Machine learning thermobarometry and chemometry using amphibole and clinopyroxene: a window into the roots of an arc volcano (Mount Liamuiga, Saint Kitts)

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single-phase; Mansion Series; anorthite; stratigraphy; compositional gap

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- 1 Abstract

The physical and chemical properties of magma govern the eruptive style and behaviour of volcanoes. Many of these parameters are linked to the storage pressure and temperature of the erupted magma, and melt chemistry. However, reliable single-phase thermobarometers and chemometers which can recover this information, particularly using amphibole chemistry, remain elusive. We present a suite of single-phase amphibole and clinopyroxene thermobarometers and chemometers, calibrated using machine learning. This approach allows us to intimately track the range of pre-eruptive conditions over the course of a millennial eruptive cycle on an island arc volcano (Saint Kitts, Eastern Caribbean). We unpick the story of Mount Liamuiga, a stratovolcano that pops its upper-crustal (2 kbar), dacitic cork at the beginning of the Lower Mansion Series eruptive sequence. This permits a progressive increase in the thermal maturity of the magma arriving at the surface from the middle to upper crust (2 - 5.5 kbar) through time. The temperature increase correlates well with matrix plagioclase chemistry, which itself displays a remarkable progression to less evolved (more anorthitic) composition in time. We find that amphibole is a reliable themobarometer (SEE = 1.4 kbar; 40 °C), at odds with previous studies. We suggest it is the regression strategy, as opposed to the abject insensitivity to pressure, that has hindered previous calibrations of amphibole only thermobarometers. By recognising this, we have constructed a high-resolution, quantitative picture of the magma plumbing system beneath an arc volcano. 

31 Introduction

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Accurately recording the pressure and temperature distribution of magma storage is critical for our understanding of volcanic igneous plumbing systems (Blundy and Cashman, 2008). This includes the ability to compare the pressure and temperature of erupted products with monitoring signals to quantitatively link eruption size, explosivity and duration (eruptive dynamics) to pre-eruptive magma storage conditions (Voight, 1988). Assessing such parameters temporally, be it relative time in the form of stratigraphy (Sisson and Vallance, 2009) or absolute time from crystal ages (e.g. Shane, 2013), may improve our understanding of how, why and when these dynamics change during an eruptive cycle (Ridolfi et al., 2008; Shane, 2013).

40 Determinations of intensive parameters (pressure, temperature, melt composition; P, T, X) for a magma can be 41 made using the results of equilibrium experiments, run at specific conditions to match mineral and melt chemistry 42 of erupted products (Pichavant et al., 2007; Sisson et al., 2005; Solaro et al., 2019). Additionally, a thermometer 43 (T), barometer (P), or chemometer (X) that relates mineral phase chemistry to known pressure, temperature, and 44 melt composition can be calibrated (Blundy and Cashman, 2008; Putirka, 2008). Statistical relationships are 45 derived using an array of approaches: linear regression (Ridolfi et al., 2008; Ridolfi and Renzulli, 2012); direct 46 correlation with unit cell parameters (Nimis, 1995; Nimis and Ulmer, 1998); multiphase reaction barometry (Pay 47 method; Ziberna et al., 2017); linear least-square regression with a thermodynamic basis (Putirka, 2008); machine 48 learning (this study; Petrelli et al., 2020; Jorgenson et al., 2021).

49 Amphibole and clinopyroxene are phases commonly used as thermobarometers. Clinopyroxene is typically 50 coupled with melt for thermobarometry (Neave and Putirka, 2017; Putirka, 2016, 2008). The caveat is that an 51 equilibrium melt requires matrix glass (for crystal rims) or melt inclusions (for crystal cores/ mantles). Whilst 52 solutions, such as calculating liquids using mass balance (Hammer et al., 2016) or iterative melt matching schemes 53 (Neave et al., 2019), have been proposed, the associated uncertainty of matching a melt with a mineral is rarely 54 propagated. Without an equilibrium melt, an independent estimate of temperature is required (Nimis and Ulmer, 55 1998) which introduces further uncertainty. Amphibole has enormous potential for pressure and temperature 56 determinations due to its common occurrence in hydrous arc magmas (Scaillet and Evans, 1999) and 57 compositional diversity (Leake et al., 1997). Temperature estimates may be obtained from amphibole -58 plagioclase (Blundy and Holland, 1990; Holland and Blundy, 1994), amphibole - melt (Putirka, 2016), and in 59 some cases, amphibole only (Erdmann et al., 2014; Ridolfi and Renzulli, 2012; Shane, 2013). Amphibole has also 60 been successfully calibrated as a chemometer, notably for prediction of equilibrium melt SiO<sub>2</sub> (Zhang et al., 2017).

61 However, its use as a reliable barometer is debated. It is best applied in multiply-saturated granitic systems (T < 62 800 °C; Fe# < 0.65; Anderson and Smith, 1995; Putirka, 2016) whereas calibrations of amphibole-only barometers 63 (e.g. Ridolfi and Renzulli, 2012) have been widely criticised (Erdmann et al., 2014; Putirka, 2016; Shane, 2013). 64 Additionally, errors from amphibole barometry are consistently quoted at  $\pm 3 - 4$  kbar which approaches the edge 65 of usability for identifying the loci of pre-eruptive magma storage (Putirka, 2016).

66 The Eastern Caribbean (Lesser Antilles) island arc has been an area of recent interest to determine crustal structure 67 (Kopp et al., 2011), water flux (Cooper et al., 2020), and the structure of sub-volcanic systems (Melekhova et al., 68 2019). This is due to its reputation for both significant volcanic hazards (Lindsay, 2005) and as an exemplar of a 69 slow subduction zone (Wadge and Shepherd, 1984). Particular attention has been paid to constraining the sub-70 volcanic crustal structure using magmatic inclusions (widely referred to as "plutonics", "cumulates" or 71 "xenoliths") along the arc by employing experimental petrology (Melekhova et al., 2017, 2015; Stamper et al., 72 2014), thermodynamic modelling (Stamper et al., 2014), and a host of thermobarometers (Camejo-Harry et al., 73 2018). Nonetheless, these inclusions are largely found ex situ (Arculus and Wills, 1980) and so lack temporal 74 (with regards to the eruption) or spatial (with regards to the eruptive centre) information. In contrast, the excellent 75 exposure of fall and flow deposits in the Eastern Caribbean (Baker and Holland, 1973; Howe et al., 2014) provides 76 a preferable record of time-integrated P-T-X which may be linked to evolving conditions in the sub-volcanic 77 system. However, natural fragmentation in pyroclastic rocks (e.g. Higgins et al., 2021) and compositional 78 diversity in silicate phases at thin-section scale (notably plagioclase; Toothill et al., 2007) precludes the use of 79 thermobarometers based on equilibrium pairs (Shane, 2013). In addition, suitable single-phase thermobarometers 80 applicable to a range of melt compositions are lacking.

81 We present a suite of new thermobarometers and chemometers (amphibole-only and clinopyroxene-only), 82 calibrated using machine learning. This approach has proved successful for clinopyroxene thermobarometry 83 applied to alkalic magmas from Iceland (Petrelli et al., 2020). We use a section of the Mansion Series stratigraphy 84 (Baker, 1969; Roobol et al., 1981; Higgins et al., 2021) on the island of Saint Kitts, Eastern Caribbean, to 85 temporally track the variation of intensive parameters in pyroclastic samples. These are then linked to the 86 remarkably clear increase of matrix plagioclase anorthite content (An#) in time for the same sequence (Higgins 87 et al., 2021). Where possible, we corroborate the P-T-X results with evidence from geochemistry, petrography, 88 and textural observations. The development of such reliable single-phase thermobarometers and chemometers is 89 critical for the wider volcanology community as they provide a quantitative metric to cross-compare volcanic 90 systems and their dynamic behaviours, a notoriously difficult task in Earth sciences (Cashman and Biggs, 2014).

