# Characterizing Volcanic Ash Density and its Implications on Settling Dynamics

Sing Lau<sup>1</sup>, Roy Gordon Grainger<sup>1</sup>, and Isabelle Alice Taylor<sup>1</sup>

<sup>1</sup>University of Oxford

January 13, 2024

#### Abstract

Volcanic ash clouds are carefully monitored as they present a significant hazard to humans and aircraft. The primary tool for forecasting the transport of ash from a volcano is dispersion modeling. These models make a number of assumptions about the size, sphericity and density of the ash particles. Few studies have measured the density of ash particles or explored the impact that the assumption of ash density might have on the settling dynamics of ash particles. In this paper, the raw apparent density of 23 samples taken from 15 volcanoes are measured with gas pycnometry, and a negative linear relationship is found between the density and the silica content. For the basaltic ash samples, densities were measured for different particle sizes, showing that the density is approximately constant for particles smaller than 100  $\mu$ m, beyond which it decreases with size. While this supports the current dispersion model used by the London Volcanic Ash Advisory Centre (VAAC), where the density is held at a constant (2.3 g cm<sup>-3</sup>), inputting the measured densities into a numerical simulation of settling velocity reveals a primary effect from the silica content changing this constant. The VAAC density overestimates ash removal times by up to 18%. These density variations, including those varying with size beyond 100  $\mu$ m, also impact short-range particle-size distribution measurements and satellite retrievals of ash.

## Characterizing Volcanic Ash Density and its Implications on Settling Dynamics

### Sing Lau<sup>1</sup>, Roy G. Grainger<sup>2</sup>, Isabelle A. Taylor<sup>2</sup>

<sup>1</sup>Atmospheric, Oceanic, & Planetary Physics, University of Oxford, OX1 3PU, Oxford, U.K. <sup>2</sup>COMET, Atmospheric, Oceanic and Planetary Physics, University of Oxford, Oxford, OX1 3PU, U.K.

#### Key Points:

1

2

3

6

7	•	The density of volcanic ash is measured as a function of particle size for a range
8		of eruptions.
9	•	Silica content and particle size negatively correlate with density.
10	•	The density of particles smaller than 100 µm is approximately constant but is de-
11		pendent on silica content.

Corresponding author: Sing Lau, woonsinglau@gmail.com

#### 12 Abstract

Volcanic ash clouds are carefully monitored as they present a significant hazard to hu-13 mans and aircraft. The primary tool for forecasting the transport of ash from a volcano 14 is dispersion modelling. These models make a number of assumptions about the size, spheric-15 ity and density of the ash particles. Few studies have measured the density of ash par-16 ticles or explored the impact that the assumption of ash density might have on the set-17 tling dynamics of ash particles. In this paper, the raw apparent density of 23 samples 18 taken from 15 volcanoes are measured with gas pycnometry, and a negative linear re-19 lationship is found between the density and the silica content. For the basaltic ash sam-20 ples, densities were measured for different particle sizes, showing that the density is ap-21 proximately constant for particles smaller than 100 µm, beyond which it decreases with 22 size. While this supports the current dispersion model used by the London Volcanic Ash 23 Advisory Centre (VAAC), where the density is held at a constant  $(2.3 \text{ g cm}^{-3})$ , inputting 24 the measured densities into a numerical simulation of settling velocity reveals a primary 25 effect from the silica content changing this constant. The VAAC density overestimates 26 ash removal times by up to 18%. These density variations, including those varying with 27 size beyond 100 µm, also impact short-range particle-size distribution (PSD) measure-28 ments and satellite retrievals of ash. 29

<sup>30</sup> Plain Language Summary

Volcanic ash clouds are carefully monitored as they present a significant hazard to 31 humans and aircraft. Dispersion modelling is a primary tool used to forecast ash flows 32 from volcanoes. These models make a number of assumptions about the size, spheric-33 ity (roundness) and density of the ash particles. Few studies have measured the density 34 of ash particles or explored the impact that the assumption of ash density might have 35 on the dispersion forecasts. In this paper, the density of 23 samples taken from 15 vol-36 canoes are measured, and a negative linear relationship is found between the density and 37 the silica content. For the basaltic ash samples (the most common type of ash), densi-38 ties were measured for different particle sizes, showing that the density is approximately constant for particles smaller than 100 µm, beyond which it decreases with size. This 40 supports the London Volcanic Ash Advisory Centre (VAAC) keeping density constant 41 in their current model, but in fact this constant changes with silica content, leading to 42 an overestimation of ash removal times by up to 18%. These density deviations also im-43 pact short-range particle-size distribution (PSD) measurements and satellite retrievals 44 of ash. 45

#### 46 1 INTRODUCTION

Volcanic ash is composed of hard, silicic and abrasive fragments of rock, minerals, 47 and glass. During explosive volcanic eruptions, dissolved gases in magma are heated and 48 expand abruptly, shattering a large amount of magma and rock materials into pyroclast 49 fragments (Kenedi, 2000). These pyroclasts can be catagorized according to diameter 50 into fine ash  $(< 30-60 \text{ }\mu\text{m})$ , ash (< 2 mm), lapilli (2-64 mm), bombs (> 64 mm) (Rose 51 & Durant, 2009; Fisher & Schmincke, 1984). The size of these particles often have the 52 same order of magnitude as the gas bubble that shattered them, and since there is a lower 53 limit of the size of gas bubbles, ash smaller than a few microns are rarely found (Sparks 54 & Wilson, 1976; Rust & Cashman, 2011). 55

Volcanic ash is harmful to humans when inhaled (Gislason et al., 2011; Horwell &
Baxter, 2006; Horwell, 2007), and it poses a risk to aviation even at a large distance from
the vent (Casadevall, 1994; Dunn & Wade, 1994; Pieri et al., 2002; Guffanti & Tupper,
2015). For example, during the 2010 Eyjafjallajökull eruption, a large area of airspace
over Europe was closed for several days to minimize the risk to aviation, causing significant financial losses (Rincon, 2011). This eruption provided the impetus for further de-

velopment of existing dispersion models, measurements, and approaches to manage these
 hazards. (Beckett et al., 2020).

