

Controls on magma permeability in the volcanic conduit during the climactic phase of the Kos Plateau Tuff eruption (Aegean Arc)

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Abstract X-ray computed microtomography (μ CT) was applied to pumices from the largest Quaternary explosive eruption of the active South Aegean Arc (the Kos Plateau Tuff; KPT) in order to better understand magma permeability within volcanic conduits. Two different types of pumices (one with highly elongated bubbles, tube pumice; and the other with near spherical bubbles, frothy pumice) produced synchronously and with identical chemical composition were selected for μ CT imaging to obtain porosity, tortuosity, bubble size and throat size distributions. Tortuosity drops on average from 2.2 in frothy pumice to 1.5 in tube pumice. Bubble size and throat size distributions provide estimates for mean bubble size (\sim 93–98 μ m) and mean throat size (\sim 23–29 μ m). Using a modified Kozeny-Carman equation, variations in porosity,

tortuosity, and throat size observed in KPT pumices explain the spread found in laboratory measurements of the *Darcian* permeability. Measured difference in *inertial* permeability between tube and frothy pumices can also be partly explained by the same variables but require an additional parameter related to the internal roughness of the porous medium (friction factor f_0). Constitutive equations for both types of permeability allow the quantification of laminar and turbulent gas escape during ascent of rhyolitic magma in volcanic conduits.

Keywords Microtomography · Pumice · Permeability · Tortuosity · Outgassing · Volcanic conduit

Introduction

Understanding the behavior of magma ascent through volcanic conduits is paramount to predict the outcome of an eruption (Gonnermann and Manga 2007). In particular, the way exsolved gas escapes from a bubbly silicate melt (“magmatic foam”) will govern the transition between effusive and explosive eruptions (e.g., Eichelberger et al. 1986; Mueller et al. 2008; Namiki and Manga 2008). This process has been termed outgassing (Gonnermann and Manga 2007). Yet, exposed conduits are a rarity in the field (e.g., Stasiuk et al. 1996) and means of investigation are restricted to (a) experimental work (e.g., Burgisser and Gardner 2005; Okumura et al. 2006; Mueller et al. 2008; Namiki and Manga 2008), (b) numerical simulations (e.g., Papale 1999; Gonnermann and Manga 2003; Dufek and Bergantz 2005; Mastin 2005; Melnik et al. 2005), and (c) the study of juvenile pyroclasts, which provide the only natural record of the state of magma prior to fragmentation (e.g., Klug and Cashman 1996; Marti et al. 1999; Saar and

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Manga 1999; Polacci et al. 2003; Rust et al. 2003; Rosi et al. 2004; Mueller et al. 2005; Gualda and Rivers 2006; Wright et al. 2006; Bernard et al. 2007; Bouvet de Maisonneuve et al. 2008).

Using pore space reconstruction by X-ray computed microtomography (μ CT), this study focuses on characterizing natural pyroclasts (pumices), produced by the well-studied Kos Plateau Tuff (KPT) eruption (Allen and Cas 1998; Allen et al. 1999; Allen 2001; Allen and Cas 2001; Allen and McPhie 2001; Bouvet de Maisonneuve et al. 2008) in order to validate constitutive equations of permeability in volcanic samples. The KPT pumices are particularly prone to such an examination because the high viscosity (rhyolitic melt composition + high crystallinity) allowed preserving information on the state of the magma immediately prior to fragmentation since such silicic pumices record the geometry of the bubble network at fragmentation (Thomas et al. 1994). Therefore, their *Darcian* and *inertial* permeability indicate the volatile outgassing efficiency of an erupting magma in the upper part of the conduit (e.g., Eichelberger et al. 1986; Klug and Cashman 1996; Rust and Cashman 2004; Mueller et al. 2005).

The KPT pumices display macroscopic textures ranging from tubular (i.e., tube pumice) to near-spherical (i.e., frothy pumice) networks of bubbles, suggesting that the magmatic foam in different parts of the conduit was exposed to variable strain (Marti et al. 1999; Polacci et al. 2003; Rosi et al. 2004; Wright et al. 2006) during ascent. A previous study on the KPT eruption (Bouvet de Maisonneuve et al. 2008) reported highly variable permeabilities (variations over several orders of magnitude) of tube and frothy pumices for given porosities, implying that parameters other than porosity exerts a strong control on magma outgassing. Using high-resolution μ CT and numerical pore space reconstruction in 3D, we were able to measure the most important geometrical parameters that control gas flow in pumices. These are: (a) connected porosity (see Fig. 3 of Gonnermann and Manga 2007 for an overview and references therein), (b) (hydraulic) tortuosity, and (c) bubble aperture or throat diameter (Saar and Manga 1999; Blower 2001; Costa 2006; Bernard et al. 2007; Bouvet de Maisonneuve et al. 2008).

Samples

The KPT pumices can be subdivided in four categories according to their macroscopical characteristics (Allen 2001; Bouvet de Maisonneuve et al. 2008): (1) tube pumices, (2) frothy pumices, (3) microvesicular pumices, and (4) gray-banded pumices. In this study, we focused on the tube and frothy type, which were produced synchro-

nously (found in same pyroclastic flow units; Figs. 1 and 2) during the climactic phase of the eruption. Both tube and frothy pumices have the same rhyolitic composition and crystal volume fraction of about 24 %, and differ only in bubble morphology. The tube pumices are the most abundant type (90–95 vol.% of all pumices). They contain deformed bubbles that are highly elongated in the direction of clast elongation (Figs. 1a–c and 2). The frothy type pumices make up roughly 5–10 vol.% of the deposit and mostly have sub-spherical bubbles (Figs. 1d–f and 2). Such types of pumices are frequently observed in deposits of explosive caldera-forming silicic eruptions (Marti et al. 1999; Polacci et al. 2003; Polacci 2005; Wright et al. 2006).

