# A Moving Lagrangian Mesh Model of a Lava Dome Volcano and Talus Slope 

Dr. Nick Robertson<br>Department of Mathematics<br>Reading University, UK

August 21, 2006

Submitted as part of:
M.Sc. in Numerical Solutions to Differential Equations

## Declaration:

I confirm that this work is my own and the use of all other material from other sources has been properly and fully acknowledged.

Nick Robertson

## Acknowledgments

First I would like to acknowledge the EPSRC for allowing me the opportunity to study this course and fund this research.

Thanks go to Geoff Wadge for the idea this dissertation is based on and all the staff in the Mathematics department for running and teaching such a stimulating course; especially Sue Davis for being so bright and jolly all the time. But I would particularly like to thank Mike Baines for having the time to explain pretty much everything several times, supervising this dissertation, and for understanding me.

And thanks also go to all the students on the course and a few PhD students for all the drinking, and general fun and games.

But most of all, I want to thank all my friends and family who have supported me during these last two very difficult years.

This dissertation is dedicated to good friends.

## Contents

1 Introduction ..... 7
1.1 Background ..... 7
1.2 Previous Work ..... 9
1.3 Description of this Document ..... 10
2 The Slab Volcano ..... 11
2.1 The Mathematical Model ..... 12
2.1.1 Rheology Equations ..... 12
2.1.2 Dome and Talus ..... 13
2.1.3 Lagrangian Mesh ..... 14
2.1.4 Application of Constraints ..... 16
2.1.5 Interface Conditions ..... 18
2.1.6 The Final Equations ..... 19
2.2 The Algorithm ..... 19
2.3 Setting Up The System ..... 20
2.3.1 The Dome and Talus Geometry ..... 20
2.3.2 Discretisation of the Dome into Lagrangian Cells ..... 22
2.3.3 The Extrusion Function ..... 24
2.3.4 Rheology and Difference Methods ..... 25
2.4 Time Step Evolution of the System ..... 25
2.4.1 Lagrangian Cell Boundaries ..... 25
2.4.2 Finding $h_{i}$ Using Back-Recursion ..... 26
2.4.3 Talus/Dome Volume Balance Iteration ..... 27
2.4.4 Time Step Results ..... 29
3 The Radial Volcano System ..... 30
3.1 The Mathematical Model ..... 30
3.1.1 Rheology Equations and Continuity ..... 30
3.1.2 Dome and Talus ..... 31
3.1.3 Lagrangian Mesh ..... 33
3.1.4 Formation of the Last Equation ..... 34
3.1.5 Equations as a Matrix System ..... 36
3.2 The Algorithm ..... 37
3.3 Setting Up The Radial System ..... 39
3.3.1 The Dome and Talus Geometry ..... 39
3.3.2 Discretisation of the Dome into Lagrangian Cells ..... 39
3.3.3 Rheology and difference methods ..... 39
3.4 Time Step Evolution of the System ..... 40
3.4.1 Lagrangian Cell Boundaries ..... 40
3.4.2 Talus/Dome Volume Balance Iteration ..... 40
3.4.3 Finding $h_{i}$ Using Back-Recursion ..... 41
3.4.4 Time Step Results ..... 42
4 Running the Models ..... 43
4.1 Geological Observations of The Volcanic system ..... 43
4.2 Non-dimensionalisation ..... 44
4.3 The Slab Model - Choosing $\delta t$ and $I$ ..... 46
4.4 The Radial Model - Choosing $\delta t$ and $I$ ..... 47
CONTENTS ..... 5
5 Results and Discussion ..... 50
5.1 The Slab Model ..... 50
5.2 The Radial Model ..... 55
5.3 Re-Dimensionalisation ..... 57
5.4 Comparisons With Previous Work ..... 57
6 Conclusions and Future Opportunities ..... 59
6.1 Summary of Conclusions ..... 59
6.2 Future Opportunities ..... 61
6.2.1 Improvements to the Radial Model ..... 61
6.2.2 Improvements to the Talus Representation ..... 61
6.2.3 Moving to Two Dimensions ..... 62


#### Abstract

Two height averaged expanding Lagrangian mesh models are developed of a lava dome volcano and it's attached talus slope; the first is a simple slab geometry while the second is axi-symmetric. The models are developed in C++ using an object orientated class frame-work.