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#### 92 Geological Setting

93 Saint Kitts (**Fig. 1a**) is a northern island in the Eastern Caribbean island arc, resulting from the slow (2-4 cm/vear;94 Shepherd, 1984), westward subduction of the North American plate beneath the Caribbean plate. Recent 95 volcanism on Saint Kitts (~ 42 ka; Roobol et al., 1981) originates from the Mount Liamuiga stratovolcano in the 96 north west, depositing the Mansion Series stratigraphy (Baker, 1969; Roobol et al., 1981; Fig.1a). The Mansion 97 Series consists of 6 main units (A – F; Roobol et al., 1981). The older Lower Mansion Series, the focus of this 98 study, comprise the Lower Green Lapilli (A), Cinder Unit (B), and Upper Green Lapilli (C). The Green Lapilli 99 layers are primarily grey-green, angular, aphyric, micro-vesicular lapilli of andesitic composition, a rock type not 100 noted elsewhere in the Eastern Caribbean. The eruptive sequence resumes at 4270 BP  $\pm$  140 until 2070  $\pm$  150 101 (Baker, 1985) with units D – F. They are composed of interbedded ash, pumice fall deposits and pyroclastic flow 102 deposits, along with intercalations of the Steel Dust Series fall deposits on the western flanks of Mount Liamuiga. 103 Pyroclastic flow deposits, restricted to the north and west of Mount Liamuiga, are morphologically divided into 104 bimodal andesitic block and ash flows and polymodal basaltic-andesite block and ash flows (Tate and Wilson, 105 1988). The excellent exposure of the Saint Kitts stratigraphy has inspired several studies of chemical and physical 106 changes in the volcanic deposits through time (Baker, 1980; Baker and Holland, 1973; Higgins et al., 2021).

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#### 108 Methods

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#### 110 Fieldwork and sample preparation

111 Samples were collected from a 6.8 m thick, stratigraphic section on the east coast of Saint Kitts (Fig. 1b; 17.38725, 112 -62.76276 [WGS84]; midway between the villages of Mansion and Tabernacle; Higgins et al., 2021; Sheldrake 113 and Higgins, 2021). This section includes the "Pre-Mansion Series pyroclastic deposits" (> 43000 BP) and 114 Mansion Series units A – C (> 41420 to > 41730 BP) which have been dated using  ${}^{14}$ C (Harkness et al., 1994; 115 Roobol et al., 1981). Juvenile material (pumice, mafic scoria or volcanic ash) was collected for chemical analysis, 116 and thicknesses of volcanic units and palaeosoils measured. Beds were sampled at changes in deposit form or 117 macroscopic mineralogy to capture the full variability of the sequence. Samples selected for thermobarometry and 118 chemometry were those which contained phenocrysts of amphibole or clinopyroxene. Data were also included 119 from two in-situ enclaves: one mafic enclave in SK392 (olivine + plagioclase + clinopyroxene + orthopyroxene

+ spinel) and one felsic enclave in SK386B (plagioclase + amphibole + quartz + Fe-oxide). For a more detailed

121 appraisal of the sequence and whole rock textures refer to Higgins et al (2021).

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#### 123 Electron Probe Micro-analyser (EPMA)

In-situ mineral analyses of amphibole and clinopyroxene were made on 30 μm polished thin sections using a JEOL 8200 Superprobe at the University of Geneva and a JEOL JXA-8530F at the University of Lausanne. Both microprobes were equipped with a five-channel wavelength-dispersive spectroscope system (WDS) and were operated at an accelerating voltage of 15 keV, a beam current of 20 nA, and a beam diameter of 3 μm. Quantitative analyses were made using internal standards (orthoclase [Si, K], andalusite [Al], albite [Na], forsterite [Mg], fayalite [Fe], wollastonite [Ca], Mn-Ti-oxide [Mn, Ti], Cr-oxide [Cr]). Mineral analyses were acquired as transects or points to capture chemical variability within the mineral phase.

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## 132 Machine learning thermobarometry

133 Experimental data for the calibration of two new single-phase thermobarometers (clinopyroxene-only and 134 amphibole-only) were collected from the Library of Experimental Phase Relations (LEPR) database (Hirschmann 135 et al., 2008) and supplemented with experiments from the geological literature (Supplementary Table 1). Data 136 spanned 0.002 kbar to 12 kbar and 750 – 1250°C, covering the crustal thickness (Kopp et al., 2011; Melekhova et 137 al., 2019) and inferred range of magmatic temperatures (Melekhova et al., 2017; Toothill et al., 2007) beneath 138 Saint Kitts. Experiments at 1 atmosphere (clinopyroxene) were excluded as they tend to exhibit an anomalously 139 wide range of Al contents. This has been ascribed to Na-loss during the experiment (Putirka, 2008) or coupled 140 substitution of Na and Al for Si, Ca and Mg in fast growing, disequilibrium clinopyroxene at low pressure (Mollo 141 et al., 2010; Ziberna et al., 2017). Binary cation plots for all calibrant experiments are shown in Supplementary 142 Fig. 1.

Major element cations in amphibole and clinopyroxene were calculated for all experiments on the basis of 6 (clinopyroxene) and 23 (amphibole) oxygens according to Deer et al (1997). In both cases all Fe was assumed as ferrous, as per Putirka (2016), as spectroscopic analysis of Fe speciation shows that stoichiometric Fe has little correlation to measured values (Al'meev et al., 2002; Dyar et al., 1993, 1992; Hawthorne and Oberti, 2007). Poor quality analyses were filtered on the basis of cation sums for amphibole (15 < cation sum < 16) and clinopyroxene (3.95 > cation sum > 4.05). Clinopyroxene was further screened using the partition coefficient of Fe and Mg between liquid and crystal [K<sub>D</sub>(Fe-Mg)<sup>cpx-liq</sup>], removing values that did not fall between 0.04 and 0.68 (Putirka,

**150** 2008). Any experiments that did not report a coexisting liquid were excluded.

151 The final filtered datasets (n = 391 for amphibole; n = 676 for clinopyroxene) were used to train regression models 152 with the extraTrees (v 1.0.5) package (Simm et al., 2014) in R (Team, 2013). The extraTrees package encompasses 153 a machine learning method for classification and regression, employing a series of uncorrelated decision trees to 154 reach a prediction output based on an input. An example of a single decision tree for temperature prediction in 155 amphibole is found in Supplementary Fig. 2. The experimental composition of the amphibole (Si, Al, Ti, Ca, 156 Na, K, Fe, Mg, Mn) / clinopyroxene (Si, Al, Ti, Ca, Na, Fe, Mg, Mn, Cr) was the input, and the experimental 157 pressure and temperature was the output. The experimental dataset was split into a train dataset (used to train the 158 model by correlating compositional changes in minerals with known pressures and temperatures), and a test 159 dataset (used to verify the models' performance by predicting pressure and temperature based on composition and 160 calculating a residual to the known experimental value). Those experiments in the test dataset are never present 161 in the train dataset. Hyperparameter tuning is shown to have little effect on uncertainty or precision of machine 162 learning thermobarometers (Petrelli et al., 2020; Jorgenson et al., 2021) and so we take the values of 300 trees and 163 6 features per node (mtry = 6). For a more extensive review of machine learning thermobarometry refer to 164 Jorgenson et al (2021).

