spectrum sharing the same controlling factors (Gaudin et al., 2017). Our analysis 476 of the explosive activity at Batu Tara supports, within the limits of the investigated temporal window, this 477 view of a continuum spectrum of activity, with no gap separating events that span one to two orders of 478 magnitude in eruption parameters.

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with a frequency of ca. 2-6 events per hour. The associated thermal transients, with duration
 unimodally distributed in the range 2-60 seconds, show energy in the range 1.1x10<sup>9</sup> and 2.2x10<sup>11</sup> J.
 The acoustic signal is composed of discrete transients lasting up to a few tens of seconds, featuring a
 relative waveform variability, acoustic amplitude of ca. 0-300 Pa and energy spanning the range 10<sup>2</sup> 10<sup>9</sup> J.

2) Cross-checking observation from the high-speed cameras with the exit velocity computed from source
 model theory provides a nice fit for a dipole source, and suggests an exit velocity at the vent on the
 order of 50-500 m/s.

3) The spectral properties of the dataset, that are at the base of the sorting of the acoustic events in different families, suggest that the upper portion of the volcanic conduit may act as an open-closed pipe resonator. For fundamental frequencies in the range 0.66-1.6 and assuming acoustic velocities of 340-700 m/s, the length of the resonating conduit falls in the range to 50-300 m. We speculate that different partitioning among spectral peaks likely reflects variable pressure of the source triggering resonance or different flange of the conduit geometry, possibly due to debris clogging/viscous plugging at the vent.

4) Comparison of the investigated dataset with quantitative information on Strombolian or Vulcanian
 explosions at other volcanoes support the hypothesis that eruptive activity occurs within a continuum
 spectrum of activity. Quantitative classification scheme aimed at distinguishing different classes of
 events often fail due to the inherent complexity of the source processes.

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519 Data availability

	520 The dataset used in this work was collected during field campaign by the authors and may be available upon
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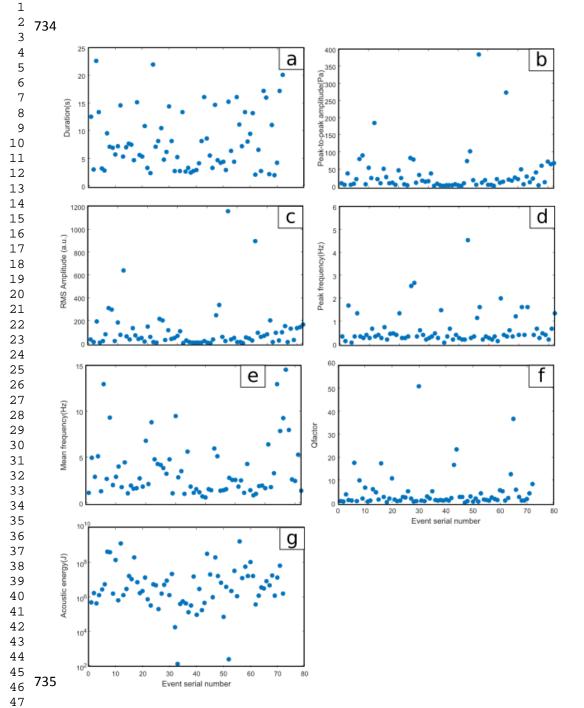
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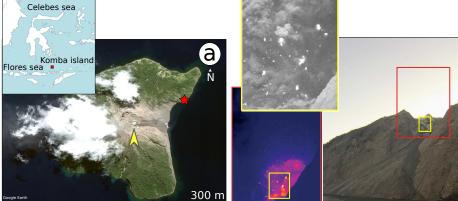




736 Supplementary Figure 1: Results of different analyses in time and frequency domain of the acoustic events associated with explosive activity from Batu Tara volcano. (a) Duration; (b) Peak-to-peak amplitude, (c) Root-Mean-Square amplitude, (d) Peak frequency, (e) Mean frequency (f) Quality factor, (g) Acoustic Energy.