The London Volcanic Ash Advisory Centre (VAAC) provides analysis of volcanic ash dispersion in the North Atlantic and Arctic area, including countries such as the United Kingdom and Iceland. Together with other VAACs around the world, it use a range of measurements, satellite observations, and models to study eruptions, with the primary objective of mitigating aviation risk from ash clouds (Beckett et al., 2020).

The size, shape and density of ash particles have all been shown to influence the 69 maximum travel distance of volcanic ash (Beckett et al., 2015). However, density is usu-70 ally assigned an assumed value due to limited measurements. The London VAAC uses 71 a constant density of  $2.3 \text{ g cm}^{-3}$  in their operational dispersion model, Numerical Atmospheric-72 dispersion Modelling Environment (NAME), which focuses on ash smaller than 100 µm 73 in diameter (Beckett et al., 2020). The ash density is also assumed when estimating the 74 total mass of ash from satellite data (Beckett et al., 2017). In addition, when exploit-75 ing the Doppler shift of ash particles for determining the fall velocity and hence particle-76 size distribution (PSD), the results are very sensitive to the assumptions on density (Bonadonna 77 et al., 2011). 78

There are multiple definitions of density (Webb & Orr, 1997; Vogel et al., 2017).
The following definitions are adopted here:

81	•	Bulk density takes the total volume enveloping the entire particle sample, includ-
82		ing voids between particles.
83	•	Apparent / skeletal density takes the volume of the particle including closed pores
84		(pores that are sealed off from the outside) but excluding open pores.
85	•	Dense-rock-equivalent (DRE) / true density takes the volume of the particle ex-
86		cluding both open and closed pores. It measures the net density of the solid frac-
87		tion.

While travelling in the atmosphere, air molecules may seep into the open pores but not the closed pores of ash particles. Therefore the aerodynamically meaningful density comes from the skeletal structure. Unless otherwise stated, this work uses density to mean the apparent density.

Variations in density may orginate from i) composition, and ii) porosity inside the 92 particle. Ash particles generally follow the composition of the magma they originate from. 93 They can be classified by a total alkali-silica (TAS) diagram, which plots  $K_2O/Na_2O$ (alkaline) versus  $SiO_2$  (silica) content for volcanic rocks. Alkalinity in volcanic ash is rel-95 atively low in the TAS diagram, such that it is sufficient to group ash into four major 96 types of magma based on silica content (Krishnan et al., 2017). In terms of percentage 97  $SiO_2$  by weight, they are basalts (41-54%), and esites (54-63%), dacites (63-70%), and rhyolites (65-75%) (M. Wilson, 1989). The boundaries are not clear-cut: for example 99 "basalt-andesites" would describe a transitional composition between the two categories. 100 Vogel et al. (2017) used water pycnometry to show that the DRE density decreases with 101 a linear trend as silica content increases, suggesting that silica content can be the dom-102 inant predictor of density of non-porous pyroclasts. 103

While silica-rich magma has higher dissolved gas content, it is also more viscous, enabling more explosive eruptions (Parfitt & Wilson, 2009). This process further introduces gas into the solidifying pyroclast, causing the pumice and ash formed from these magma to be more porous. Porosity and particle size are also closely related. If a large porous pyroclast breaks down into smaller pieces, the larger fragments could encapsulate more and larger closed pores and hence have a lower density. Therefore, a decreasing density is expected with increasing size for a given ash composition. Finer particles can travel a long distance in air before falling out, and fuse with larger grains that act as a core in a process known as aggregation (Rossi et al., 2021). This effect altering the particle size and density, but it is prominent only when the particle concentration is high (Del Bello et al., 2017), so any identified aggregates are measured separately.

Many prior studies used simplified density-size models: for example, L. Wilson and Huang (1979) studied clasts collected from the equatorial Pacific and São Miguel, Portugal; measuring the dimensions of particles individually. They presented a model which fixed the densities for large (>300 μm) and small (<88 μm) particles, and fitted densities for intermediate sizes with linear interpolation (shown in Figure 1 as 'General model').

In the basaltic range, Beckett et al. (2015) established a density model based on scattered data from Eyjafjallajökull in Bonadonna et al. (2011). It used a piece-wise linear fit to interpolate the sparse data, and is referred to as 'EYJ 2010 model' in Figure 1 and the rest of this paper.



Figure 1. Summary of representative current models and data relating apparent density  $\rho$  and particle diameter d.

In the andesitic range, Bonadonna and Phillips (2003) presented another model ('an-125 desitic model' in Figure 1), similarly interpolated, based on scattered data from the 1991 126 eruption of Mount Hudson in Scasso et al. (1994). The original scattered data measured 127 how the mean particle diameter and the apparent density of unsieved ash samples var-128 ied with distance from the vent. The samples consisted of a mix of all ash sizes, and the 129 data points for the two measured quantities were attributed to different distances; there-130 fore, only a rough trend line can be inferred by relating the lines of best fit, and is pre-131 sented in Figure 1 as 'andesitic data fit'. 132

In the rhyolitic range, Bonadonna and Phillips (2003) interpolated a similar model based on scattered data from Askja, provided in Sparks et al. (1997); this model is presented in Figure 1 as 'rhyolitic model'. Pistolesi et al. (2015) measured density using water pycnometry of ash from the 2011 Cordón Caulle eruption, Chile. They showed an
approximately linear decrease between log diameter and density for pyroclast diameters
between 500 and 16,000 µm ('rhyolitic data fit' in Figure 1), providing some support for
linear models. However, water pycnometry does not measure apparent density well (Richards & Bouazza, 2007), and the minimum particle size measured was 500 µm, which is larger
than a lot of ash produced.