The Rheology of the lava is modelled in the dome and the talus is fixed by geometric geological observations. Material is extruded into the dome from a volcanic conduit and the model allowed to calculate the expansion of the Lagrangian cells based on the rheological flow of the lava. A conservation law determines the amount of material distributed into the dome and the talus iteratively for each time step.

The slab model is seen to produce results which are compatible with geological observations and previous studies, these however, do not include a talus. The radial model is observed to require further work; several suggestions are made.


## Chapter 1

## Introduction

### 1.1 Background

A Soufrière Hills Volcano on the Caribbean island of Montserrat has been erupting almost continuously for the last eleven years after a dormant period of four hundred years; it is picture on Page 8. The volcano is of a type known as a peléean lava dome, the characteristics of which are the extrusion of thick viscous lava producing a self supporting dome of fluid lava with a rigid carapace where the lava has cooled and solidified. As the dome grows further this carapace breaks and the debris forms incandescent pyroclastic flows down the sides of the dome. These deposits build up and form a hot dangerous talus slope of loose boulders and dust, which eventually completely enshrouds the lava dome. The dome will grow to a height of several hundred meters over a period of several months. Then, every six months or so the dome collapses in a huge spectacular pyroclastic event, depositing the majority of the entire dome and talus into the sea and emitting vast clouds of volcanic dust and pumice into the air. Once the pressure has been released the lava in the volcanic vent can erupt explosively; this is a hazard to the inhabitants of the island.

Lava domes, like all erupting volcanoes, are extremely dangerous due to the very common avalanches of hot rocks and dust down the slopes of the talus. This make any kind of examination other than observation from a distance almost impossible. There is a current team


Figure 1.1: Photograph of the Soufrière Hills Volcano, Montserrat, showing the talus slope surrounding the lava dome.
of geologists examining the volcano with an array of ingenious sophisticated apparatus. But these observation are only able to infer what is occurring deep on the inside of the lava dome. Computer models are a safe way ${ }^{1}$ to obtain an insight into the internal dynamics of the volcano.

To produce a mathematical model of the internal workings of a volcano some knowledge of the fluid dynamics of lava must be known. Experimentation is not easy as lava cannot be produced in the laboratory, nor can it be collected and manipulated as it tends to melt or ignite what ever it comes into contact with. However, historical experiments with analogous fluids have given an insight into the behavior exhibited by lava.

The term Rheology was coined by Eugene Bingham in 1920 and is the study of stress induced flow in materials, which is now a sub-branch of fluid dynamics and is generally regarded as the study of non-Newtonian fluids. Normal fluids, like water, are categorised as Newtonian fluids and have a fixed viscosity. A non-Newtonian fluid's viscosity is a function of the strain rate

[^0]applied to the fluid, there are thus two types: shear-thinning and shear-thickening. Lava, along with paint, is generally regarded as a shear-thinning non-Newtonian fluid, which means that it flows more easily when it is pushed. However, unlike paint, lava has super-heated water trapped as compressed gas bubbles inside it as a result of being produced inside the earth; this tends to make viscous lava rather explosive. There are also chemical changes and crystals which grow as the lava cools, these further effect the viscosity; this complex nature is referred to by Geologists as the rheology of the lava. Two excellent introductions to the subject can be found in [1] and [2].

### 1.2 Previous Work

There has been alot of theoretical work to understand the non-Newtonian properties of lava [3]-[6] and with application to the lava dome volcanoes at Mount St. Helens [7][8], Montserrat [1] and St. Vincent [9]. However, no model has yet taken into account the talus slope on the expansion of the lava dome, it was specifically neglected as a second order effect in [1] and [3].