165 Petrological experiments are more commonly performed at lower pressure (2 kbar), with barometric gaps at 9 and 166 11 kbar. High-pressure experiments are also typically performed at higher temperature (Fig. 2). Therefore, we 167 used a uniform pressure-temperature grid when sampling the test dataset, whereby a single random experiment 168 was sampled from within each grid square. This ensured a uniform and representative pressure-temperature 169 distribution in the test dataset. To gauge the effect of sampling certain experiments in different test and train 170 datasets we randomly resampled both datasets 200 times (r = 200) and repeated the model calibration. The 171 performance of the model was determined using a standard error estimate (SEE; Eq. 1) and a root mean square 172 error ( $\mathbb{R}^2$ ; Eq. 2) based on the ability of the algorithm to predict the test (unknown) dataset. For brevity, amphibole 173 and clinopyroxene thermobarometers will be shortened to TB(A) and TB(C) respectively.

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$$R^{2} = 1 - \frac{\sum_{i=1}^{n} (y_{i} - \hat{y}_{i})^{2}}{\sum_{i=1}^{n} (y_{i} - \bar{y}_{i})^{2}}$$
(1)

176 
$$SEE = \sqrt{\frac{\sum_{i=1}^{n} (y_i - \hat{y}_i)^2}{n}}$$
 (2)

#### **177** *Machine learning chemometry*

A series of clinopyroxene only and amphibole only chemometers were calibrated to predict the chemistry of the coexisting melt (SiO<sub>2</sub>, Al<sub>2</sub>O<sub>3</sub>, CaO, Na<sub>2</sub>O, K<sub>2</sub>O, MgO, FeO) with amphibole/clinopyroxene. The calibration strategy, including the experimental datasets, were identical to those used for the thermobarometers. The exception was that temperature (°C) for the experiments was used as an additional predictor variable as this significantly reduced the SEE. Hence, when the chemometers are applied to natural minerals, we use the associated temperature from the machine learning thermometer as a predictor along with the mineral chemistry. The SEEs of each chemometer are reported in **Supplementary Table 2**.

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## 186 Equilibrium experiment matching

187 A common approach to determine pre-eruptive storage conditions of magma is to compare the results of 188 equilibrium experiments with natural mineral chemistry (e.g. Pichavant and Macdonald, 2007). Mismatch may 189 arise due to experimental gaps (such as the lack of experiments at certain pressures; Fig. 2) or additional processes 190 (mixing, resorption). To synthesise this approach we used a custom search script written in R (Team, 2013) to 191 match each microprobe analysis from Saint Kitts with an experimental run from all experiments on the reference 192 list in Supplementary Table 1. We searched for amphibole, clinopyroxene, orthopyroxene, olivine and 193 plagioclase from experiments that matched  $\geq$  (n-1) of the major elements in each phase to within 5% relative, 194 where n is the number of major elements. K, Cr and Mn in mafic phases were omitted as they tend to be below 195 detection or not consistently reported in experiments. These results can then be compared with P-T-X measured 196 from our thermobarometers and chemometers, which is useful to estimate the performance of the trained 197 algorithms.

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#### 199 Results

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201 *Mineral chemistry* 

Amphiboles form two visually discrete clusters (cluster 1 = SK408, SK385, felsic enclave from SK386B; cluster 2 = SK385, SK386B, SK388, SK390, SK394A, SK394C) in both Si vs Ca (**Fig. 3a**) and Mg vs Al (**Fig. 3b**). Both clusters show negative correlation for Si vs Ca, with cluster 1 ranging from 6.6 – 7.2 Si apfu (atoms per formula unit) compared with 6.0 – 6.5 apfu for cluster 2 (**Fig. 3a**). Given the strong negative correlation between amphibole Si and temperature (Putirka, 2016), this qualitatively suggests that cluster 1 formed at lower magmatic temperature 207 than cluster 2. Cluster 1 shows negative correlation between Mg and Al, whereas cluster 2 shows positive 208 correlation. Typically in the Eastern Caribbean these elements are positively correlated in amphibole for both 209 experimental and natural samples (Martel et al., 2013; Melekhova et al., 2017; Pichavant et al., 2002) with a 210 notable exception on Dominica (Solaro et al., 2019). For both Mg vs Al and Si vs Ca there is a significant 211 compositional gap between the two clusters, suggestive of contrasting environments of formation. The SK385 212 amphiboles in cluster 1 are solely analyses from a reaction corona around orthopyroxene. Clinopyroxene exhibits 213 a marked negative correlation between Mg and Al in SK392, compared to a moderate Al decrease with Mg in 214 SK391 (Fig. 3c). Ca and Al positively correlate in clinopyroxene, with SK392 displaying higher Al for a given 215 Ca compared to SK391 (Fig. 3d). In contrast to the felsic enclave in SK386B, the mafic enclave in SK392 spans 216 identical mineral compositional space to its host rock. This implies that the enclave from SK392 was sampled 217 from a similar source region as its host whereas the SK386B enclave is antecrystic sensu lato.

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## 219 Thermobarometry uncertainty estimates

220 An example of one of the 200 models (where each model employs a different test and train dataset split) for the 221 TB(A) and TB(C) can be seen in **Fig. 4**. Amphibole is a remarkably sensitive thermobarometer, producing faithful 222 predictions with low residuals across the full range of temperature (Fig. 4a) and pressure (Fig. 4b). Clinopyroxene 223 is reliable from 900 – 1250 °C, although underestimates at lower temperature (< 900 °C; Fig. 4c). Clinopyroxene 224 produces decidedly more scatter in pressure than amphibole (Fig. 4d). Each resampling of the test and train dataset 225 generates a slightly different model based on the difference in data in the resampled train dataset. This produces 226 a distribution of SEEs for all 200 models (Fig. 5). We take the modal uncertainty for each of these distributions 227 as the uncertainty to be associated with a given estimate of natural data: pressure uncertainties of 1.4 kbar and 2.3 228 kbar for amphibole and clinopyroxene respectively (Fig. 5a), and temperature uncertainties of 40 °C and 65 °C 229 for amphibole and clinopyroxene respectively (Fig. 5b). Using cations or oxides makes negligible difference to 230 the performance of the thermobarometers (Fig. 5). We argue against using site-specific mineral chemistry (e.g., 231 tetrahedral, octahedral) as these rely on assumptions for filling of cation sites, particularly in amphibole, which 232 may bias results.

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234 *Amphibole as a reliable thermobarometer* 

Amphiboles are host to a wide array of cation substitutions (Leake et al., 1997), attributed to changes in intensive
parameters (Blundy and Cashman, 2008). However, amphibole chemistry is more sensitive to temperature and

melt composition than pressure variability. This has historically resulted in good performance of amphibole
thermometers (Holland and Blundy, 1994; Putirka, 2016) and chemometers (Zhang et al., 2017), alongside equally
poor performance of amphibole barometers (Ridolfi and Renzulli, 2012), with the exception of those applied in
multiply-saturated granitic systems (Anderson and Smith, 1995). The excellent performance of our amphibole
barometer (Fig. 4; Fig. 5) is at odds with these previous studies. Indeed, amphibole performs significantly better
as a barometer than clinopyroxene.

243 To rationalise this discrepancy, and assess its robustness, we compare the TB(A) to an amphibole 244 thermobarometer developed using linear regression (Ridolfi et al., 2010; Ridolfi and Renzulli, 2012). We use the 245 test dataset of Erdmann et al (2014), who questioned the ability of amphibole to recover magmatic pressures, 246 which spans lower – mid crustal pressures (2 - 4 kbar) and a range of magmatic temperature (800 - 1000 °C). 247 Results from the TB(A) show a pressure SEE of 0.71 kbar for the test dataset of Erdmann et al (2014), with 93% 248 of pressures recovered to within 1 kbar of the experimental pressure (Fig. 6a). This represents a remarkable 249 improvement compared with the approach of Ridolfi and Renzulli (2012). As is expected from the results of 250 Ridolfi and Renzulli (2012) and Erdmann et al (2014), temperature estimates (Fig. 6b) from amphibole are good 251 (SEE = 23  $^{\circ}$ C), with the TB(A) showing substantially less scatter than that of Ridolfi and Renzulli (2012).