Measurements of larger pyroclasts have been more abundant than ash. For example, Sparks et al. (1981) measured larger pyroclasts from the 1875 Askja eruption, and found that density generally decreases with size for diameters between 11,000 to 90,000 µm. Despite these findings, the detailed relationship between particle size and density has remained incomplete. In many cases, the diameter coverage was partial; some relied on other assumed relationships or water pycnometry.

In this study, the density of 22 ash samples from 15 volcanoes measured with a pycnometer, are presented. The measured densities are compared with the ash composition, and for some of the samples, against the particle size. Finally, the implications of density variations on ash settling dynamics, and the impacts of applying these measured density in dispersion models are explored.

153

### 2 METHODOLOGY

#### 154

164

#### 2.1 Ash Density Measurements

Apparent density measurements were conducted using a nitrogen gas pycnometer. 155 Gas pycnometry applies the ideal gas law to determine the skeletal volume of samples 156 in a chamber by varying the size of the chamber and measuring the pressure change (Webb 157 & Orr, 1997). Nitrogen is used to best study the apparent density and permeability of 158 the ash particles in the atmosphere (open pores that are smaller than its molecular size 159 will be discounted). Water vapour affects both the actual density and the ideal gas law 160 calculations, so the ash samples were dried in a 98°C oven for over 48 hours to ensure 161 moisture was sufficiently evaporated. While humidity varies in the atmosphere, this study 162 aims to provide a standardized perspective by measuring the dry density. 163

- The density of 23 unsieved raw ash samples originating from 15 volcanoes around the world were measured. Table 1 and Figure 2 present their locations and specify the abbreviations used for the samples. To ensure fair representation, the original jars of raw ash were gently mixed by rotation. When extracting samples to measure in the pycnometer, large (~ 8 mm) outliers were not included. The details of the samples are recorded in Reed (2016) alongside silica content.
- 2. Volcanic ash is most commonly basaltic (Walker, 1993), and our basaltic samples 171 are large enough to be further sieved for measurements. In particular, samples from 172 Mount Aso (VA1), Eyjafjallajökull (VA7), and Grímsvötn (VA4, 5) were sieved 173 into different diameter groups. For larger particles (> 2 mm in diameter), parti-174 cles were handpicked and measured with a caliper. Densities were then measured 175 for each particle size sample. For Grímsvötn, two sets of samples, from close (200 176 m from vent) to distal region (50 km from vent) are measured. There is a one-week 177 interval between the collection dates of these two samples. 178

#### <sup>179</sup> 2.2 Fall Velocity and Time of flight

The measured data are used to compute fall velocity and time of flight in the atmosphere, with atmospheric data at different altitudes interpolated from the US Standard Atmosphere (NASA, 1976).



Figure 2. A map showing the 15 sources of 23 ash samples. Abbreviations and information are detailed in Table 1.

The general expression for drag force  $F_{\rm D}$  on a particle with cross-sectional area A, travelling at velocity v in a fluid with density  $\rho_{\rm f}$  and dynamic viscosity  $\eta$  is:

$$F_{\rm D} = \frac{1}{2} C_{\rm D} \rho_{\rm f} A v^2 \tag{1}$$

where  $C_{\rm D}$  represents the drag coefficient. The particle reaches terminal velocity when its own weight balances out with this drag force and buoyancy. Assuming a spherical particle with diameter d, apparent density  $\rho$  and gravitational acceleration g:

<sup>189</sup> 
$$\frac{4}{3}\pi \left(\frac{d}{2}\right)^3 (\rho - \rho_{\rm f})g = \frac{1}{2}C_{\rm D}\rho_{\rm f}Av^2 \tag{2}$$

<sup>190</sup> implying that the terminal velocity  $v_T$  is

185

191

192

193

$$v_T = \sqrt{\frac{4}{3C_{\rm D}} \frac{\rho - \rho_{\rm f}}{\rho_{\rm f}} dg} \tag{3}$$

 $C_{\rm D}$  itself depends on the Reynold's number Re, defined as

$$Re = \frac{vd\rho_{\rm f}}{\eta} \tag{4}$$

<sup>194</sup> White and Majdalani (2006) describes the drag coefficient for spherical particles <sup>195</sup> for Re between 0 and  $2 \times 10^5$  with

196 
$$C_{\rm D} = \frac{24}{Re} + \frac{6}{1 + \sqrt{Re}} + 0.25 \tag{5}$$

In general, ash particles are sufficiently small such that terminal velocity can be treated as a constant fall velocity (also known as settling velocity). Therefore, this set of equations explicitly determines the settling velocity of spherical particles (and hence the time of flight and maximum drift distance). A non-spherical particle falls at a lower speed than its spherical equivalent, increasing the dispersion range (Beckett et al., 2015). For example, a 30 µm particle with sphericity  $\Psi = 0.4$  travels 30% further than its spherical counterpart.