The models presented in [1] use a two-dimensional finite element mesh to model as many of the dynamic properties as possible within the Montserrat lava dome using Navier-Stokes and the heat/diffusion equation along with empirical formulae for the lava rheology. Endogenous ${ }^{2}$ and exogenous ${ }^{3}$ models were considered as well as the effect of the external carapace. The main problem was found to be the requirement to re-mesh the finite element grid every few time steps due to growth dependent distortions and errors. The models presented here will demonstrate a variable Lagrangian meshing technique to track the growth of the volcano.

The model presented in [3] derives a set of differential equations which take account of the complex rheological nature of the lava and will be used here to set up the system of Lagrangian cells.

[^1]
### 1.3 Description of this Document

In this dissertation two models of a lava dome volcano and talus slope were developed. Both are height averaged and use a variable Lagrangian mesh to track the expansion of the lava dome. A slab model was produced first as a proof of concept and simplifies the volcano to a cross sectional slab, removing the axi-symmetry of the true system. The radial model was then developed. The models were written in object orientated $\mathrm{C}++$ code

Chapter 2 derives the equations needed for the Lagrangian cells in the slab geometry and then explains the algorithm used to evolve the system in time. Then Chapter 3 repeats the procedure for the axi-symmetric model explaining all of the differences induced by the change of geometry to the equations and the algorithm. Chapter 4 explains how the models were run and related to the geological observables while Chapter 5 presents all of the results, observations and conclusions as well as making suggestions about how to improve the radial model. In the final Chapter, the conclusions are summarised and ideas for further future work are presented.

## Chapter 2

## The Slab Volcano

The Rheological approach of [3] which this mathematical model is based on, was developed for an axi-symmetric system. To demonstrate the validity of the variable Lagrangian cell approach derived here, the equations are simplified to build a Cartesian slab model. Essentially this represents a cross section through the volcano and can be thought of as being a rectangular volcanic section of unit length, thus the circular conduit is replaced by a volcanic trench.


Figure 2.1: Schematic diagram of the cross section through a lava dome volcano and talus slope; the dome is split into $I$ Lagrangian cells from $x_{i-1}$ to $x_{i}$. The interface between the dome and the talus is at $x_{I}$. Material is extruded with vertical velocity $w_{s}$ from the volcanic conduit of size $x_{c}$.

### 2.1 The Mathematical Model

### 2.1.1 Rheology Equations

From the paper by Balmforth et al. [3], the axi-symmetric rheology equations are rewritten in a one-dimensional slab form;

$$
\begin{equation*}
\frac{\partial h}{\partial t}+\frac{\partial U}{\partial x}=w_{s}(x) \tag{2.1}
\end{equation*}
$$

where $w_{s}(x)$ is the source term for the lava extrusion as a function of the $x$ co-ordinate, $h$ is the height of the lava dome, and $\frac{\partial U}{\partial x}$ is the change of the rheology term $U$ of the lava with $x$. The rheology term

$$
\begin{equation*}
U=\frac{-n}{n+1}\left|\frac{\partial h}{\partial x}\right|^{\frac{1}{n}-1} Y^{1+\frac{1}{n}}\left[h-\frac{n Y}{2 n+1}\right] \frac{\partial h}{\partial x} \Theta(Y) \tag{2.2}
\end{equation*}
$$

is taken from the paper, where $n$ is an integer which defines the non-Newtonian nature of the lava fluid; $n=1$ is a pure Newtonian fluid, $n<1$ is a shear thinning fluid, and $n>1$ is a shear thickening fluid. $\Theta(Y)$ is the heavyside function with respect to $Y$,

$$
\Theta(Y)=\left\{\begin{array}{ll}
0 & Y \leq 0 \\
1 & Y>0
\end{array},\right.
$$