Methods

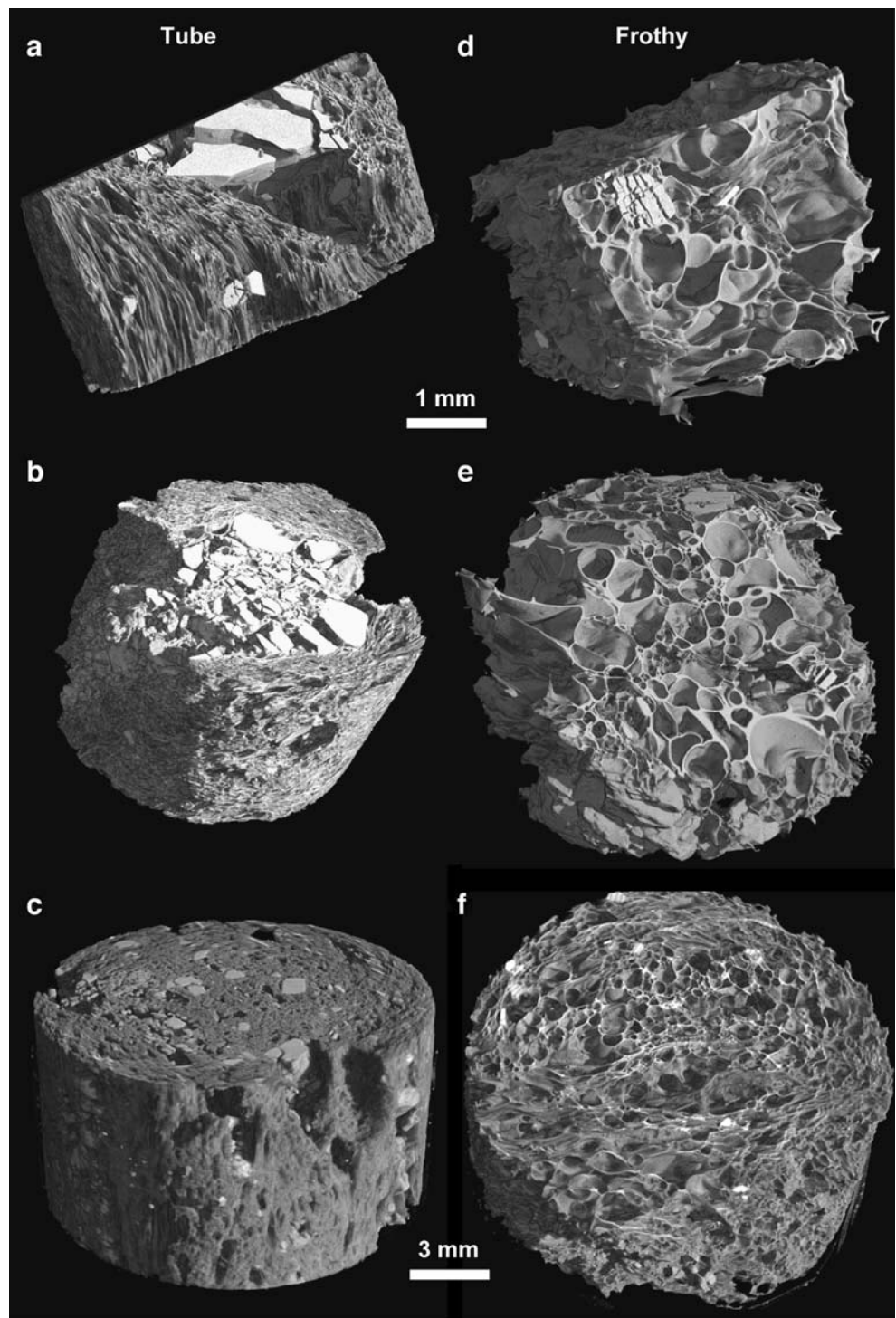
X-ray computed microtomography

Cylindrical cores were drilled from large pumice clasts (10 to 15 cm longest diameter) for μ CT scanning, as cylinders are isotropic in the scan plane, and thus the best geometry to capture the most volume (Ketcham and Carlson 2001). For each type we took two different clasts, and drilled two cores of 5 and 15 mm in one clast and one of 5 mm in the other. The μ CT scanner has an X-ray tube, which is an open type Feinfocus tube. We scanned these six cores at the UGCT Facility at the University of Ghent. We used a Rad-Eye EV CMOS flat panel detector with field of view 512×1024 pixels. During data acquisition, samples were rotated 360 degrees around an axis perpendicular to the incident beam. Projections were recorded at each 0.45 degree. Reconstruction, the process by which X-ray projections are converted to a stack of gray-scale images, was done using the software package Octopus developed at the UGCT Facility. The voxel (3D pixel) size of the images depends on the size of the samples and the detector used. The images of the 5 mm cores had a voxel size of $\sim 6 \mu\text{m}$, the ones of the 15 mm cores a voxel size of $\sim 15 \mu\text{m}$ (Table 1).

3D Image analysis

Three different existing softwares were used for image analysis. The commercial software package VGstudio was used for 3D rendering of the scans (Fig. 1). To discard the edges of the scanned sample, we cropped cubes from our obtained images using ImageJ. For quantitative 3D image analysis, we used 3DMA-rock (Lindquist and Venkatarangan 1999; Oh and Lindquist 1999; Lindquist et al. 2000; Song et al. 2001; Shin et al. 2005; Prodanovic et al. 2006), and Blob3D (Ketcham 2005a, b).