Volcano (Abbrev.)	No.	Type	Distance from vent	Collection date	Estimated eruption	% SiO2	ρ <sub>us</sub> / g cm <sup>-3</sup>
Mount Aso, Japan (ASO)	VA1	Basaltic	< 400 m	1993	1993	52.6	2.80
Eyjafjallajökull, Iceland (EYJ)	VA2	Basaltic	$6 \ \mathrm{km}$	17/4/2010	2010	55.6	2.65
Eyjafjallajökull, Iceland (EYJ)	VA3	Basaltic		4/2010	14/4/2010	57.8	2.68
Eyjafjallajökull, Iceland (EYJ)	VA7	Basaltic	$5 \ \mathrm{km}$	13/6/2010	19-20/5/2010	58.5	2.57
Eyjafjallajökull, Iceland (EYJ)	VA8	Basaltic	$4.5~\mathrm{km}$	13/6/2010	19-20/5/2010	59.2	2.66
Eyjafjallajökull, Iceland (EYJ)	VA9	Basaltic	$5 \ \mathrm{km}$	13/6/2010	19-20/5/2010	58.8	2.62
Eyjafjallajökull, Iceland (EYJ)	VA15	Basaltic		15 - 16/5/2010	2010	58.0	2.68
Grímsvötn, Iceland (GRI)	VA4	Basaltic	200  m	1/6/2011	21 - 28/5/2011	49.1	2.76
Grímsvötn, Iceland (GRI)	VA5	Basaltic	$50~\mathrm{km}$	25/5/2011	21 - 28/5/2011	49.4	2.76
Mount Etna, Italy (ETN)	VA6	Basaltic	$10 \ \mathrm{km}$	27 - 30/12/2002	10/2022- $1/2023$	47.0	2.58
Mount Etna, Italy (ETN)	VA10	Basaltic		1/7/2001	10/2022- $1/2023$	47.6	2.83
Mount Etna, Italy (ETN)	VA14	Basaltic	$26 \ \mathrm{km}$	1/11/2002	10/2022- $1/2023$	47.1	2.85
Chaitén, Chile (CHA)	VA11	$\operatorname{Rhyolitic}$		2008	2008	73.2	2.36
Dabbahu, Ethiopia (DAB)	VA12	$\operatorname{Rhyolitic}$	Very close	9/2005	26/9/2005	71.1	2.37
Mount Tongariro, New Zealand (TON)	VA16	Andesitic	·	2012	2012	59.4	2.60
Askja, Iceland (ASK)	VA17	$\operatorname{Rhyolitic}$		1981	1875	70.7	2.35
Fontana Tephra, Nicaragua (FLD)	VA18	Basalt-andesitic			Late Pleistocene	,	2.62
Nisyros, Greece (NIS)	VA19	Rhyo-dacitic		2011		69.7	2.42
Mount Okmok, Alaska, USA (OKM)	VA20	Basalt-andesitic		7/2008	7/2008	,	2.74
Augustine, Alaska, USA (AUG)	VA21	Andesitic		13/1/2006	2005 - 2006		2.64
Mount Spurr, Alaska, USA (SPU)	VA22	Basalt-andesitic		8/1992	6-8/1992	ı	2.73
Mount Redoubt, Alaska, USA (RED)	VA23	Andesite-dacitic	ı	1990	1989-1990	,	2.68
Campi Flegrei. Italv (CFL)	VA24	Basaltic	I		I	ı	2.42

Table 1. Raw unsieved ash density All  $\rho_{\rm us}$  have a 2% uncertainty. The list of respective magma and ash type is gathered from Miyabuchi et al. (2006); Keid-

-7-

#### <sup>204</sup> **3 RESULTS**

205

213

216

#### 3.1 Unsieved ash density

Table 2 presents the skeletal densities of the 23 unsieved ash samples. The raw data can be accessed from Lau et al. (2023) or Supporting Information: Dataset S1. Mass percentage of SiO<sub>2</sub> content values were measured using X-ray fluorescence (XRF) analysis by G. Prata et al. (2019). Figure 3 shows the measured unseived ash density  $\rho_{us}$  versus silica content (%SiO<sub>2</sub>). Before fitting a straight line, an outlier from Mount Etna containing a large amount of biomass was removed. The results show that higher silica content correlates to a lower density in a linear relationship,

$$\rho_{\rm us} = -0.016(\% {\rm SiO}_2) + 3.54. \tag{6}$$

The function between DRE density  $\rho_{\text{DRE}}$  and silica content measured by Vogel et al. (2017) is

$$\rho_{\rm DRE} = -0.019(\% {\rm SiO}_2) + 3.90. \tag{7}$$

 $_{217}$  Given the similarity of these correlations and  $\rho_{\rm us}$  having a lower offset than  $\rho_{\rm DRE}$  sug-

218 gest porosity plays a systematic role in determining ash density.



Figure 3. Unseived ash density versus silica content. A line of best-fit can be described by  $\rho_{\rm us} = -0.016(\% {\rm SiO}_2) + 3.54$ . An obvious outlier (lower left) has been removed from the fit. It is a sample from Mount Etna which contains a large amount of biomass that is hard to remove. Uncertainties in SiO<sub>2</sub> are taken as 1%, the typical maximum uncertainty of XRF analysis (Rousseau, 2001). Uncertainty in  $\rho_{\rm us}$  is 2%.

#### 3.2 Density-size distribution

Figure 4 shows the measured relationships between particle size and density for Ey-220 jafjallajökull, Grímsvötn, and Mount Aso ash samples. The raw data can also be accessed 221 from Lau et al. (2023) or Supporting Information: Dataset S1. The densities follow a 222 similar pattern being constant at lower particle sizes, and then decreasing as the size in-223 creases. To fit the data, two candidate models were tried: piece-wise linear (PL), and 224 smooth piece-wise quadratic (SPQ). Samples with fewer than 10 particles were excluded 225 from the fits. Writing  $x = \log d$  where d is in µm, these models are specified respectively 226 as: 227

ł

229

$$p = \begin{cases} k & x < x_0 \\ m(x - x_0) + k & x \ge x_0 \end{cases}$$
(8)

$$\rho = \begin{cases} k & x < x_0 \\ m(x - x_0)^2 + k & x \ge x_0 \end{cases} \tag{9}$$



Figure 4. Particle density-size distribution for Eyjafjallajökull (EYJ), Grímsvötn (GRI Proximal/ Distal), and Mount Aso (ASO), alongside lines of best fit following either a piece-wise linear or a smooth piece-wise quadratic function (Equations 10-13). Models by London VAAC and one assumed by Bonadonna et al. (2011) ("EYJ 2010 model") are overlaid on the diagrams. Large circle markers indicate regular samples; squares and small circles indicate small (<10 particles) and single-particle samples. A cross in the second diagram indicates aggregates. Only the regular samples are used in fitting the functions. The fourth diagram shows the ratio of the four measured density fits versus the two referenced models. The shaded region in each graph concerns particles formally defined as "lapilli" instead of "ash".