where $Y$ is defined to be

$$
Y=h-\frac{B}{\left|\frac{\partial h}{\partial x}\right|},
$$

and $B$ is the Bingham number of the lava, defined by

$$
B=\frac{\tau_{p} H}{\eta V}=\frac{\tau_{p} L}{\rho g H^{2}} .
$$

Here, $H, L$ and $V$ are the characteristic ${ }^{1}$ height, length and $x$-directed velocity of the volcanic model, $g$ is the acceleration due to gravity; $\tau_{p}$ and $\rho$ are the yield strength and density of the lava, respectively.

### 2.1.2 Dome and Talus

Now consider the volcanic dome and the talus, growing with time. If the lava's density is assumed to be constant then it is obvious that the volume of lava extruded from the conduit per unit time, $\dot{V}_{E}$, is responsible for the increase in size of the dome and the talus; thus,

$$
\begin{equation*}
\dot{V}_{E}=\int_{0}^{x_{c}} w_{s}(x) d x=\dot{V}_{D}+\dot{V}_{T}, \tag{2.3}
\end{equation*}
$$

where $\dot{V}_{D}$ and $\dot{V}_{T}$ are the rates of change of the volumes of the dome and the talus with time, respectively. The integral represents the total material extruded up to the conduit edge, $x_{c}$, per unit time, since $w_{s}(x)$ is the vertical component of a velocity field.

Now consider the talus, which is assumed to have a fixed slope of angle $\theta$ and is represented in this depth averaged model by a triangle with base located between the dome/talus interface, $x=x_{I}$, and $x=x_{T}$, the end of the talus slope. Thus, the height at the interface, $h(I, t)$, is given by

$$
\begin{equation*}
h_{I}(t)=\left(x_{T}(t)-x_{I}(t)\right) \tan \theta, \tag{2.4}
\end{equation*}
$$

and the talus volume by

$$
V_{T}(t)=\frac{1}{2}\left(x_{T}(t)-x_{I}(t)\right) h(I, t) .
$$

[^2]Substituting for $h(I, t)$ gives

$$
\begin{equation*}
V_{T}(t)=\frac{1}{2}\left(x_{T}(t)-x_{I}(t)\right)^{2} \tan \theta \tag{2.5}
\end{equation*}
$$

and rearranging produces

$$
\begin{equation*}
x_{T}=\sqrt{\frac{2 V_{T}}{\tan \theta}}+x_{I} \tag{2.6}
\end{equation*}
$$

Differentiating equation (2.5) with respect to time results in the rate of change of talus volume,

$$
\begin{equation*}
\dot{V}_{T}=\tan \theta\left(x_{T}(t)-x_{I}(t)\right)\left(\dot{x}_{T}(t)-\dot{x}_{I}(t)\right) . \tag{2.7}
\end{equation*}
$$

### 2.1.3 Lagrangian Mesh

Now consider a moving Lagrangian mesh inside the volcanic dome such that it is split into cells of width $x_{i}-x_{i-1}$, with a height $h(x, t)$ at $x(t)$; the cell boundaries are functions of time. The total volume of the dome is

$$
V_{D}=\int_{0}^{x_{I}(t)} h(x, t) d x
$$

and the volume of a cell is

$$
\begin{equation*}
V_{i}(t)=\int_{x_{i-1}(t)}^{x_{i}(t)} h(x, t) d x \tag{2.8}
\end{equation*}
$$

Assume that each cell has its normalized volume fixed in time, so that

$$
\begin{equation*}
\frac{V_{i}(t)}{V_{D}(t)}=c_{i} \tag{2.9}
\end{equation*}
$$

say. Equations (2.8) and (2.9) are combined into

$$
\begin{equation*}
c_{i}=\int_{x_{i-1}(t)}^{x_{i}(t)} \frac{h(x, t)}{V_{D}(t)} d x \tag{2.10}
\end{equation*}
$$