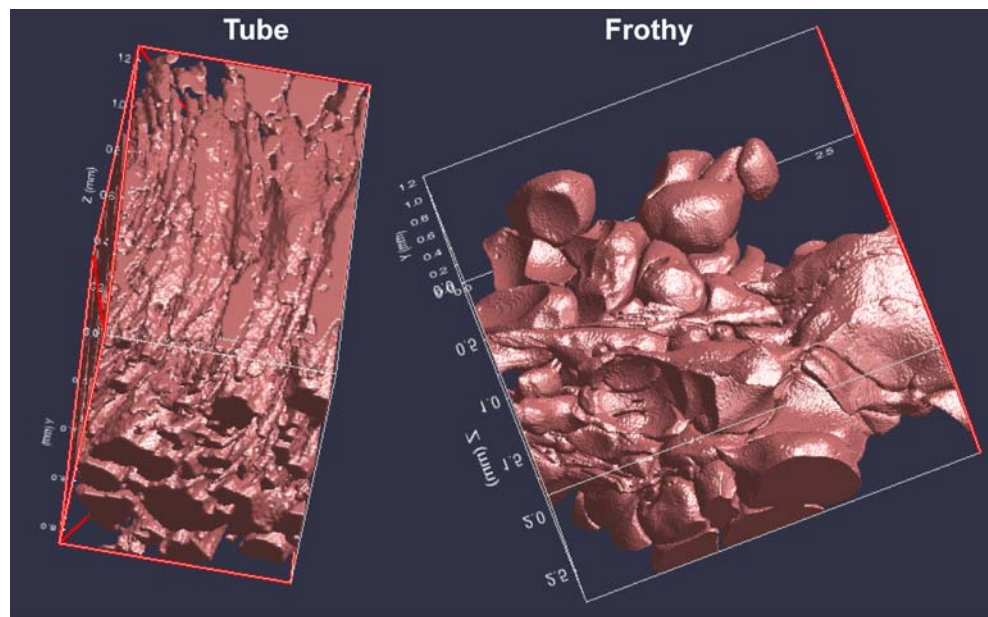
Fig. 1 Volume renderings of the six investigated samples: (a,b,c) being tube pumice and (d,e,f) frothy pumice; **a** KPT06-25_5 mm, large cavity and large crystal present, **b** KPT06-34_5 mm, abundant broken crystals, **c** KPT06-34_15 mm, features blurred, **d** KPT06-27_5 mm, **e** KPT06-33_5 mm, **f** KPT06-33_15 mm



Segmentation converts a gray-scale image into a binary (black and white) image. The purpose of segmentation is to extract the object that one wants to analyze (bubble network in our case). Common practice is to choose a simple global threshold, which is often set to match a predetermined bulk measurement of porosity. However, due to the unavoidable blurring in our μ CT images, a double threshold method was

taken for segmentation to limit biasing in dividing the 3D volume up into bubbles and material. For these reasons, the indicator kriging method (Oh and Lindquist 1999) was compared with the seeded threshold filter (Ketcham 2005b). Once binary images are obtained, we can determine a numerical porosity (amount of white voxels divided by the total amount of voxels).

Fig. 2 Surface visualization of connected bubble networks using Blob3D. The two pumice types can clearly be distinguished by their respective bubble network morphology



The *medial axis* or *skeleton* is a 1D representation of the bubble network constructed by erosion of the bubble network voxels, layer by layer, while preserving its topological and geometrical properties (Lindquist and Venkatarangan 1999). This reduced representation of the bubble network makes it easier to do further analysis. It

allows us looking for pathways on the medial axis that connect two end faces and determine (hydraulic) tortuosity.

Separation allows dismantling partially coalesced bubbles into individual bubbles. Separation algorithms rely on the assumption that individual bubbles are connected through a distinct waist configuration (Shin et al. 2005).

Table 1 Summary of quantitative measurements performed on the 3D images

		Tube			Frothy		
		kpt06-25_5mm	kpt06-34_5mm	kpt06-34_15mm	kpt06-27_5mm	kpt06-33_5mm	kpt06-33_15mm
Cube dimension (voxels)		459	466	465	486	476	486
Voxel size (μm)		5.68	5.42	16.27	5.68	5.68	14.77
Porosity	Indicator Kriging (3DMA-rock)	0.49	0.41	0.25	0.76	0.72	0.62
	Seeded threshold filter (Blob3D)	0.5	0.45	0.34	0.74	0.71	0.6
	Immersion Method on 1" cores	0.7	0.6	0.6	0.8	0.8	0.8
	Difference (%) between lab and indicator kriging	30	32	58	5	10	23
Tortuosity	x	1.9	1.6a	nd	1.8	1.6	1.7
	y	2	1.9		-	2	1.8
	z	1.5a	1.7		2.8	2.6	1.7
Bubble number density (m^{-3})	Pore-throat network (3DMA-rock)				2×10^{11}	3×10^{11}	nd
	Peeling (Blob3D)				nd	5×10^{11}	
Mean bubble diameter (μm)					98	93	
Mean throat diameter (μm)		26	23	nd	26	29	

a=direction of elongation

b = Bouvet de Maisonneuve et al. 2008

nd=not determined

3DMA-rock's algorithms calculate throats, which are minimal cross sectional surfaces between bubbles (Lindquist et al. 2000; Shin et al. 2005; Prodanovic et al. 2006), i.e. bubble apertures or throats. A distance label is given to each voxel on the medial axis, which is the distance to the nearest material voxel. Then the medial axis is used as a search path for local minima of the distance label. A throat is the surface joining a local minimum to the adjacent material voxels. We used the aggressive throat computation procedure since we were dealing with highly porous material (>40% porosity) which is a combination of the three throat calculating algorithms available (Prodanovic et al. 2006). This automatic method can lead to the definition of some non-physical throats (e.g., it overestimates throats in bubbles showing numerous cusps, because of the increase in minima in such a region). Blob3D on the other hand uses a more reliable, yet, more labour-intensive method by which the user manually picks the individual bubbles from bubble clusters by iteratively using erosion and dilation based on the *peeling* method developed in Proussevitch and Sahagian 2001.