Naturally one would expect a smooth transition between the flat and the sloping parts of the function, but owing to the preferable simplicity of the PL model, smoothness can be compromised. For the SPQ model, smoothness is demanded by setting the formula in this form. Both models have three parameter degrees of freedom  $(k, m, x_0)$ . A reduced chi-squared test is performed to determine the better model for each source. The best model for each one is (in g cm<sup>-3</sup>): Eyjafjallajökull (SPQ,  $\chi^2 = 0.143$ ):

237

239

241

243

$$\rho = \begin{cases}
2.68 & x < 2.78 \\
-0.39(x - 2.78)^2 + 2.68 & x \ge 2.78
\end{cases}$$
(10)

Grímsvötn (Proximal—200 m from vent) (SPQ,  $\chi^2 = 0.150$ ):

$$\rho = \begin{cases} 2.85 & x < 1.99\\ -0.33(x - 1.99)^2 + 2.85 & x \ge 1.99 \end{cases} \tag{11}$$

Grímsvötn (Distal—50 km from vent) (SPQ,  $\chi^2 = 0.848$ ):

$$\rho = \begin{cases} 2.81 & x < 1.94 \\ -0.24(x - 1.94)^2 + 2.81 & x \ge 1.94 \end{cases} \tag{12}$$

Aso (PL,  $\chi^2 = 0.204$ ):

$$\rho = \begin{cases} 2.71 & x < 2.64 \\ -0.23(x - 2.64) + 2.71 & x \ge 2.64 \end{cases} \tag{13}$$

The constant portions confirm again that the higher the silica content, the lower the DRE density.

For Eyjafjallajökull, the samples were collected 6 km away from the vent. The measurements of finer ash plateaus to a similar DRE density as the EYJ 2010 model and other models presented in Figure 1. A striking difference is that the density starts decreasing at a much larger diameter (around 600 µm) than the EYJ 2010 model assumed (10 µm) (Figure 4, top left). In fact, measurements from all three sources support a later turning point than the previous models.

For Grímsvötn, the density plots are similar for ash samples collected at 200 m and 45 km from vent (Figure 4, top right), suggesting that the density is unlikely to be sensitive to sampling location (cf. grain size distribution). This would also suggest that one does not need to collect an excessive amount of samples to characterize ash density from an eruption.

For Aso, a PL model is adopted, contrary to the prior two sources (Figure 4, bottom left). However, the difference in function is most likely statistical, as the  $\chi^2$  evaluated with the two candidate functions are very close. The sample contains a mix of different colours, suggesting a wide range of compositions which may vary in abundance in difference size groups.

The measurements show that individual variations in density can be quite large. This is unsurprising as the existence of pores in a particle is probabilistic. Bonadonna and Phillips (2003) suggest that while pumice particle density would decrease substantially, lithic particles, which are a minor composition in ash, have a constant density. This is consistent with our data. Aggregates are also denser than individual particles on the same size, as they are composed of fine particles held together with much smaller closed pores.

Although silica-rich ash (e.g. Aso) are more porous, density falls off slower. Together with the observation from the silica content before, this suggests the dual role of pores while more pores might lead to a hollower structure (lower density), to a certain extent the open pores might be populous enough to connect through the inner pores, discounting them from the particle volume and increasing density.

#### <sup>274</sup> 4 IMPLICATIONS

To assess how the new density measurements will affect ash settling dynamics, Equa-275 tions (1)-(5) were used to estimate settling velocity for spherical ash particles. Figure 5 276 shows settling velocity  $v_{\rm T}$  as a function of particle diameter for the EYJ 2010 model, the 277 VAAC model, and the new density data. The values of  $\rho_{\rm f}$  and  $\eta$  at zero altitude from 278 the US Standard Atmosphere (NASA, 1976) were used as an estimation. There is a max-279 imum of 40 % difference between the  $v_{\rm T}$  calculated from the measurements and the VAAC 280 density in the ash range (<2000  $\mu$ m); even only in the fine ash range (~10  $\mu$ m), a max-281 imum of 25% difference can be found. 282



Figure 5. The left panel presents the settling velocity  $v_{\rm T}$  versus particle diameter *d* calculated using the new density measurement fits (Equations 10-13) and the predictions of the VAAC and EYJ 2010 models. A zoom for *d* between 0 and 100 µm is included. The right panel shows the ratio between the calculated  $v_{\rm T}$  and the model predictions (i.e. the solid coloured lines divided by the dashed lines in the left panel). The shaded region in each graph concerns particles formally defined as "lapilli" instead of "ash".

This substantially modifies the relationship between settling velocity and particle 283 size, which is crucial in dispersion models. Beckett et al. (2015) compared the EYJ 2010 284 model and the VAAC model at particle diameters of 30 and 100 µm using NAME. At 285 these sizes, densities from these two models differ by 4-9%. This leads to a 4-8% dif-286 ference in  $v_{\rm T}$  and a 4% simulated difference in maximum horizontal distance D from the 287 vent reached by the particles for the Eyjafjallajökull eruption. For the same volcanic source, 288 the new density measurements show a 17% difference from VAAC values for both these 289 sizes, implying a 14-16 % difference in  $v_{\rm T}$ . This suggests a change in D above 10 % de-290 pending on the atmosphere; other processes that are considered in operational disper-291 sion models, such as atmospheric stability, wind, and aerosol microphysics, have not been 292 included in this estimation. The fact that VAAC currently uses the same density for all 293 events causes an even larger difference for some sources—for example, within the particle-294 size range of NAME (<100 µm), the measured ash densities from Grímsvötn (Proximal) 295 would give a 20-23 % difference in  $v_{\rm T}$  from the VAAC model. This arises from density 296 variations with silica content (Figure 3). 297