252 Multiple-reaction barometers may offer a robust estimate of pressure, with the limitation of requiring a suite of 253 equilibrated, touching phases. The spinel-clinopyroxene-olivine-plagioclase (SCOIP) barometer of Ziberna et al 254 (2017) provides an equilibration pressure of olivine-bearing enclaves from Dominica (Ziberna et al., 2017) and 255 Saint Kitts (Melekhova et al., 2017) with uncertainties of 0.9 - 2.6 kbar. To further test our barometer, we take 256 Saint Kitts samples from Ziberna et al (2017) that coexist with amphibole and compare the results for amphibole 257 rims to the predicted pressure derived from SCOIP. This offers a metric to evaluate the uncertainty of the TB(A) 258 on natural samples with well-constrained intensive parameters. Fig. 6c - d shows the offset between pressure and 259 temperature predicted using the TB(A), and the estimates of Ziberna et al (2017). All inclusions have a 260 temperature, according to Ziberna et al (2017), of 950 °C  $\pm$ 50 (Fig. 6c). All TB(A) estimates are within the error 261 of  $\pm 50$  °C from Ziberna et al (2017), showing excellent agreement for temperature between the two systems. The 262 exception is a single point from sample KS31 (a plutonic inclusion; interpreted as a fragment of magmatic mush; 263 Melekhova et al., 2017) which has a lower predicted temperature than that of Ziberna et al (2017). This point is a 264 chemical outlier relative to the other samples, with low Mg, high Fe, and very high Mn, explaining the offset in 265 temperature. Pressure estimates (Fig. 6d) also show strong agreement between the two barometers, particularly 266 for the inclusions at 2 kbar which are estimated by the TB(A) as precisely 2 kbar. Estimates of the two samples

(KS7 and KS8 from Melekhova et al., 2017) at 6 kbar by Ziberna et al (2017) span 4 – 6 kbar according to the
 TB(A). This demonstrates that the TB(A) can effectively discriminate between upper and middle crustal pressures
 in Saint Kitts amphiboles.

The inferred pressure sensitivity of amphibole suggests that the machine learning algorithm can recover more nuanced, non-linear relationships between phase chemistry, pressure, and temperature than traditional regression approaches. Hence, we argue that it is the regression strategy, as opposed to the insensitivity to pressure, that hinders previous calibrations of amphibole barometers. This is demonstrated by the agreement between the TB(A), equilibrium experiments (**Fig. 4; Fig. 6a** – **b**), and independent multiple-reaction barometers (SCOIP; **Fig. 6c** – **d**) for a range of compositions and conditions. This conclusion allows us to interrogate the variation of pressure and temperature in the Lower Mansion Series, recorded by amphibole, with confidence.

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## 278 *P-T-X estimates for the Lower Mansion Series*

279 The range of estimated crystallisation pressure for each of the Lower Mansion Series samples are shown in Figure 280 **7a**. SK408 (basal pyroclastic flow) has a restricted pressure of 1.8 - 2.1 kbar. The base of the Mansion Series 281 (SK385) yields higher pressure with respect to SK408, spanning from 2 - 4.5 kbar and a mean of 3.8 kbar. Along 282 the stratigraphy from SK385, pressure consistently decreases to a mean of ~ 2 kbar for SK391, before widening 283 significantly in pressure extent for SK392 (Fig. 7a). The uppermost units (SK394A; SK394C) span 2.7 - 5 kbar. 284 Overall, this suggests the majority of differentiation associated with the Mansion Series magmatism is consistently 285 occurring at  $\sim 2 - 4$  kbar (the middle – upper crust) for samples that contain amphibole. Temperature 286 systematically increases from the basal pyroclastic flow (820 °C) to SK391 (1010 °C), with a slight drop in 287 temperature in SK394A and SK394C (Fig. 7b). Ranges of temperature for each sample are relatively tight (< 60 288 °C) with the exception of SK391 which shows a wider temperature range. Temperature positively correlates with 289 modal An# in the matrix plagioclase, suggesting that this An# increase is being thermally controlled (Fig. 7c). 290 However, plagioclase inclusions in amphibole are consistently An# 80 – 90, with the exception of SK408, raising 291 questions about whether such inclusions are in equilibrium with their host phase (see Discussion).

292 The chemistry of melts predicted by amphibole and clinopyroxene chemometers (Al<sub>2</sub>O<sub>3</sub>, K<sub>2</sub>O, CaO, Na<sub>2</sub>O, MgO,

FeO) plotted versus SiO<sub>2</sub> as a measure of differentiation are shown in Figure 8. Predicted SiO<sub>2</sub> and Al<sub>2</sub>O<sub>3</sub> of

amphibole melts negatively correlate (Fig. 8a). Clinopyroxene melts show a shallower decrease of SiO<sub>2</sub> versus

Al<sub>2</sub>O<sub>3</sub>, initiating from ~ 17.5 wt% Al<sub>2</sub>O<sub>3</sub> at ~ 52 wt% SiO<sub>2</sub> (Fig. 8a). Only predicted melts from SK394C

consistently overlap with the high-Al basalt (> 19 wt% Al<sub>2</sub>O<sub>3</sub>) whole rock samples erupted on Saint Kitts (Fig.

297 8a). Melt K<sub>2</sub>O from amphibole increases with increasing SiO<sub>2</sub> from ~ 0.5 - 2.5 wt%, accordant with a low-K 298 system in which K is incompatible (Fig. 8b). The CaO, Na<sub>2</sub>O, MgO, and FeO of predicted melts (Fig. 8c, d, e, f) 299 plot concordantly with whole rock trends on Saint Kitts, although recalculated melts tend to have lower FeO (Fig. 300 8f) and slightly lower CaO (Fig. 8c) than a whole rock of equivalent SiO<sub>2</sub>. Melts predicted from amphibole in 301 SK408 match closely with glass measurements from the same sample for all elements, implying that amphibole 302 is in equilibrium with the matrix glass (Fig. 8f). In general, some samples (SK408, SK385) display a tight range 303 of melt composition whereas others (SK390, SK391, SK392, SK394C) cover a much wider range, correspondent 304 with their span of mineral chemistry (Fig. 3).

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#### 306 *Comparison with equilibrium experiments*

307 Figure 9 shows a comparison between natural, experimental and thermobarometric information derived from 308 silicate phases. Matches of experimental An# with natural plagioclase phenocrysts, matrix, or inclusions, do little 309 to constrain pressure or temperature. Whilst An# of plagioclase increases strongly with temperature, the 310 overprinting effect of water content and starting composition produces wide fields (Fig. 9). Matching 311 experimental amphibole (Fig. 9a - e; Fig. 9h; Fig. 9i) and clinopyroxene (Fig. 9f; Fig. 9g) with EPMA analyses 312 produces much more constrained pressure-temperature fields in many cases, particularly for temperature (e.g., 313 SK408, SK388, SK394A, SK394C). This is logically the case for amphibole as by matching only Si, the 314 temperature is relatively well constrained (Putirka, 2016). In almost all cases matched clinopyroxene and 315 amphibole from experiments overlap with thermobarometric fields, providing a useful validation of the 316 thermobarometry method. Plagioclase in equilibrium with clinopyroxene and amphibole experimental matches 317 (filled circles in Fig. 9) that overlap with thermobarometry PT estimates (filled polygons Fig. 9) can be used as a 318 metric to infer the An# of the co-crystalising plagioclase. Plagioclase inclusions in amphibole are An# 80 - 90319 with the exception of SK408 (Fig. 7). However, experimental plagioclase in apparent equilibrium with natural 320 amphibole and clinopyroxene consistently falls outside of inclusion chemistry. Matrix plagioclase from natural 321 samples matches much more closely with experimental co-crystallising plagioclase, accordant with the correlation 322 between thermometer temperature and matrix An# (Fig. 7c). This suggests inclusions are poor records of 323 equilibrium plagioclase composition, in particular for Saint Kitts amphiboles.