Results

Qualitative observations

The tube pumice samples KPT06-25_5 mm, KPT06-34_5 mm and KPT06-34_15 mm shown in Fig. 1 (a–c) have in general the configuration of a volume stacked with capillary tubes partly bent or interrupted by crystals. They are heterogeneous in porosity and crystallinity at the scale of the 5 mm scanned samples. KPT06-25_5 mm has a large crystal and a cavity, while KPT06-34_5 mm has a large amount of broken crystals making up most of the scan

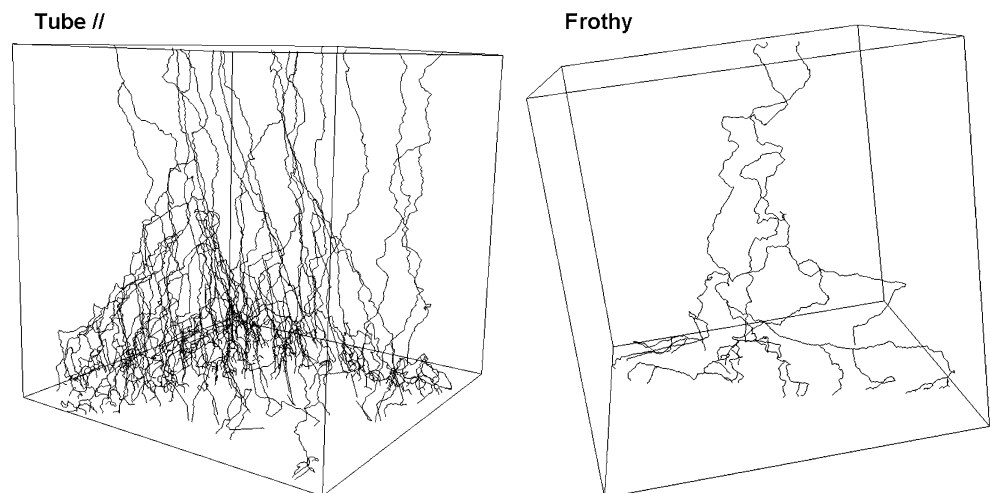
surrounded by the melt with stretched bubbles. The 15 mm core shows regions with pockets of broken crystals. Images for the frothy pumice, KPT06-27_5 mm, KPT06-33_5 mm and KPT06-33_15 mm, (Fig. 1d–f) show a configuration of densely packed, coalesced spheres (Fig. 2).

Porosity and tortuosity

When compared to porosity measured in the lab (Bouvet de Maisonneuve et al. 2008), image porosity can be used to evaluate the quality of our images and the methods used for segmentation (either by indicator kriging with 3DMA-rock or seeded threshold filter with Blob3D; Table 1). The larger cores show lower image porosity values (tube 25–34%; frothy 60%) than the 5 mm samples (tube 40–50%; frothy 72–76%). The 5 mm samples compare better to lab porosities than the 15 mm samples, especially for the frothy type with a porosity only differing a few percent from the lab values. We could not see any systematic advantage between the two segmentation algorithms and we applied further analysis on the binary images obtained with indicator kriging. The 15 mm tube sample (KPT06-34_15 mm) was eliminated for further analysis because of the large discrepancy between the two segmentation methods.

Measuring the length of pathways found with the medial axis and dividing it by the length between the two end faces provides the tortuosity (Table 1). In the 5 mm tube pumice, measured in the direction of elongation, tortuosity is around 1.5, while, perpendicular, values range between 1.7 and 2. The paths through the frothy type have higher tortuosity, ranging from 1.6 up to 2.8 in the 5 mm cores and no percolating paths in the y-direction of KPT06-27_5 mm. Thus, the tube pumices have less convoluted pathways than the frothy pumices, despite lower image porosity, leading to lower tortuosity (Fig. 3).

Fig. 3 Visualization of connected paths of a tube type in the direction of elongation (KPT06-25_5 mm) and a frothy type (KPT06-33_5 mm). There are more connected paths in the tube, which are less convoluted than the ones in the frothy pumice. Note that paths can partly overlap



Bubble and throat sizes

Bubble Number Densities (BND) and Bubble Size Distributions (BSD) were calculated solely for the frothy type (resolution on images for tube pumices not good enough to capture the smallest bubbles, see section 5.1). A BND of $\sim 10^{11}$ – 10^{12} m^{-3} was measured relative to the melt + crystals volume, because it needs to remain constant when bubbles grow (Proussevitch et al. 2007a; Proussevitch et al. 2007b; Table 1). Next, BSDs were generated (Fig. 4) following the method described in Proussevitch et al. 2007a; Proussevitch et al. 2007b, where number density is plotted against the bubble volume using logarithmic bins (results are converted to diameter of equivalent spheres for simplicity). The plots are not strongly affected by size cut-offs and thus are the most useful for population observations. The distributions were made such that the (bubble or throat) diameter and the bin size are at least 2 voxels in size for the smallest bubbles. A histogram of the number density, \hat{f} , is defined as

$$\hat{f}(V_i) = \frac{1}{v_m} \frac{n_i}{\Delta V}, \quad (1)$$

Where v_m is the observed total melt volume, n_i the number of bubbles counted in each bin and ΔV is the bin width. Functions were fitted using the program of Proussevitch et al. 2007a; Proussevitch et al. 2007b. The best function fit (lowest chi square value) was found with a log-normal distribution fit for all the BSD's.