Since $c_{i}$ is independent of time, $\dot{c}_{i}=0$, hence

$$
\frac{d}{d t} \int_{x_{i-1}(t)}^{x_{i}(t)} \frac{h(x, t)}{V_{D}(t)} d x=0
$$

Using the chain rule for total derivatives,

$$
\frac{d A}{d t}=\frac{\partial A}{\partial t}+\frac{\partial A}{\partial x} \frac{\partial x}{\partial t}
$$

gives

$$
\frac{\partial}{\partial t} \int_{x_{i-1}(t)}^{x_{i}(t)} \frac{h(x, t)}{V_{D}(t)} d x+\left[\frac{\partial}{\partial x_{i}} \int_{x_{i-1}(t)}^{x_{i}(t)} \frac{h(x, t)}{V_{D}(t)} d x\right] \frac{\partial x_{i}}{\partial t}=0
$$

and via integration of the second term

$$
\int_{x_{i-1}(t)}^{x_{i}(t)} \frac{\partial}{\partial t}\left[\frac{h(x, t)}{V_{D}(t)}\right] d x+\left[\frac{h(x, t)}{V_{D}(t)} \frac{\partial x}{\partial t}\right]_{x_{i-1}}^{x_{i}}=0
$$

which is

$$
\int_{x_{i-1}(t)}^{x_{i}(t)} \frac{\partial}{\partial t}\left[\frac{h}{V_{D}}\right] d x+\frac{1}{V_{D}} \int_{x_{i-1}(t)}^{x_{i}(t)} \frac{\partial(h \dot{x})}{\partial x} d x=0
$$

where the partial derivative $\frac{\partial x}{\partial t}$ is now written as $\dot{x}_{i}$ since the cell boundaries are only functions of time. By the quotient rule

$$
\int_{x_{i-1}(t)}^{x_{i}(t)} \frac{V_{D} h_{t}-h \dot{V}_{D}}{V_{D}^{2}} d x+\frac{1}{V_{D}} \int_{x_{i-1}(t)}^{x_{i}(t)} \frac{\partial(h \dot{x})}{\partial x} d x=0
$$

and multiplying by $V_{D}$

$$
\int_{x_{i-1}(t)}^{x_{i}(t)}\left[h_{t}-\frac{h \dot{V}_{D}}{V_{D}}+\frac{\partial(h \dot{x})}{\partial x}\right] d x=0 .
$$

Substituting from equation (2.1) for $h_{t}$ and equation (2.10) for $c_{i}$ gives

$$
-\dot{V}_{D} c_{i}+\int_{x_{i-1}(t)}^{x_{i}(t)}\left[w_{s}(x)-\frac{\partial U}{\partial x}+\frac{\partial(h \dot{x})}{\partial x}\right] d x=0
$$

Integrating, we get

$$
-\dot{V}_{D} c_{i}+\int_{x_{i-1}(t)}^{x_{i}(t)} w_{s}(x) d x-U_{i}+U_{i-1}+h_{i} \dot{x}_{i}-h_{i-1} \dot{x}_{i-1}=0
$$

but this can be summed for all previous $i$, giving

$$
-\dot{V}_{D} C_{i}+\int_{0}^{x_{i}(t)} w_{s}(x) d x-U_{i}+U_{0}+h_{i} \dot{x}_{i}-h_{0} \dot{x}_{0}=0
$$

where

$$
\begin{equation*}
C_{i}=\sum_{j=1}^{i} c_{j} . \tag{2.11}
\end{equation*}
$$

### 2.1.4 Application of Constraints

We notice that the left boundary of the first cell remains fixed, therefore $\dot{x}_{0}=0$, and that at $x=0, h_{x}=0$ due to symmetry, therefore from equation (2.2) $U_{0}=0$ also. We now have $i$ equations in $i$ unknowns;