740 Supplementary Video 1: Example of two typical explosions detected at Batu Tara.: a bomb-rich explosion 741 (04/09/2014 12:27:34) and a bomb-free one (05/09/2014 12:04:31), recorded in high-frequency mode (200 742 Hz) with a FLIR thermal camera. The camera FOV is 122x346 m, the real-time duration of the explosion is 4.5 <sup>7</sup> 743 s and 5.9 s, respectively. Some of the largest bombs reach diameters of 5-7 m.

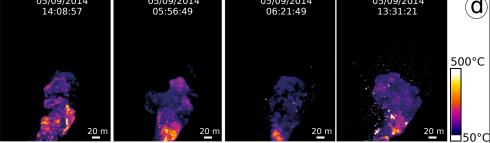
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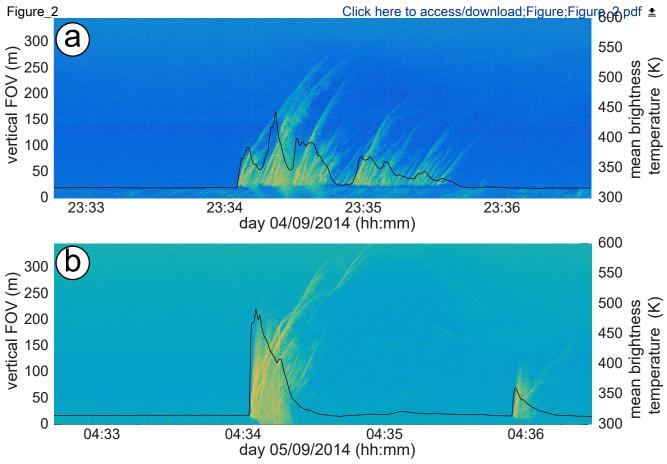