The peeling method (Blob3D) was performed for comparison on KPT06-33-5 mm and gives a similar result with a mean bubble diameter of $87\mu\text{m}$ (Fig. 4a). It was more efficient in separating bubbles, but the BND stayed within the same order of magnitude. Comparing the results between the 5 mm and 15 mm cores (Fig. 4b), we see that bubbles larger than 1 mm in diameter are rare. Therefore, the 5 mm cores provide a good approximation to the real distribution while the 15 mm cores overestimate the fraction of larger bubbles because the resolution is not high enough to take into account the smaller bubbles. The means of the distributions of the 5 mm cores yield diameters of equivalent spheres of $98\mu\text{m}$ and $93\mu\text{m}$ (Fig. 4c).

We calculated Throat Size Distribution (TSD) for both pumice types, as we are looking for minimum apertures of the flow paths. The same method as for the BSD's was used. This allowed us to put constraints on the minimum aperture of the tubular flow paths, which we were able to use for permeability measurements (see below). Figure 5 shows the normalized counts versus throat area for one tube sample (KPT06-25_5 mm) and one frothy (KPT06-33_5 mm). The TSD's of the other samples follow closely

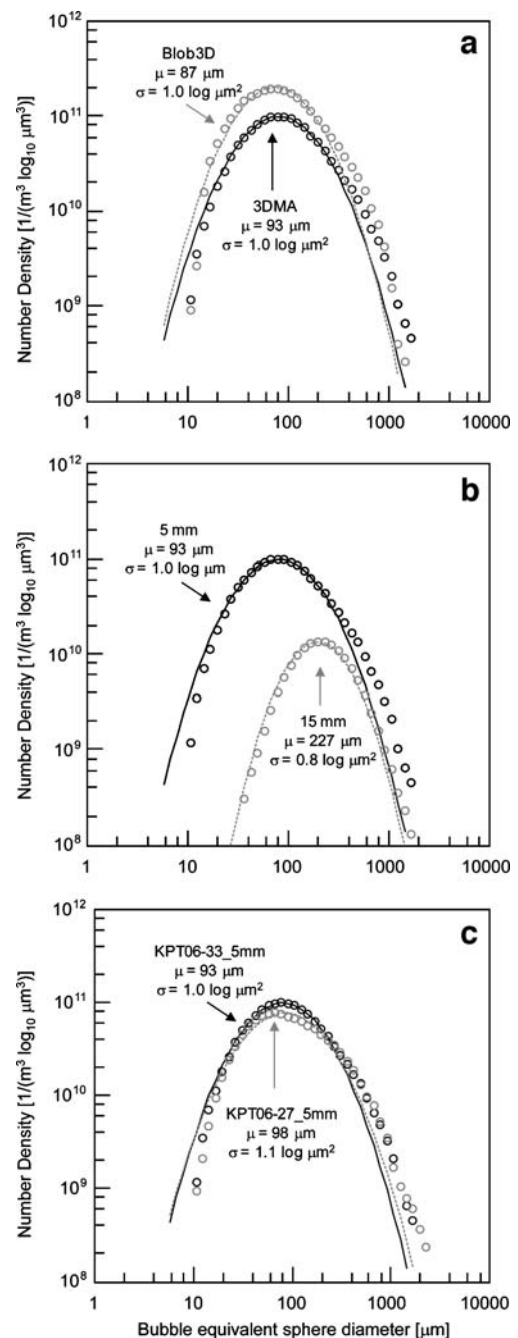


Fig. 4 Bubble size distributions with a function fit, using Proussevitch et al. (2007a). Number density is plotted versus equivalent sphere diameter of the bubbles in a log-log plot. The log-normal distributions that best fit the data are plotted as lines, and their parameters are marked in the plots. **a** The two different separation methods (pore/throat separation, 3DMA-rock and peeling method, Blob3D) were tested and compared on KPT06-33_5 mm. **b** Comparison between the BSD's of the 5 mm and 15 mm core of KPT06-33 from pore-throat network data. The data for the 15 mm sample shows that there aren't many bubbles with size larger than $1000\mu\text{m}$ and thus showing we have a very accurate BSD for the 5 mm samples since we capture most of the porosity for this sample. **c** The BSD's of KPT06-33_5 mm and KPT06-27_5 mm

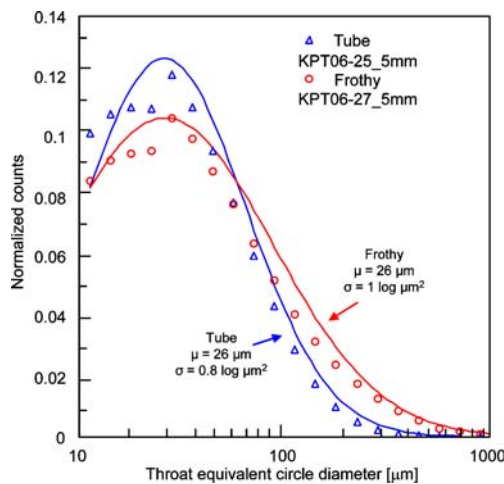


Fig. 5 Throat size distributions on 5 mm samples. Normalized counts are plotted against the equivalent circle diameter of the throats in a semi-log plot. The best fit log-normal distributions are plotted as lines, and their parameters marked in the plots. The TSD of the tube type is less spread out and has about the same mean as the frothy type. The other 5 mm samples showed similar results

their respective type. The tube and frothy pumices display similar TSD's with means between $23\ \mu\text{m}$ and $29\ \mu\text{m}$ for the 5 mm samples (Table 1).