An alternative method to assess density effects is through calculating the time of flight of particles. Grímsvötn (Proximal) ash density is used in this simulation as it deviated the most from the VAAC model (Figure 5). Neglecting aggregation, Figure 6 shows the time  $t_{\text{fallout}}$  it takes for ash of different diameters to fall from an initial height of 20 km. The right panel also shows the ratio of this fallout time predicted by the various distributions. Results show that the measured ash would fallout up to 18% quicker than

in the VAAC model. For example, 10 µm fine ash would be removed from the plume five 304 days earlier than the VAAC prediction, which is a significant modification for decision-305 making such as airspace closures. 306

Figure 6 also demonstrates that an unsieved density (corresponding to Table 1) used 307 for all particle sizes approximates the behaviour of the exact density function well for 308 particles smaller than 100 µm. This reiterates that while the size-density relationship might 309 be a secondary factor to finer ash dispersion, density variations due to silica content could 310 not be ignored. Although obtaining sample densities close to eruption times is a chal-311 312 lenge, the results suggest that even a coarse density estimate based on, for example, underlying magma type, could improve the simulations reasonably. 313



Figure 6. Fallout time from an altitude of 20 km of the characterized proximal ash from Grímsvötn (GRI), in comparison with the VAAC model. In addition, a model (GRI unsieved) where the unsieved ash density (Table 1) is kept constant is compared here. Atmospheric data at different altitudes are interpolated from the US Standard Atmosphere (NASA, 1976).

315 316

Moreover, a direct impact of the relationship between fall velocity and size is a change 314 in the short-range measurement of particle-size distribution based on the Doppler effect (Bonadonna et al., 2011). The EYJ 2010 model is an example of a calibrating model that correlates density with size, and hence terminal velocity with size according to Equation 317 (3). For larger particles from Grímsvötn (Proximal), a 40% difference in attributed fall 318 velocity from the EYJ 2010 model could lead to a two-fold difference in the PSD (Fig-319 ure 6). Satellite retrievals of ash using infrared measurements will also be impacted by 320 improved estimates of density as the estimate of mass loading is a linear function of den-321 sity. For example A. Prata et al. (2022) used a density of  $2.3 \,\mathrm{g \ cm^{-3}}$  to estimate mass 322 loading for the 2019 Raikoke eruption. Measurements of airfall ash give a  $SiO_2$  content 323 of  $\sim 50\%$  (Smirnov et al., 2021) implying an ash density from Equation (6) of 2.74 g cm<sup>-3</sup>. 324 i.e. a 18% difference in the estimate of mass loading. 325

#### 5 CONCLUSION 326

Density measurements of ash particles with nitrogen gas pycnometry have revealed 327 a notable deviation from previous models. The measured density decreases for larger par-328 ticles due to increased closed pores, while generally decreasing with larger silica content. 329 However, this decrease due to size takes place prominently only for diameters substan-330 tially greater than 100 µm, before which the density remains constant at the DRE value. 331

While this supports the London VAAC using a constant density within the particle size range of NAME, silica content changes this constant. In the basaltic ash range studied, this behaviour leads to a settling velocity deviation of up to 23 % from the current VAAC density model for dispersion analysis, and up to around 40 % from the EYJ 2010 model, an example that can be used to infer PSD. The results demonstrate the importance of characterizing ash density in dispersion forecasts, satellite retrievals and other velocitysensitive tasks.

#### **6** Open Research

The raw data of density measurements in the study are available (open access) at Oxford University Research Archive (ORA) via DOI 10.5287/ora-r1dqbnpab (Lau et al., 2023), or in Supporting Information: Dataset S1.

#### 343 Acknowledgments

SL's work was completed as part of a summer studentship funded by the NERC Centre for Observation and Modelling of Earthquakes, Volcanoes, and Tectonics (COMET), a partnership between UK Universities and the British Geological Survey. RGG was supported by NERC (grant no. NE/S003843/1). RGG and IAT were supported by COMET and by NERC (grant no. NE/S004025/1).

We thank Prof. David Pyle (Department of Earth Sciences, University of Oxford) for lending us ash sieves. We also thank Tony Hurst, Evegenia Ilyinskaya, Árman Höskuldsson, Elisa Carboni, Daniel Peters, Simona Scollo, Tasmin Mather, Clive Oppenheimer, Giardini Naxos, Susan Louglin, and Keith Towers for collecting the ash samples used in this research.

#### 354 **References**

355	Andronico, D., Cristaldi, A., Del Carlo, P., & Taddeucci, J. (2009). Shifting styles
356	of basaltic explosive activity during the 2002–03 eruption of Mt. Etna, Italy.
357	Journal of Volcanology and Geothermal Research, 180(2-4), 110–122.
358	Beckett, F., Kylling, A., Sigurðardóttir, G., von Löwis, S., & Witham, C. (2017).
359	Quantifying the mass loading of particles in an ash cloud remobilized from
360	tephra deposits on iceland. Atmospheric Chemistry and Physics, 17(7), 4401-
361	4418.
362	Beckett, F., Witham, C., Hort, M., Stevenson, J., Bonadonna, C., & Millington,
363	S. (2015). Sensitivity of dispersion model forecasts of volcanic ash clouds to
364	the physical characteristics of the particles. Journal of Geophysical Research:
365	Atmospheres, 120(22), 11-636.
366	Beckett, F., Witham, C., Leadbetter, S., Crocker, R., Webster, H., Hort, M.,
367	Thomson, D. (2020). Atmospheric dispersion modelling at the london vaac:
368	A review of developments since the 2010 Eyjafjallajökull volcano ash cloud.
369	Atmosphere, 11(4), 352.
370	Bonadonna, C., Genco, R., Gouhier, M., Pistolesi, M., Cioni, R., Alfano, F.,
371	Ripepe, M. (2011). Tephra sedimentation during the 2010 Eyjafjallajökull
372	eruption (Iceland) from deposit, radar, and satellite observations. Journal of
373	Geophysical Research: Solid Earth, 116(B12).
374	Bonadonna, C., & Phillips, J. C. (2003). Sedimentation from strong volcanic plumes.
375	Journal of Geophysical Research: Solid Earth, 108(B7).
376	Casadevall, T. J. (1994). The 1989–1990 eruption of Redoubt volcano, Alaska: im-
377	pacts on aircraft operations. Journal of volcanology and geothermal research,
378	62(1-4), 301-316.
379	Cole, R., White, J., Conway, C., Leonard, G., Townsend, D., & Pure, L. (2018).