$$
\begin{equation*}
-\dot{V}_{D} C_{i}+\int_{0}^{x_{i}(t)} w_{s}(x) d x-U_{i}+h_{i} \dot{x}_{i}=0 \tag{2.12}
\end{equation*}
$$

where $\dot{x}_{i}$, the rate of change of the $i^{t h}$ cell boundary, are the $i$ unknowns to be found for $i=1,2 \ldots I$. Also, combining equations (2.3) and (2.7) gives

$$
\dot{V}_{D}=\int_{0}^{x_{c}} w_{s}(x) d x-\tan \theta\left(x_{T}-x_{I}\right)\left(\dot{x}_{T}-\dot{x}_{I}\right)
$$

which is inserted into equation (2.12) to yield

$$
\begin{equation*}
C_{i} \tan \theta\left(x_{T}-x_{I}\right)\left(\dot{x}_{T}-\dot{x}_{I}\right)-C_{i} \int_{0}^{x_{c}} w_{s}(x) d x+\int_{0}^{x_{i}(t)} w_{s}(x) d x-U_{i}+h_{i} \dot{x}_{i}=0 . \tag{2.13}
\end{equation*}
$$

Notice here that the interval of existence for the extrusion function is

$$
w_{s}(x) \in\left[0, x_{c}\right],
$$

since material is only extruded from the conduit, thus

$$
\begin{equation*}
\int_{0}^{x_{i}} w_{s}(x) d x=\int_{0}^{x_{c}} w_{s}(x) d x \quad x_{i} \geq x_{c} \tag{2.14}
\end{equation*}
$$

Notice also that

$$
C_{I}=\sum_{j=0}^{I} \frac{V_{j}}{V_{D}}=\frac{V_{D}}{V_{D}}=1
$$

which together with equation (2.14) produces three distinct cases: $x_{i}<x_{c}, x_{i}>x_{c}$, and $x_{i}=x_{I}$. Equation (2.13) is now valid only for the case where $x_{i}<x_{c}$. In the $x_{i}>x_{c}$ case we obtain

$$
\begin{equation*}
C_{i} \tan \theta\left(x_{T}-x_{I}\right)\left(\dot{x}_{T}-\dot{x}_{I}\right)+\left(1-C_{i}\right) \int_{0}^{x_{c}} w_{s}(x) d x-U_{i}+h_{i} \dot{x}_{i}=0 \tag{2.15}
\end{equation*}
$$

In the $x_{i}=x_{I}$ case $C_{I}=1$ causing cancellation of the extrusion term

$$
\tan \theta\left(x_{T}-x_{I}\right)\left(\dot{x}_{T}-\dot{x}_{I}\right)-U_{I}+h_{I} \dot{x}_{I}=0
$$

and since $h_{I}$, the height of the interface, is given by equation (2.4) the resulting equation is independent of the $I^{\text {th }}$ unknown $x_{I}$;

$$
\begin{equation*}
h_{I} \dot{x}_{T}-U_{I}=0 . \tag{2.16}
\end{equation*}
$$

This means that there are in fact only $(i-1)$ equations for the $i$ unknowns; another equation must be found.

### 2.1.5 Interface Conditions

Consider again the talus/dome interface. Clearly there is continuity of the height either side of the boundary and this will remain true at all time, thus, at the interface, the rate of change of height in the dome must equal the rate of change of height in the talus. Differentiating equation (2.4) with respect to time generates the rate of change of the interface height due to the talus,

$$
\begin{equation*}
\frac{\partial h_{I}}{\partial t}=\left(\dot{x}_{T}-\dot{x}_{I}\right) \tan \theta \tag{2.17}
\end{equation*}
$$

and inserting this into the dome's rheology equation (2.1) yields

$$
\left(\dot{x}_{T}-\dot{x}_{I}\right) \tan \theta=w_{s}\left(x_{I}\right)-\frac{\partial U_{I}}{\partial x}
$$