Discussion

Image quality

This study complements previous studies exploring the potential of μCT to quantify textures of volcanic rocks (Song et al. 2001; Shin et al. 2005; Gualda and Rivers 2006; Okumura et al. 2006; Polacci et al. 2006; Wright et al. 2006; Gualda and Anderson 2007; Proussevitch et al. 2007a; Proussevitch et al. 2007b; Bai et al. 2008; Okumura et al. 2008; Polacci et al. 2008; Okumura et al. 2009; Polacci et al. 2009). In addition to the well-known advantages of the method, such as non-destructive 3-D information of heterogeneous material (Ketcham and Carlson 2001), μCT enables us to measure geometrical features of the bubble space, such as tortuosity, which were previously inaccessible to 2D techniques. However, caution should be taken when interpreting results, as the volume-resolution trade-off can create errors (Shin et al. 2005; Gualda 2006; Wright et al. 2006). The resolution of an image determines in how much detail an object can be seen. This combination of voxel size and image contrast can be assessed qualitatively by visualizing the images.

Disagreement between porosity measurements in the lab and by image analysis can be due to (a) an heterogeneous porosity at the scale of the scanned volume, which means that the scanned volume is not a representative elementary

volume (REV; Bear 1972) and/or (b) an insufficient resolution unable to capture the smallest bubbles, which leads to an underestimation of the image porosity. While the resolution obtained on our images is generally good enough for the frothy pumices, it is not sufficient to obtain complete characterization of the bubble network in tube pumices. We see that the images with the best qualitative observed resolution (frothy, 5 mm) are insensitive to the choice of the segmentation method and compare well to the obtained lab porosities (Table 1). In contrast, numerical porosity for the lowest quality images (tube, 15 mm) is very sensitive to the segmentation method and compares poorly to the lab measurements. Images of tube pumices are more affected by the REV vs. resolution trade-off because of both the heterogeneity at the 5 mm scale and the existence of bubbles smaller than the voxel size ($\sim 6\ \mu\text{m}$). The blurriness of the images hinders segmentation efficiency, independently of the method used, and can induce losses of $>30\%$ in porosity. However, the difference between lab and numerical porosity is mainly due to loss of the smallest bubbles ($<10\ \mu\text{m}$ in diameter) on the images, and important information about the flow properties in the porous medium can still be gathered on the whole bubble volume, as flowage is governed by the pathways with largest throat diameters (in a Poiseuille flow, permeability scales with throat diameter squared and mass flux with throat diameter to the 4th power). Slight disagreements between numerical and lab porosities ($<10\%$) are also present in frothy pumices, but we believe that the loss of some pore space of the frothy pumice is mainly due to the under-sampling of the largest ($>1\ \text{mm}$) bubbles.

Qualitative investigation on thin sections of the different pumice types showed that frothy has orifice shaped throats, while tube pumice has venturi shaped throats (Bouvet de Maisonneuve et al. 2008). Therefore, the throats in the frothy pumice are easily recognized as ruptured bubble walls, and yielded robust BSD's (Fig. 4). Because of the venturi shaped throats in tube pumice, the assumption that each minimum aperture is related to the end of a bubble can not be made, and BSD's were omitted. We conclude that KPT tube pumice does not record bubble sizes accurately, as the bubble coalescence history is largely obliterated due to the intense deformation.

Darcian and inertial permeability

Recent compilations of (Darcian) permeability-porosity ($k-\phi$) measurements on silicic pumices display a very scattered data set (Mueller et al. 2005; Gonnermann and Manga 2007), indicating that permeability is clearly not solely a function of porosity. As previously established (Saar and Manga 1999; Blower 2001; Mueller et al. 2005; Costa 2006; Bernard et al. 2007); including in the KPT

pumices (Bouvet de Maisonneuve et al. 2008), both (a) the tortuosity of outgassing pathways, and (b) throat size play an important role in determining permeability.

The commonly used capillary channel-based Kozeny-Carman relationship (Saar and Manga 1999; Mueller et al. 2005; Costa 2006; Wright et al. 2006; Bernard et al. 2007) combines all parameters (porosity, tortuosity, throat diameter and shape) and may provide a robust analytical expression to determine permeability in pumices

$$k = \frac{\phi d^2}{16\chi\tau^2}, \quad (2)$$

where χ is the cross section shape factor, and d is the throat diameter. Tortuosity τ is related to connected porosity through Archie's law, which states that tortuosity behaves as a fractal with connected porosity (Archie 1942; Le Pennec et al. 2001; Costa 2006)

$$F = \phi_c^{-m} \text{ and } F = \frac{\tau^2}{\phi_c} \quad (3)$$

$$\tau^2 = \phi_c^{1-m}, \quad (4)$$

where F is the formation factor and m is the cementation or tortuosity factor. F is a concept derived from electrical measurements in porous material, and it describes the effect of the porous medium geometry on the macroscopic electrical flow. Following Bernard et al. 2007, we assume that the electrical current roughly follows the hydraulic flow, and thus that the formation factor also applies to hydraulic permeability, and we set $\phi_c = \phi$. Equation (2) thus becomes:

$$k = \frac{\phi^m d^2}{16\chi}. \quad (5)$$

Note that equation (5) turns into the Poiseuille flow permeability for straight circular pipes $m = \tau = 1$, and $\chi = 2$. We point out that permeability will deviate from equation (5) near the percolation threshold where it has a $(\phi - \phi_{crit})^m$ behavior and at very high porosities ($> \sim 0.8$) where it will follow a $1/(1 - \phi_c)$ trend (Blower 2001; Celzard and Mareche 2002; Costa 2006).