- 324
- 325 Discussion
- 326

#### **327** *P-T-X-H<sub>2</sub>O versus time in the Lower Mansion Series*

328 The crustal column beneath a volcanic edifice is a thermally and chemically stratified sequence of magmatic 329 minerals (Sparks et al., 2019). This is reflected in the array of phenocryst chemistry and textures from lavas, 330 pyroclastics, and enclaves erupted at a single centre (e.g. Klaver et al., 2018, 2017). Magma may remain resident 331 in the system for long periods, move through relatively unimpeded, or never reach the surface. An evolved crustal 332 column may act as an efficient density (and, by extension, composition) filter for magma (Stolper and Walker, 333 1980). Understanding these processes necessitates the recovery of the key magmatic variables that control the 334 eruptive dynamics of a volcano: pressure (Fig. 7a); temperature (Fig. 7b); melt composition (Fig. 8); melt water 335 content. The latter requires direct H<sub>2</sub>O measurement of mineral-hosted melt inclusions (Danyushevsky et al., 336 1993; Hervig et al., 1989; Zajacz et al., 2005), hygrometry (Waters and Lange, 2015), or calculation of melt H<sub>2</sub>O 337 using partition coefficients derived from nominally anhydrous minerals (e.g. clinopyroxene and orthopyroxene; 338 Edmonds et al., 2016; Hauri et al., 2006). Melt inclusions may be entirely absent in crystals or disproportionately 339 represented in certain domains (core or rim) due to a propensity to form along cracked surfaces (Faure and 340 Schiano, 2005) or during discrete heating, dissolution, and reprecipitation events (Cashman and Blundy, 2013; 341 Edmonds et al., 2016; Nakamura and Shimakita, 1998). Indeed, amphibole-hosted melt inclusions in Saint Kitts 342 samples are sparse. To overcome this, we combine melts from amphibole chemometry (this study) with the modal 343 plagioclase matrix composition (Fig. 7c; Higgins et al., 2021) to give a series of plagioclase – melt pairs. These 344 plagioclase - melt pairs were used in the hygrometer of Waters and Lange (2015) which can predict melt water 345 content with an SEE of 0.35 wt%. We assess whether these melts are saturated in a vapour phase using equation 346 10 in Zhang et al (2007) at the conditions described by our thermobarometers. For clinopyroxene bearing samples, 347 hygrometer calibrations for specific melt compositions exist (e.g. alkaline Etnean magmas; Armienti et al., 2013; 348 Perinelli et al., 2016), although globally applicable calibrations are lacking. Instead, we use estimates from 349 experimental matches (Fig. 9) to infer melt water contents in equilibrium with Saint Kitts clinopyroxene where 350 possible.

The samples from the Lower Mansion Series show a progressive temperature increase, evidenced through matrix plagioclase An# increase and thermometry (**Fig. 7b**; **Fig. 7c**), coupled with relatively stable barometric estimates for several deposits (**Fig. 7a**). We will now place this into the context of the evolving sub-volcanic system, using our full P-T-X-H<sub>2</sub>O versus (relative) time dataset (**Fig. 10**).

355

356 *Clearing out the pipes of the magma plumbing system* 

357 The lower pressure of SK408 ( $\sim 2$  kbar) compared to the majority of the sequence (Fig. 7a), along with its 358 experimental phase assemblage matches (Fig. 9), indicates protracted residence in the upper crust: rhyolitic glass, 359 orthopyroxene, amphibole, plagioclase and Fe-oxides are found in a subset of similar pumice from Dominica that 360 have been linked to upper crustal differentiation (Solaro et al., 2019). Quartz grains in SK408 can be ascribed to 361 prolonged cooling in the upper crust in equilibrium with rhyolitic glass and albitic plagioclase (Solaro et al., 2019). 362 Late stage resorption (rounding) is invoked by the contraction of the cotectic in the An-Ab-Qtz ternary (granite 363 minimum) towards the quartz end member during decompression (Ghiorso and Gualda, 2015). The match 364 between the predicted liquid from amphibole chemometry (Fig. 8) and the rhyolitic glass from SK408 implies 365 amphibole was a late crystallising phase. Hence the TB(A) records a robust estimate of final equilibration 366 conditions in SK408. Therefore, we suggest that SK408 acted as an upper-crustal plug to the volcanic plumbing 367 system. As such, the pronounced compositional gap for magmas (pyroclastics or lavas) at 66 - 72 wt% SiO<sub>2</sub> on 368 Saint Kitts could reflect an intrinsic feature of melt production: melt that evolves beyond ~66 wt% SiO<sub>2</sub> is difficult 369 to erupt in large quantities. Therefore, eruptions of magmas with  $> 66 \text{ wt}\% \text{ SiO}_2$  are restricted to rare dome 370 effusions (e.g., the Salt Pond Dome; Baker, 1984), as rhyolitic glass in upper crustal bodies following protracted 371 cooling (SK408), or slithers of evolved, interstitial melt erupted inside fragments of the deeper plutonic system 372 (Melekhova et al., 2017; this study). Mineral-hosted (predominantly clinopyroxene and plagioclase; Fig. 8a) melt 373 inclusions fill this compositional gap and are typically erupted in magmas with < 66 wt% SiO<sub>2</sub> (Supplementary 374 Fig. 3; Cooper et al., 2020; Melekhova et al., 2017). An analogue to this in the Eastern Caribbean may be Bequia 375 (Camejo-Harry et al., 2018) where melts are consistently more evolved than concomitant lavas, revealing a lack 376 of either sufficient size or efficient melt extraction in the magmatic system. A rare exposed window into an 377 equivalent plutonic regime may be found on Saint Martin in the north of the extinct Limestone Caribbees where 378 the evolved granodiorite pluton spans 62 - 75 wt% SiO<sub>2</sub> (Davidson et al., 1993). Given the assertion that 379 amphibole crystallised in equilibrium with the matrix glass we can also be confident that the predicted melt water 380 content (6.1 wt% H<sub>2</sub>O; water saturated at 2 kbar; Fig. 10) is indicative of the final, pre-eruptive melt water content 381 for SK408.

382

**383** *Progressive increase of temperature in time* 

Removing this chemically evolved, upper-crustal plug permitted less evolved material to be erupted from the
 middle – upper crust (2 – 5.5 kbar; Fig 7a; Fig. 10). Magmatic temperatures increase consistently along with An#

386 of matrix plagioclase. Although constraining a timescale from palaeosoils is difficult due to highly variable

accretion rates in the Caribbean, the sparse palaeosoils between SK386B and SK390 imply this increase is happening over short (decadal to millennial) timescales (Higgins et al., 2021). As thicker deposits (e.g., SK390 and SK391) tend to sample a wider variety of plagioclase phenocryst chemistry (Higgins et al., 2021), the mechanism that generates larger volume eruptions is not necessarily coupled to the thermal maturation at this temporal scale. Relationships between erupted volume and deposit thickness are likely to hold true at the proximity to the source of the Mansion Series stratigraphy in this study (Fig. 1), as shown by mapping of dispersal characteristics on Saint Kitts (Roobol et al., 1985).