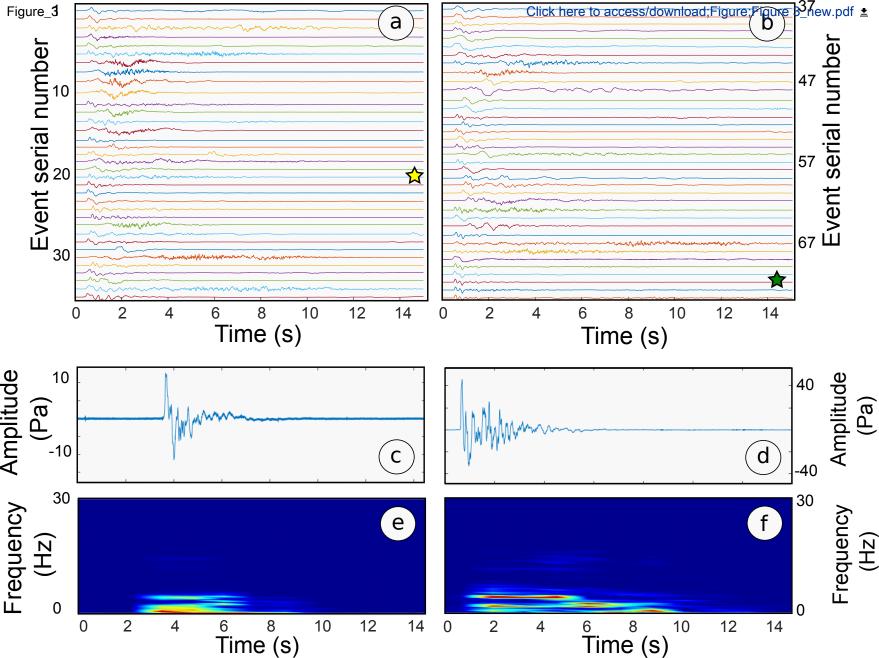
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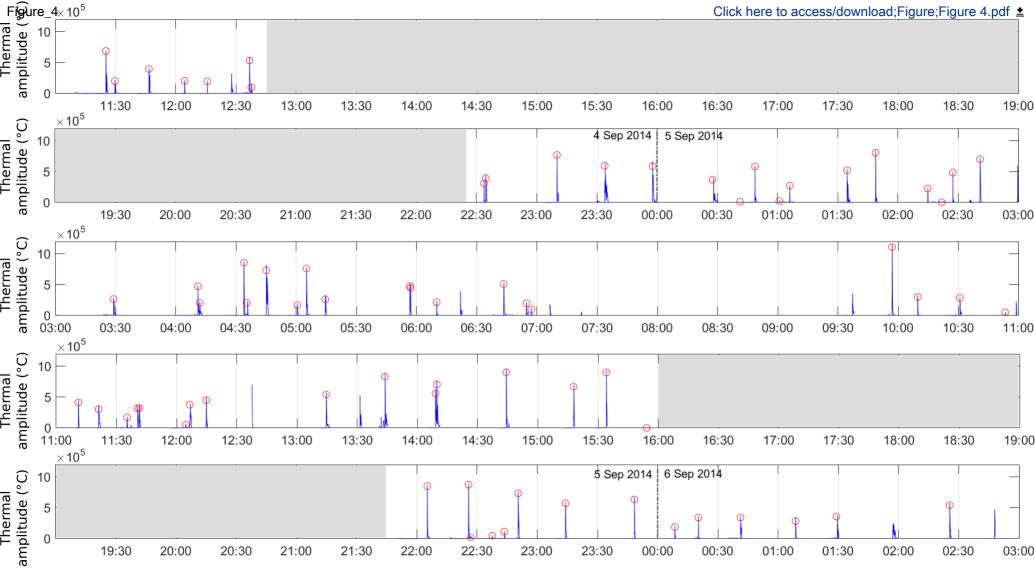
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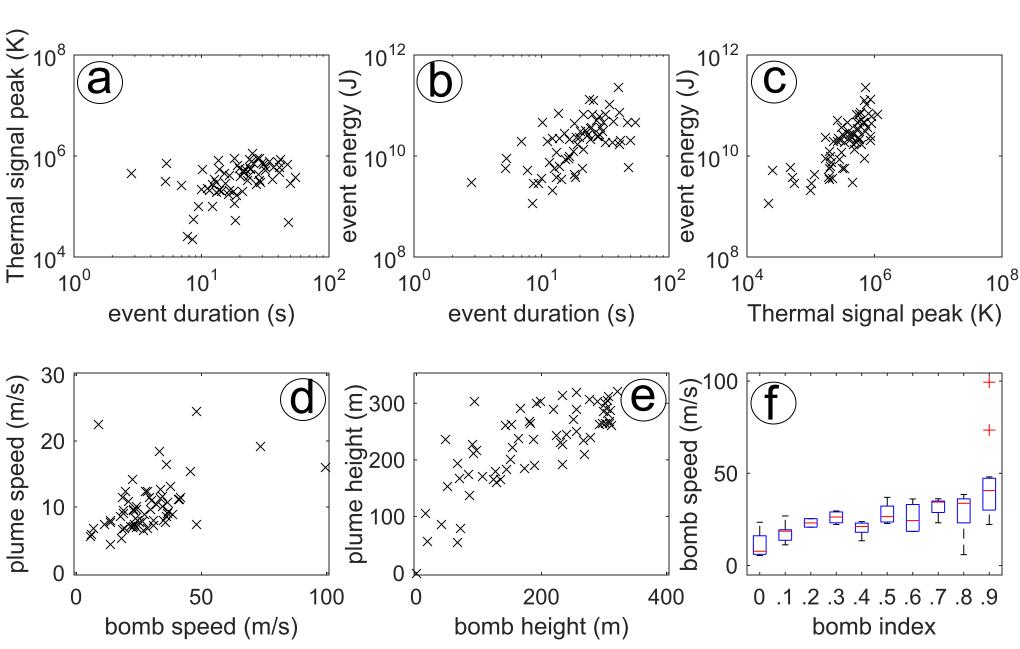