To test whether equation (5) provides a robust analytical model for pumice permeability, we used: (a) the range of connected porosity measured in the lab (Bouvet de Maisonneuve et al. 2008), (b) the tortuosity measured with our 3D image analysis, and (c) the average throat sizes measured by μ CT. Table 2 shows the range of the tortuosity factor m we found through equation (4). Figure 6 combines all the data with equation (5). Figure 6a shows the spread within all measured tube // (parallel to elongation) and how the variation of throat size (using 1 standard deviation from

Table 2 Estimates for the tortuosity factor m using equation (4) by combining our data with lab data from Bouvet de Maisonneuve et al. (2008)

	Tube //	Tube \perp	Frothy
Connected porosity ϕ_c	0.49–0.68	0.63–0.81	
Tortuosity τ	1.4–1.6	1.7–2	1.6–2.8
Tortuosity factor m	1.9–3.4	2.5–4.6	3–10.7

the mean) can explain it for fixed $m = 3$ and $\chi = 2$ (i.e., assuming circular cross sections). The spread within the frothy type and tube \perp (perpendicular to elongation) is smaller and can also be explained by throat size variations. The difference in average permeability between tube pumice // to elongation and frothy pumice is explained by variation in tortuosity (m , Fig. 6b) for fixed $d = 23 \mu\text{m}$ and $\chi = 2$, while the difference in average permeability between tube \perp and the other types requires a combination of m and throat shape χ . A change in throat shape from circular to elliptic shape due to stretching of throats perpendicular to elongation influences χ as follows (Mortensen et al. 2005; Costa 2006) tube \perp

$$\chi = \left(\frac{r^2}{l^2} + \frac{l^2}{r^2} \right), \quad (6)$$

with l the throat major axis and r the equivalent circle radius. This can make the permeability drop dramatically (Fig. 6c).

Permeability of tube pumice // to elongation and frothy pumice, which dominates magma outgassing (tube \perp are 10–50 times less permeable), are well described by equation (5) for circular throats

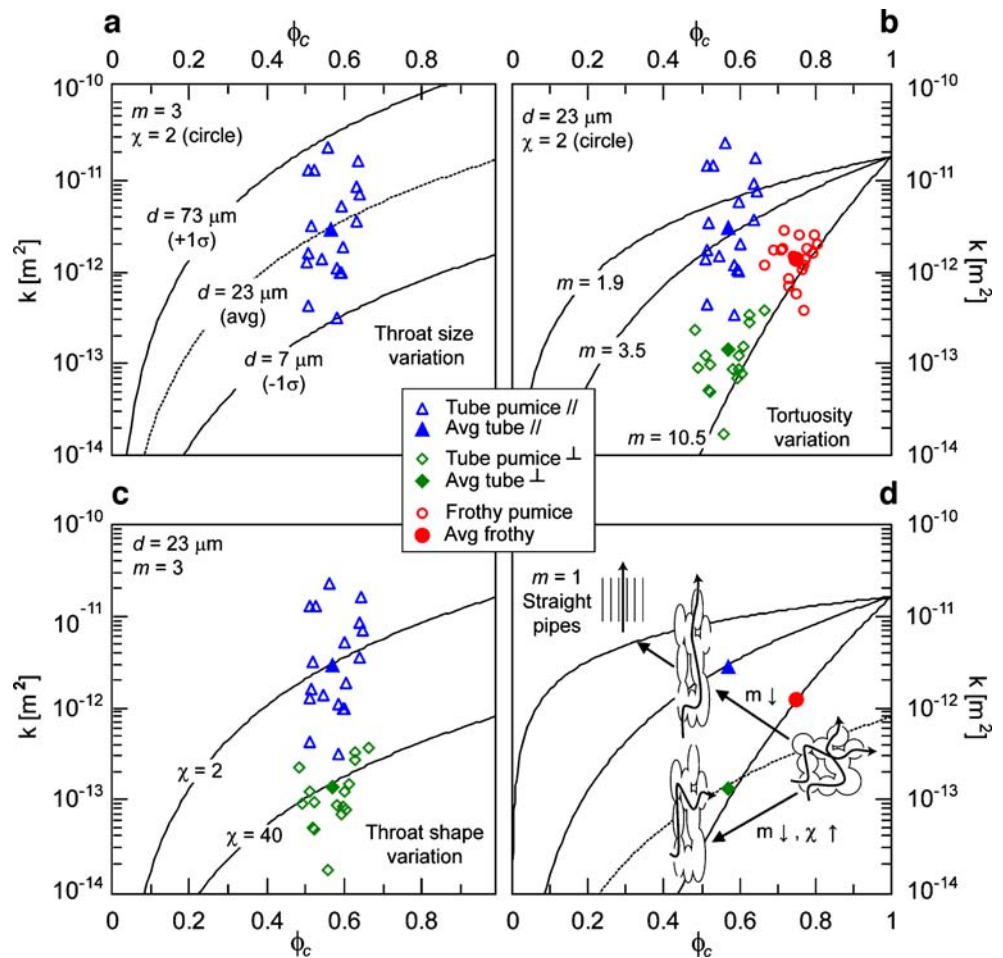
$$k = \frac{\phi_c^m d^2}{32}, \quad (7)$$

using measured porosities, throat sizes and tortuosities. This equation improves on previous attempts to model permeability in natural volcanic samples (Klug and Cashman 1996; Saar and Manga 1999; Blower 2001; Mueller et al. 2005; Costa 2006; Mueller et al. 2008) as it does not contain any fitting parameters, and can be used directly as a constitutive equation in conduit models.