380	The glaciovolcanic evolution of an andesitic edifice, South Crater, Tongariro
381	volcano, New Zealand. Journal of Volcanology and Geothermal Research, 352,
382	
383	Del Bello, E., Taddeucci, J., Scarlato, P., Andronico, D., Scollo, S., Kueppers, U.,
384	others (2017). Effect of particle volume fraction of the setting velocity of vol-
385	canno así particles: insights from joint experimental and numerical simulations. Scientific reports $7(1)$ 1 11
386	Durn $M C$ is Wede D (1004). Influence of velocities of eloude on reactivities
387	onginos In Volcanic ash and aviation safety: Proceedings of the first interna
388	tional symposium on volcanic ash and aviation safety (Vol. 2047, p. 1070117)
389	Fishelberger I C Keith T E Miller T P & Nyo C I (1005) The 1002
390	eruptions of Creter Peak vent Mount Spurr volcano Alaska: chronology and
391	summary US Geol Surv Bull 2139 1–18
392	Esposito B Badescu K Steele-MacInnis M Cannatelli C De Vivo B Lima
393	Esposito, R., Dadescu, R., Steele-Machinis, M., Califiatelli, C., De Vivo, D., Ellia, Magnetic ovolution of the compi florroi
394	and procide volcanic fields italy based on interpretation of data from well
395	constrained melt inclusions Earth-Science Reviews 185 325–356
390	Field I. Blundy, J. & Virgu, C. (2008) The magnetic evolution of Dabbahu
397	volcano Afar Ethionia In ACU fall meeting abstracts (Vol 2008 np V21B-
300	2103)
400	Fisher B V & Schmincke H-II (1984) Pyroclastic fragments and deposits In
401	Puroclastic rocks (pp. 89–124). Springer.
402	Francalanci I. Varekamp I. Vougioukalakis G. Delant M. Innocenti F. &
40.3	Manetti, P. (1995). Crystal retention, fractionation and crustal assimilation in
404	a convecting magma chamber. Nisvros volcano, Greece. Bulletin of Volcanol-
405	oqy, 56(8), 601-620.
406	Gislason, S. R., Hassenkam, T., Nedel, S., Boyet, N., Eiriksdottir, E. S., Alfredsson,
407	H. A., others (2011). Characterization of Evjafjallajökull volcanic ash
408	particles and a protocol for rapid risk assessment. <i>Proceedings of the National</i>
409	Academy of Sciences, 108(18), 7307–7312.
410	Guffanti, M., & Tupper, A. (2015). Volcanic ash hazards and aviation risk. In Vol-
411	canic hazards, risks and disasters (pp. 87–108). Elsevier.
412	Haddadi, B., Sigmarsson, O., & Larsen, G. (2017). Magma storage beneath
413	grímsvötn volcano, iceland, constrained by clinopyroxene-melt thermobarome-
414	try and volatiles in melt inclusions and groundmass glass. Journal of Geophys-
415	ical Research: Solid Earth, $122(9)$ , $6984-6997$ .
416	Horwell, C. J. (2007). Grain-size analysis of volcanic ash for the rapid assessment of
417	respiratory health hazard. Journal of Environmental Monitoring, $9(10)$ , 1107–
418	1115.
419	Horwell, C. J., & Baxter, P. J. (2006). The respiratory health hazards of volcanic
420	ash: a review for volcanic risk mitigation. Bulletin of volcanology, 69, 1–24.
421	Keiding, J. K., & Sigmarsson, O. (2012). Geothermobarometry of the 2010 Eyjaf-
422	jallajökull eruption: New constraints on Icelandic magma plumbing systems.
423	Journal of Geophysical Research: Solid Earth, 117(B9).
424	Kenedi, C. A. (2000). Volcanic ash fall-a" hard rain" of abrasive particles. US De-
425	partment of the Interior, US Geological Survey.
426	Krishnan, G., Achyuthan, H., & Siva, V. (2017). Comparative petrophysical and
427	geochemical characteristics of thermal and volcanic ash from southeastern India - Journal of the Coolesian Construct India - 00, 00, 04
428	India. Journal of the Geological Society of India, $90, 20-24$ .
429	Lara, L. E. (2009). The 2008 eruption of the Unaiten volcano, Unite: a preliminary report Andrean coolege $26(1)$ , 125, 120
430	Teport. Anaean geology, $30(1)$ , $120-129$ .
431	(2010) Potrology and goodhamistry of the 2006 symption of Augustine release
432	In I A Power M L Coombe & I T Freymuellor (Eds.) The 2006 countries
433	of Avanstine volcano Alaska (Vol 1760 p. 335-382)
404	oj 1109 000000 0000000, 1100000 (100. 1100, p. 000-002).