Melt water content from hygrometry reveals a relatively limited range from 5 – 6.7 wt% H<sub>2</sub>O. This is in excellent
agreement with water contents of Saint Kitts melt inclusions (Cooper et al., 2020; Melekhova et al., 2017). All
amphibole melts from SK385, SK386B, SK388, and SK390 are water-undersaturated according to equation 10 of
Zhang et al (2007). The felsic enclave in SK386B is an exception, with melts recording the same water-saturated
conditions as SK408. In fact, the similar mineralogy, water content (Fig. 10), pressure (Fig. 7a), temperature (Fig.
7b), and melt chemistry (Fig. 8) between the felsic enclave in SK386B and sample SK408 suggests the former
could be the plutonic (intrusive) equivalent of the latter, scavenged during ascent through the upper crust.

401

## 402 *Peak thermal maturity reflected in clinopyroxene – amphibole phase relations*

403 In SK391 and SK392, clinopyroxene is present as phenocrysts and amphibole is absent. This agrees with the 404 examination of our experimental database which shows that, at middle to upper crustal conditions, the Saint Kitts 405 magmas lie outside of any stability field in which amphibole and clinopyroxene coexist. Instead, olivine and 406 clinopyroxene crystallise at the expense of amphibole. This is a well-established incongruent thermal reaction 407 driven by decreasing temperature (liquid + clinopyroxene  $\rightarrow$  amphibole), observed in experimental (Foden and 408 Green, 1992) and natural (Smith, 2014) samples including Lesser Antilles enclaves (Cooper et al., 2016; 409 Melekhova et al., 2017). Therefore the crystallisation of clinopyroxene and amphibole from high-Al basalts 410 (Andújar et al., 2015; Foden and Green, 1992; Melekhova et al., 2017; Melekhova et al., 2021) and dacites 411 (Marxer and Ulmer, 2019; Pichavant et al., 2002; Solaro et al., 2019) equivalent to inferred Saint Kitts starting 412 compositions can impart information about the thermal balance establishing in the system through time (Fig. 10). 413 Effectively, the amphibole – clinopyroxene transition is merely reflecting the thermal state of the magma beneath 414 Saint Kitts (phase boundaries in Fig. 10). Peak temperatures are represented by SK391 and SK392 which have 415 crossed into the clinopyroxene field. Higher temperature amphibole melts (SK386B, SK390) lie closer to the 416 "amphibole in" boundary, with decreasing temperature driving amphibole melts to higher SiO<sub>2</sub> (Fig. 9b). More

417 evolved (cooler) melts that lie further from this boundary should crystallise less anorthitic plagioclase (e.g.,
418 SK385), in agreement with matrix plagioclase mineral chemistry (Higgins et al., 2021).

419 The difference between clinopyroxene and amphibole thermobarometry estimates on Saint Kitts is mirrored in 420 their equilibrium melt chemistry (Fig. 8). Al<sub>2</sub>O<sub>3</sub> shows a decrease versus SiO<sub>2</sub> for clinopyroxene melts (Fig. 8a). 421 This is typical of melts saturated in plagioclase (Grove et al., 2012; Sisson and Grove, 1993). Considering 422 decreasing Mg as an indicator of progressive differentiation, and that calcic plagioclase is one of the dominant 423 sinks of Al in arc magmas, we would expect Al in clinopyroxene to decrease with decreasing Mg in the presence 424 of abundant plagioclase (Klaver et al., 2017). In SK392 the opposite is true (Fig. 3c), despite predicted melt 425 chemistry that attests to plagioclase saturation. Combined, these melt and mineral chemistry features represent 426 two competing effects. Firstly, plagioclase saturation increases Al-activity in the melt, increasing Al with 427 decreasing Mg in clinopyroxene, as noted in experimental studies (Nandedkar et al., 2014; Villiger et al., 2007). 428 Secondly, the clinopyroxene to plagioclase ratio is affected by melt water content. At fixed pressure and 429 temperature, and increasing water activity, the ratio of clinopyroxene to plagioclase increases. This is because 430 water destabilises plagioclase but has less effect on clinopyroxene abundance at these conditions (Andújar et al., 431 2015; Sisson and Grove, 1993). Therefore, we suggest that the clinopyroxene from SK392 represents 432 crystallisation from a wet, but water-undersaturated, high-Al basalt that cooled between 1025 °C and 950 °C. This 433 cooling would largely explain the range of melt chemistry from the clinopyroxene chemometer (Fig. 8) as well 434 as the increase in Al in the clinopyroxene during differentiation, resulting from an increase in melt  $H_2O$ 435 (suppressing plagioclase) during crystallisation. The subtle balance between clinopyroxene and plagioclase 436 mineral fraction is mirrored in the shallower trend in melt  $Al_2O_3$  versus  $SiO_2$  (Fig. 8a), indicative of a smaller 437 fraction of plagioclase than coexists with the amphibole melts. Amphibole melts show the same decrease in  $Al_2O_3$ , albeit with a trend that initiates from a higher initial Al<sub>2</sub>O<sub>3</sub> than the clinopyroxene melts (Fig. 8a). Amphibole 438 439 from SK394C records a notably higher Al<sub>2</sub>O<sub>3</sub> content than any other sample. This suggests a more protracted 440 stage of fractionation of Al-poor phases (olivine, clinopyroxene, orthopyroxene, spinel) prior to plagioclase 441 saturation. The slightly hooked appearance of the Al<sub>2</sub>O<sub>3</sub> versus SiO<sub>2</sub> trend may even indicate the final moments 442 of a melt at the cusp of plagioclase saturation. The larger degree of fractionation of the parent melt to the 443 amphiboles of SK394C is also reflected in its melt water content, the highest of any sample (modal peak of 6.5 444 wt% H<sub>2</sub>O; Fig. 10b).

445

446 *Cryptic fractionation from andesitic melts unveiled by amphibole chemometry* 

447 A feature of melt inclusion records in arc magmas is a pronounced bimodality in SiO<sub>2</sub> (wt%), whereby melt 448 inclusion chemistry correlates poorly with host bulk rock chemistry in the andesitic range (Reubi and Blundy, 449 2009). However, results from amphibole chemometry show a large proportion of melts with 55 - 65 wt% SiO<sub>2</sub>, 450 covering much of the spectrum that is conspicuously absent in melt inclusions (Fig. 8a). This suggests that 451 amphibole chemometry effectively reveals cryptic andesitic melts within the volcanic sub-system. Cryptic 452 evolved melts are recorded in plagioclase via a similar process in the monotonous basaltic magmas of the 453 Gálapagos (Stock et al., 2020). Upon amphibole crystallisation, the surrounding melts are chemically propelled 454 from andesitic composition towards more silicic melts via two effects. Firstly, amphibole exerts a large 455 differentiation effect on the melt due to its low silica content relative to other common fractionating silicates in 456 arc systems. Secondly, amphibole generally appears in the "liquid line of descent" at a point where arc magmas 457 spend a relatively short period of time, resulting in rapid differentiation and a low occurrence probability of 458 andesitic melts (Caricchi and Blundy, 2015; Marsh, 1981; Müntener and Ulmer, 2018; Nandedkar et al., 2014). 459 Based on this evidence amphibole may have a significant effect not just on trace element behaviour (Davidson et 460 al., 2007; Smith, 2014) but also on major element behaviour in arc magmas.