The permeable outgassing can become turbulent in the upper part of the volcanic conduit (Yoshida and Koyaguchi 1999; Rust and Cashman 2004) and Darcy's law has to be extended to Forchheimer's law (Rust and Cashman 2004). Therefore, a second material parameter, the inertial permeability k_2 or its reciprocal, the beta factor, β , is introduced

$$\frac{\Delta P}{L} = \frac{\mu}{k} v + \frac{\rho}{k_2} v^2. \quad (8)$$

Fig. 6 (Darcian) permeability model, equation (7), is compared to lab data (Bouvet de Maisonneuve et al. 2008) and the influence of the following parameters is investigated. **a** Throat size variation, **b** tortuosity factor variation **c** throat shape variation. **d** Qualitative overview of permeability model. On average, non-sheared magma (frothy) maintains a high m value, while sheared magma lets this factor evolve to a lower value in the direction of elongation (tube //) with $m=1$ being the limit for straight paths. The permeability of tube \perp can drop significantly by a combination of effects



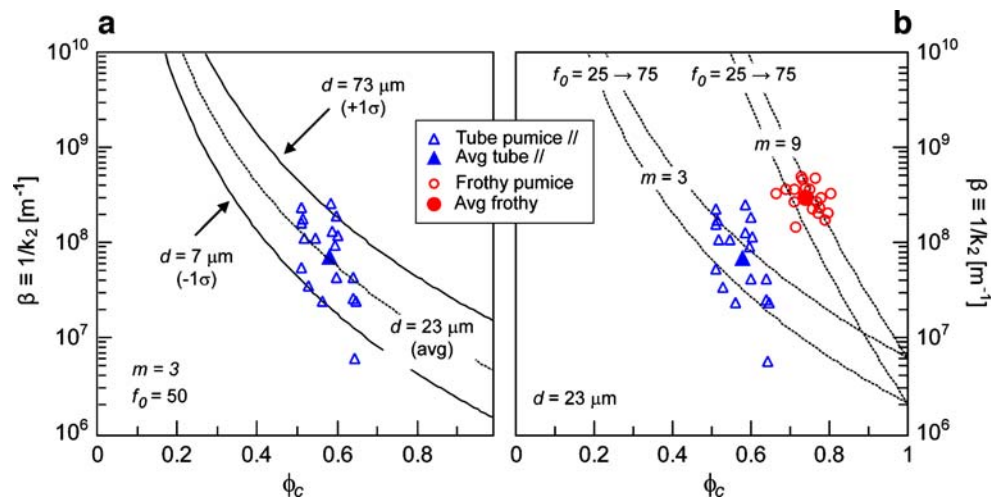
For straight pipes:

$$\beta \equiv \frac{1}{k_2} = \frac{2f_0}{d\phi^2}, \tag{9}$$

with f_0 being an empirical derived constant related to surface roughness (e.g., Mastin and Ghiorso 2000). The

inertial permeability is also a function of tortuosity (Ruth and Ma 1990 + Table 1, Rust and Cashman 2004). Therefore, we introduce the tortuosity in (8), equivalent to the development of Carman 1937 for the Darcian permeability, i.e. (a) the macroscopic velocity is adjusted with a factor of τ , and (b) the pressure gradient is adjusted with a

Fig. 7 Inertial permeability model, equation (11), compared with lab data (Bouvet de Maisonneuve et al. 2008) with variable throat sizes (a) and variable m for f_0 between 25 and 75 (b)



factor $1/\tau$. As a result, the Darcian permeability has to be adjusted with a factor of τ^2 (see equation (2)). The inertial permeability changes with a factor of τ^3 , giving

$$\beta \equiv \frac{1}{k_2} = \frac{2f_0\tau^3}{d\phi_c^2}, \quad (10)$$

and becomes together with Archie's law (4)

$$\beta \equiv \frac{1}{k_2} = \frac{2f_0}{d\phi_c^{\frac{1+3m}{2}}}. \quad (11)$$

Using equation (11) with average throat diameter and tortuosity factors determined on the KPT pumices (Fig. 7a and b), we fitted the inertial permeability data determined on tube // and frothy pumices (Bouvet de Maisonneuve et al. 2008). This provides a rough estimate for the friction coefficient $f_0 \sim 25\text{--}75$.

Using equations (7) and (11), would it be possible to calculate a dynamic Darcian and inertial permeability in conduit flow models? Both the porosity and the average throat diameter can be obtained by using bubble growth models (e.g., Proussevitch and Sahagian 1998). Throat sizes can be estimated by knowing the bubble sizes from the throat-bubble ratio that is roughly estimated to be between 0.1 and 0.2 (Saar and Manga 1999, and our results). In order to track dynamic permeability using a conduit flow model, an expression relating the tortuosity τ to applied strain ε in the conduit must also be derived (see, e.g., Scholes et al. 2007).

Volcanological implications

The presence of spherical (frothy) and elongated (tube) bubbles in pumices erupted synchronously during magma ascent records zones with respectively low and high strain rates, that develop by simple or pure shear within the conduit during ascent (Marti et al. 1999; Polacci et al. 2003; Bouvet de Maisonneuve et al. 2008). As a result of higher (Darcian and inertial) permeability in the direction of elongation, magma outgassing will be more efficient in strongly sheared areas (Okumura et al. 2009). Although it has been suggested that very high strain rates can lead to magma fragmentation by brittle fracturing (Dingwell 1996; Papale 1999; Gonnermann and Manga 2003) the buffering effects of (a) viscous dissipation (Polacci et al. 2001; Mastin 2005), (2) lower mixture viscosity (Llewellyn and Manga 2005), and (3) enhanced coalescence and permeability (Okumura et al. 2006; Okumura et al. 2008; Okumura et al. 2009) in these areas of high shear may prevent brittle fragmentation from occurring (Mueller et al. 2008).

Concluding remarks

μ CT emerges as a powerful tool to obtain quantitative measurements of the geometry of bubble networks inside pumices (e.g., Shin et al. 2005; Okumura et al. 2006; Prodanovic et al. 2006; Wright et al. 2006). We took full advantage of the 3D information by measuring porosity and averages for tortuosity, bubble and throat sizes, which control permeability, a key parameter in eruption dynamics.

To increase our understanding on the synchronous production of different types of pumices (e.g., Polacci 2005), 2D conduit models will be needed to determine the presence and effects of co-existing high and low strain rate zones (Ramos 1999; Dufek and Bergantz 2005). We provide constitutive equations (7) and (11) to calculate dynamic Darcian and inertial permeability in such models.

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