435	Larsen, J. F., Śliwiński, M. G., Nye, C., Cameron, C., & Schaefer, J. R. (2013).
436	The 2008 eruption of Okmok Volcano, Alaska: Petrological and geochemical
437	constraints on the subsurface magma plumbing system. Journal of Volcanology
438	and Geothermal Research, 264, 85–106.
439	Lau, W. S., Grainger, R. G., & Taylor, I. (2023). Volcanic ash density. University of
440	Oxford. doi: 10.5287/ora-r1dqbnpab
441	Longchamp, C., Bonadonna, C., Bachmann, O., & Skopelitis, A. (2011). Characteri-
442	zation of tephra deposits with limited exposure: the example of the two largest
443	explosive eruptions at Nisyros volcano (Greece). Bulletin of Volcanology,
444	73(9), 1337-1352.
445	Miyabuchi, Y., Watanabe, K., & Egawa, Y. (2006). Bomb-rich basaltic pyroclastic
446	flow deposit from Nakadake, Aso volcano, southwestern Japan. Journal of vol-
447	canology and geothermal research, 155(1-2), 90–103.
448	NASA. (1976). US standard atmosphere, 1976 (Vol. 76) (No. 1562). National
449	Oceanic and Atmospheric Administration.
450	Nye, C. J., Swanson, S. E., Avery, V. F., & Miller, T. P. (1994). Geochemistry
451	of the 1989–1990 eruption of Redoubt volcano: Part i. whole-rock major-and
452	trace-element chemistry. Journal of Volcanology and Geothermal Research,
453	62(1-4), 429-452.
454	Parfitt, L., & Wilson, L. (2009). Fundamentals of physical volcanology. John Wiley
455	& Sons.
456	Pieri, D., Ma, C., Simpson, J., Hufford, G., Grindle, T., & Grove, C. (2002). Anal-
457	yses of in-situ airborne volcanic ash from the February 2000 eruption of Hekla
458	volcano, Iceland. Geophysical Research Letters, 29(16), 19–1.
459	Pistolesi, M., Cioni, R., Bonadonna, C., Elissondo, M., Baumann, V., Bertagnini,
460	A., Francalanci, L. (2015). Complex dynamics of small-moderate vol-
461	canic events: the example of the 2011 rhyolitic Cordón Caulle eruption, Chile.
462	Bulletin of Volcanology, $77(1)$ , 1–24.
463	Prata, A., Grainger, R., Taylor, I., Povey, A., Proud, S., & Poulsen, C. (2022).
464	Uncertainty-bounded estimates of ash cloud properties using the ORAC algo-
465	rithm: application to the 2019 Raikoke eruption. Atmospheric Measurement
466	Techniques, 15, 5985–6010.
467	Prata, G., Ventress, L., Carboni, E., Mather, T., Grainger, R., & Pyle, D. (2019).
468	A new parameterization of volcanic ash complex refractive index based on
469	NBO/T and SiO2 content. Journal of Geophysical Research: Atmospheres,
470	124(3), 1779 - 1797.
471	Reed, B. E. (2016). Measurements of the complex refractive index of volcanic ash
472	(Doctoral dissertation, University of Oxford). Retrieved from https://ora.ox
473	.ac.uk/objects/uuid:6df66964-7e17-4ef5-a984-9a863a74e4e6
474	Richards, S., & Bouazza, A. (2007). Determination of particle density using water
475	and gas pycnometry. $G\acute{e}otechnique$ , $57(4)$ , $403-406$ .
476	Rincon, P. (2011). Volcanic ash air shutdown the 'right' decision. BBC News.
477	Rose, W. I., & Durant, A. J. (2009). Fine ash content of explosive eruptions. Jour-
478	nal of Volcanology and Geothermal Research, 186(1-2), 32–39.
479	Rossi, E., Bagheri, G., Beckett, F., & Bonadonna, C. (2021). The fate of volcanic
480	ash: premature or delayed sedimentation? Nature communications, $12(1)$ , 1–
481	9.
482	Rousseau, R. M. (2001). Detection limit and estimate of uncertainty of analytical
483	XRF results. $Rigaku J, 18(2), 33-47.$
484	Rust, A., & Cashman, K. (2011). Permeability controls on expansion and size
485	distributions of pyroclasts. Journal of Geophysical Research: Solid Earth,
486	<i>116</i> (B11).
487	Scasso, R. A., Corbella, H., & Tiberi, P. (1994). Sedimentological analysis of the
488	tephra from the 12–15 August 1991 eruption of Hudson volcano. $Bulletin of$
489	Volcanology, 56(2), 121-132.

- Smirnov, S., Nizametdinov, I., Timina, T., Kotov, A., Sekisova, V., Kuzmin, D.,
  Abersteiner, A. (2021). High explosivity of the June 21, 2019 eruption of Raikoke volcano (Central Kuril Islands); mineralogical and petrological constraints on the pyroclastic materials. Journal of Volcanology and Geothermal Research, 418, 107346.
- Sparks, R. S. J., Bursik, M., Carey, S., Gilbert, J., Glaze, L., Sigurdsson, H., &
   Woods, A. (1997). Volcanic plumes. Wiley.
- Sparks, R. S. J., & Wilson, L. (1976). A model for the formation of ignimbrite by
   gravitational column collapse. Journal of the Geological Society, 132(4), 441–
   451.
- Sparks, R. S. J., Wilson, L., & Sigurdsson, H. (1981). The pyroclastic deposits of the 1875 eruption of Askja, Iceland. *Philosophical Transactions of the Royal Society of London. Series A, Mathematical and Physical Sciences*, 299(1447), 241–273.
- Vogel, A., Diplas, S., Durant, A., Azar, A. S., Sunding, M. F., Rose, W. I., ...
  Stohl, A. (2017). Reference data set of volcanic ash physicochemical and optical properties. *Journal of Geophysical Research: Atmospheres*, 122(17), 9485–9514.
- Walker, G. P. (1993). Basaltic-volcano systems. Geological Society, London, Special
   Publications, 76(1), 3–38.
- Webb, P. A., & Orr, C. (1997). Analytical methods in fine particle technology. Mi cromeritics Instrument Corporation.
- <sup>512</sup> Wehrmann, H., Bonadonna, C., Freundt, A., Houghton, B. F., & Kutterolf, S.
- (2006). Fontana tephra: a basaltic Plinian eruption in Nicaragua. Special
   Papers Geological Society of America, 412, 209.
- White, F. M., & Majdalani, J. (2006). Viscous fluid flow (Vol. 3). McGraw-Hill New
   York.
- Wilson, L., & Huang, T. C. (1979). The influence of shape on the atmospheric
   settling velocity of volcanic ash particles. *Earth and Planetary Science Letters*,
   44(2), 311–324.
- <sup>520</sup> Wilson, M. (1989). *Igneous petrogenesis*. Springer.