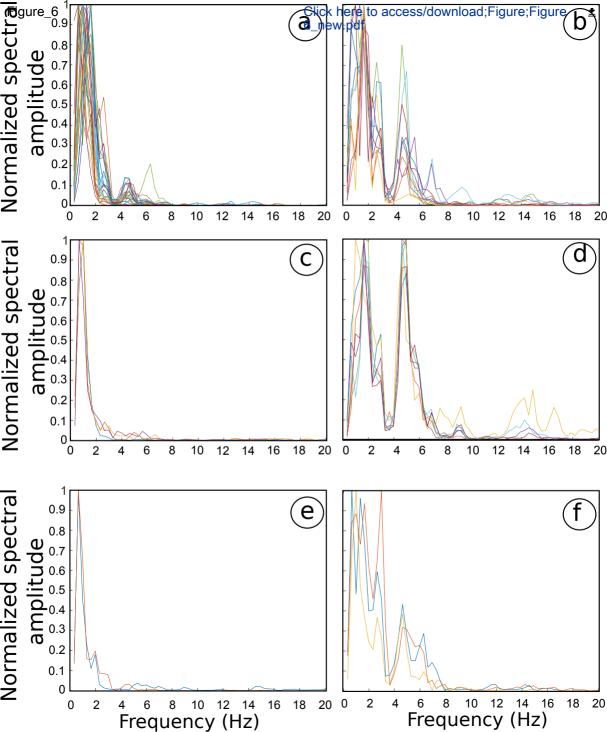


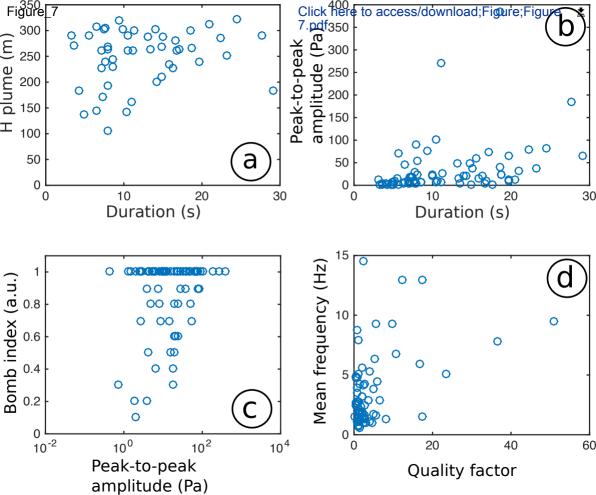


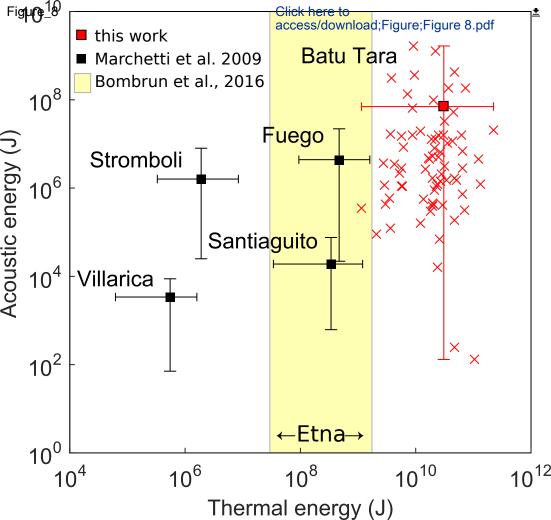
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Author statement

L.S. and E.D.B. performed conceptualization, data analysis procedure and article revising. E.D.B., T.R. and P.S. collected data samples. L.S., E.D.B., T.R., J.T and P.S. wrote the paper and contributed to the interpretation of the results.

Supplementary video

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