461

## 462 *Late-stage waning*

463 In the overall trend of the sequence, SK394A and SK394C represent a minor, late-stage thermal waning that 464 results in re-crossing of the amphibole – clinopyroxene cotectic (Fig. 10b). However, these samples also appear 465 to be more representative of the dominant magma composition in the sub-volcanic system. This is revealed by 466 textural segmentation of quantified chemical maps (Higgins et al., 2021; Sheldrake and Higgins, 2021) which 467 show an increased abundance of homogeneous, high-An# crystals in the upper units of the stratigraphy, as well 468 as mean An# of matrix plagioclase and phenocryst plagioclase converging to near uniformity. The appearance of 469 a less-evolved composition is preserved almost entirely in the mineral chemistry, with the bulk rock from the 470 Lower Mansion Series broadly overlapping with the most common composition erupted throughout the history 471 of Saint Kitts volcanism (an andesite with  $\sim$ 58 wt% SiO<sub>2</sub> and  $\sim$ 17.4 wt% Al<sub>2</sub>O<sub>3</sub>. Supplementary Fig. 3). This 472 contrasts with the varied mineral chemistry and textures, particularly in plagioclase (Higgins et al., 2021; Fig. 7c; 473 Fig. 9).

The observable disequilibrium between plagioclase inclusions in amphibole and amphibole temperature may be
explained by a similar process. Essentially the melt and the crystal column through which it moves are chemically
decoupled from one another. Ascending melts that crystallise amphibole may cannibalise small, high-An# crystals

477 that reveal the dominant chemistry in the subvolcanic region but not necessarily the crystal in equilibrium with 478 the package of melt from which the amphibole crystallised. As the magmas leaving the top of the system transition to a more representative composition of the magmatic system in time (e.g., SK394A, SK394C), the plagioclase 479 480 inclusion chemistry, phenocryst chemistry and matrix chemistry converge. Such an observation is unsurprising 481 considering an identical process occurs in plagioclase phenocrysts in the form of rare, high-An# cores in SK408 482 (Higgins et al., 2021). This process is consistent with "petrological cannibalism" whereby chemically and spatially 483 disparate crystals from the plutonic sub-system are scavenged and amalgamated into a final erupted product 484 (Cashman and Blundy, 2013; Davidson et al., 2007; Reubi and Blundy, 2008). An# of inclusions would not re-485 equilibrate with the host amphibole due to the slow rates of CaAl–NaSi interdiffusion in plagioclase at magmatic 486 temperatures (Grove et al., 1984), which may even surpass cooling timescales of some magma reservoirs 487 (Pichavant et al., 2007). Resorption could not occur as the plagioclase is entombed in its host and is therefore 488 chemically isolated from the reactive magma volume (Pichavant et al., 2007). Our observations raise questions 489 surrounding the validity of using inclusions in amphibole as equilibrium pairs for thermobarometry.

490

#### 491 *Evidence for a vertically extensive magmatic system?*

492 Evidence from modelling, geochemistry, and geophysics over the last two decades asserts that magmatic systems 493 should be considered as transcrustal entities (Annen et al., 2006; Christopher et al., 2015; Sparks et al., 2019). 494 One of the key features of these systems is that much of the differentiation is staged in the deep crust, which acts 495 as a factory for cumulate textured rocks, whereas the middle – upper crust is a vertically extensive system that 496 hosts more ephemeral bodies of melt and crystals (Annen et al., 2006; Cashman et al., 2017; Hildreth and 497 Moorbath, 1988; Jackson et al., 2018). The results of our thermobarometry add support to this view. The depth 498 range of the inferred magmatic system beneath Saint Kitts extends from 2 kbar to ~5.5 kbar, equivalent to a depth 499 of 3-15 km (crustal density 2.7 g/cm<sup>3</sup>; Fig. 10). This is consistent with the vertical extents for the upper portion 500 of inferred transcrustal magmatic systems beneath stratovolcanoes in the Eastern Caribbean (Camejo-Harry et al., 501 2018; Christopher et al., 2015; Cooper et al., 2016; Edmonds et al., 2014) and elsewhere (Cashman and Blundy, 502 2013). In general, there is a moderate increase in the vertical extent (pressure range) over which crystallisation 503 occurred, coincident with clinopyroxene crystallisation (Fig. 10). Critically, however, the majority of magma 504 released by the investigated eruptions (except SK408) are sourced from a significant range of depth in the crust 505 (Fig. 7; Fig. 10).

506 The sub-vertical pressure-temperature gradient on Saint Kitts (Fig. 10), present throughout the eruption history, 507 suggests that magmas were erupting from a thermally mature crust: if the crust was to have a pristine geothermal 508 gradient, shallower magmas should be much cooler than deeper magmas (Karakas et al., 2017) which is not the 509 case on Saint Kitts. However, the uncorking of the upper crustal system (SK408) likely removed a significant 510 amount of heat from the system. Therefore, if we consider a rather constant average long-term magma flux (e.g. 511 Caricchi, 2013), the eruptive sequence on Saint Kitts reflects a thermal contraction as the system recovers to its 512 steady state. Recovery may be signified by the point at which the matrix plagioclase, phenocryst plagioclase, and 513 inclusion chemistry in amphibole converge (i.e., the upper units of the series; Fig. 7; Fig. 10; Higgins et al., 2021). 514 The composition at which they converge is An# 80 - 90, the most abundant phenocryst chemistry throughout the 515 Lower Mansion Series sequence (Higgins et al., 2021), and therefore the most sampled inclusion chemistry. The 516 dominance of relatively unzoned, anorthite-rich plagioclase in cumulate textured enclaves on Saint Kitts supports 517 this view (Melekhova et al., 2017).

518

#### 519 Conclusions

520 We have calibrated a clinopyroxene-only and amphibole-only thermobarometer that yield performance 521 comparable to (in the case of clinopyroxene; Fig 4c; Fig. 4d) and far exceeding (in the case of amphibole; Fig 4a; 522 Fig. 4b) that of existing thermobarometers (Petrelli et al., 2020; Ridolfi et al., 2010; Ridolfi and Renzulli, 2012). 523 Equilibrium experiments, as well as natural samples with well-constrained pressure and temperature, were used 524 to independently verify the performance of the amphibole thermobarometer, in many cases recovering pressures 525 to within  $\sim$  1kbar of known values (Fig. 8). This suggests that amphibole acts as a reliable indicator of magma 526 storage pressure and temperature without requiring multiple saturation conditions with liquid or other solid phases. 527 Machine learning regression uncovers subtle relationships between intensive parameters and mineral chemistry, 528 unaccounted for by conventional linear regression approaches (e.g. Ridolfi and Renzulli, 2012). Chemometers, 529 recorders of melt chemistry in equilibrium with a mineral phase, delineate evolution trends in excellent agreement 530 with those elucidated by whole rock and melt inclusion chemistry from Saint Kitts (Fig. 7). The ability to predict 531 melt chemistry has wide-reaching future applications in Earth sciences, including combination with viscosity 532 models (Giordano et al., 2008).

533 Thermobarometry and chemometry (this study), coupled with hygrometry (Waters and Lange, 2015), have
534 allowed us to unpick the P-T-X-H<sub>2</sub>O versus time of the evolving sub-volcanic reservoir beneath Saint Kitts (Fig.
535 6; Fig. 9). The basal pyroclastic flow removed an upper-crustal plug that had formed at ~2 kbar, allowing

536 progressively hotter, amphibole-saturated magma to move through from depth (2-5.5 kbar). Continuous increase 537 in temperature resulted in the crossing of a cotectic, forming clinopyroxene at the expense of amphibole (Foden 538 and Green, 1992). Frozen snapshots of this incomplete reaction can be found in the plutonic magmatic inclusions 539 erupted on the island (Melekhova et al., 2017). Thermobarometry and chemometry of amphibole and 540 clinopyroxene were paired with equilibrium experiments that match closely to their mineral chemistry. This 541 identified disequilibrium in amphibole-hosted plagioclase inclusions. The magma most representative of the 542 subvolcanic reservoir beneath Saint Kitts is reflected in the uppermost units (SK392 – SK394C) where plagioclase 543 phenocrysts, matrix and inclusions become relatively chemically invariant.

544 Compared with multi-reaction barometers that rely on melt or equilibrium pairs, the TB(A) and TB(C) can record 545 the entire history of each crystal. This drastically increases the probability of sampling the true extent of the 546 magmatic system. Bias may be introduced when melt or matrix chemistry is used in liquid-dependent 547 thermobarometers: pressure estimates are skewed towards lower pressures as matrix melt was crystallised last and 548 is more likely to have equilibrated in the shallowest portion of the magmatic system. Hence the global estimate 549 of 2 kbar for most upper-crustal magmatic systems (e.g. Plank et al., 2013) is likely an absolute minimum, 550 representing the roof as opposed to the main thermal engine of a volcanic plumbing system.

551 Our approach has facilitated a link between an eruptive cycle for an arc volcano (Mount Liamuiga, Saint Kitts) 552 and the intensive parameters that govern eruptive behaviour. This is particularly important in a system where 553 whole-rock variation clearly masks much of the nuances uncovered using mineral chemistry (this study; Higgins 554 et al., 2021) which may not be the case in certain unique examples (Gertisser and Keller, 2003). By extending our 555 approach to other volcanic systems we may better uncover the links between the temporally evolving chemical 556 and physical properties of magma and the eruptive behaviour of volcanoes.

557

#### 558 Figure Captions

559

Fig. 1. (a) Geological map of Saint Kitts, Lesser Antilles, modified after Martin-Kaye (1959). The four volcanic
centres young towards the north west. The active centre is Mt Liamuiga which is responsible for the deposition
of the Mansion Series. Peléan Style volcanic domes of various ages outcrop across the island (e.g., Baker, 1968).
Study locality is a sea cliff showing a well-exposed pyroclastic fall sequence between the villages of Mansion and
Tabernacle. (b) Stratigraphic sequence that is the focus of this study. A basal pyroclastic flow deposit (sample
SK408) separates the Lower Mansion Series (Unit A – C according to Roobol et al., 1981)

566

Fig. 2: Amphibole and clinopyroxene bearing experiments used to train the models for the thermobarometers
presented in this study. Note that amphibole stability is thermally dependent (≤ 1050°C). Clinopyroxene spans a
wider range of temperatures at a given pressure. Both phases are stable across the pressure range studied (0.002
- 12 kbar), although amphibole stability requires lower temperature at lower pressure (dashed line). Arrows with
chemical element labels indicate qualitative relationships between pressure, temperature, and phase composition
[1200, 831]

573

574 Fig. 3: Cation variation diagrams for amphibole (23 oxygens) and clinopyroxene (6 oxygens). Panels are Si vs Ca
575 (a) and Mg vs Al (b) for amphibole and Ca vs Al (c) and Na vs Mg (d) for clinopyroxene

576

Fig. 4: Binary plot reporting the pressure and temperature prediction of a test dataset for amphibole (a; b) and
clinopyroxene (c; d). Models represent estimations for one of the 200 repetitions of the splitting of the test and
train datasets. In this case the model selected is the best performing (lowest SEE) of the 200 repetitions
[1200,1028]

581

Fig. 5: Standard error estimate (SEE) distributions for test datasets for each of the 200 splits of test and train
datasets. (a) Pressure SEE distributions for amphibole and clinopyroxene. (b) Temperature SEE distributions for
amphibole and clinopyroxene. Note that for both pressure and temperature, models using cations show very little
difference compared to models using oxides [1200, 702]

586

Fig. 6: Performance of amphibole barometer assessed using: (a) experimental pressure; (b) experimental
temperature; (c) natural temperature; and (d) natural pressure as comparators. Experimental samples from the
dataset of Erdmann et al (2014) are compared to predictions by the amphibole only thermobarometer of Ridolfi
et al (2010; RR10) and Ridolfi and Renzulli (2012; RR12). Natural samples are amphibole rims from Saint Kitts
magmatic inclusions (Melekhova et al., 2017) which appear in Ziberna et al (2017). Black error bars are reported
from Ziberna et al (2017)

593

- Fig. 7: Distribution of pressure (a), temperature (b), and plagioclase chemistry (c) for Saint Kitts amphibole (black
  outlined barplots) and clinopyroxene (grey outlined barplots). Light brown bars indicate palaeosoils, grey bars
  indicate units analysed in this study, white bars indicate other volcanic units (Higgins et al., 2021) [1288, 695]
- 597

Fig. 8: Binary geochemical Harker plots for all elements predicted by amphibole and clinopyroxene chemometry
in the Lower Mansion Series. Uncertainties for chemometers are quoted in Supplementary Table 1. Data sources:
this study; Baker, 1984, 1968; Higgins et al., 2021; Melekhova et al., 2017; Toothill et al., 2007 [1291, 749]

601

Fig.9: Comparator plot for natural, experimental, and thermobarometry data relevant to each unit from the Lower
Mansion Series. An extensive experimental dataset (references from Supplementary Table 1) has been subsetted
so as to match Saint Kitts mineral compositions (see text for details). This enables the recovery of pressure and
temperature fields. In general, amphibole and clinopyroxene fields are much more constrained than plagioclase,
orthopyroxene or olivine

607

Fig.10: Snapshots (a, b) of the magmatic system of Saint Kitts as recorded by the eruptive products of the Lower
Mansion Series, using amphibole and clinopyroxene thermobarometry. Basalt clinopyroxene – amphibole phase
boundaries: Foden and Green (1992). Dacite clinopyroxene – amphibole phase boundaries: Marxer and Ulmer
(2019); Solaro et al (2019) [892,693]

612

613 Supplementary Fig. 1: Pairs plots of data used to calibrate amphibole only (a) and clinopyroxene only (b)
614 thermobarometers. Data are cations on the basis of 23 and 6 oxygens respectively (all Fe as FeO) [850, 781]

615

**Supplementary Fig. 2**: A single decision tree cut at level 4 for determination of temperature (°C; end of branches) on the basis of cation chemistry. Note that a subset of the predictor variables (Ti, Al, Fe, Na, Mn) are used in a single tree as opposed to all predictor variables. This is termed "feature randomness" and is designed to create trees that are as uncorrelated with one another as possible. Once the structure of each tree has been created during the machine learning process, analyses with unknown temperature (e.g., Saint Kitts analyses) are cascaded through all of the decision trees in the forest to arrive at a temperature by means of the temperature with the most votes (i.e., a wisdom of the crowd approach)

623

624	Supplementary Fig. 3: SiO <sub>2</sub> (wt%) and Al <sub>2</sub> O <sub>3</sub> (wt%) histograms for Saint Kitts volcanics. Dashed lines show
625	modal values. Data sources: this study; Baker, 1984, 1968; Higgins et al., 2021; Melekhova et al., 2017; Toothill
626	et al., 2007 [1291, 749]
627	
628	Supplementary Table 1: Table of experiments used to calibrate the amphibole only (a) and clinopyroxene only
629	(b) thermobarometers
630	
631	Supplementary Table 2: Mode and range (minimum and maximum) standard error estimates (SEE) for
632	temperature-dependent amphibole and clinopyroxene chemometers (SiO <sub>2</sub> , Al <sub>2</sub> O <sub>3</sub> , CaO, Na <sub>2</sub> O, K <sub>2</sub> O, MgO, FeO)
633	in wt%. SEE modes and ranges are derived from $n = 200$ models with variable splitting of test and train datasets,
634	mirroring the method used for thermobarometers. See text for details
635	
636	
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928



Figure 1



Figure 2



Figure 3



Figure 4



Figure 5



Figure 6



Figure 7



Figure 8



Figure 9



Figure 10



**Supplementary Figure 1** 



**Supplementary Figure 2** 



**Supplementary Figure 3**