However, $w_{s} \in\left[0, x_{c}\right]$ and $x_{I}>x_{c}$ since the conduit is contained inside the lava dome, thus the new equation is

$$
\begin{equation*}
\left(\dot{x}_{T}-\dot{x}_{I}\right) \tan \theta=-\frac{\partial U_{I}}{\partial x} \tag{2.18}
\end{equation*}
$$

A further condition from geological observations is that the $x$-derivative of $h$ must also be continuous across the boundary, which generates the Neumann interface condition

$$
\begin{equation*}
\frac{\partial h_{I}}{\partial x}=-\tan \theta \tag{2.19}
\end{equation*}
$$

### 2.1.6 The Final Equations

To remove the unknown $\dot{x}_{I}$ from the first $I-1$ equations, given by (2.13) and (2.15), the first interface condition (2.18) is inserted, producing three equations for the $i$ unknowns: for $x_{i}<x_{c}$

$$
\begin{equation*}
-C_{i}\left(x_{T}-x_{I}\right) \frac{\partial U_{I}}{\partial x}-C_{i} \int_{0}^{x_{c}} w_{s}(x) d x+\int_{0}^{x_{i}} w_{s}(x) d x+U_{i}+h_{i} \dot{x}_{i}=0 \tag{2.20}
\end{equation*}
$$

for $x_{i}>x_{c}$

$$
\begin{equation*}
-C_{i}\left(x_{T}-x_{I}\right) \frac{\partial U_{I}}{\partial x}+\left(1-C_{i}\right) \int_{0}^{x_{c}} w_{s}(x) d x+U_{i}+h_{i} \dot{x}_{i}=0 \tag{2.21}
\end{equation*}
$$

and for $x_{i}=x_{I}$, since $C_{I}=1$,

$$
\begin{equation*}
-\left(x_{T}-x_{I}\right) \frac{\partial U_{I}}{\partial x}+U_{I}+h_{I} \dot{x}_{I}=0 \tag{2.22}
\end{equation*}
$$

all of which have only one unknown, removing the need for a matrix system to find all of the $\dot{x}_{i}$, the Lagrangian cell boundary rates of change.

### 2.2 The Algorithm

Equations (2.20-2.22) provide a way to find the rates of change of the Lagrangian cell boundaries; however, what is really required is the evolution of the dome height and growth of the talus slope with time. The algorithmic method to find these is given briefly here.

Set up the system at $t=0$ :

1. Chose an initial height distribution for the dome and talus, $h(x, 0)$, from geological observations.
2. Given the interface condition for $\left(h_{I}\right)_{x}$ and the initial function $h(x, 0)$, find the talus end point $x_{T}$, the interface location, $x_{I}$ and the total dome volume, $V_{D}$.
3. Discretise the dome into Lagrangian cells, finding: $x_{i} ; h_{i} ; V_{i} ; c_{i} ; C_{i} \forall i$.
4. The extrusion function $w_{s}(x)$ is chosen from geological observations.
5. Use a difference method to estimate the height gradient, $\left(h_{i}\right)_{x} \forall i$.
6. Calculate the Rheology term, $U_{i}$ and its derivative $\left(U_{I}\right)_{x} \forall i$ via a difference scheme.

Once the system is set up the time evolution can begin:

1. Find the cell boundary rates, $\dot{x}_{i} \forall i$.
2. Calculate the new cell edges for the time step, $x_{i}$ using an IVP method.
3. Given the new interface boundary position, iterate the relative dome and talus volume growth until the interface condition for $\left(h_{I}\right)_{x}$ is satisfied and thus calculate the new talus end position.
4. With the volume of the talus found via iteration, calculate the interface height, $h_{I}$.
5. Use back recursion to calculate all of the remaining dome heights, $h_{i}$, from $h_{I}$.
6. Find the new values of $\left(h_{i}\right)_{x} ; U_{i} ;\left(U_{i}\right)_{x}$.
7. Move to the next time step.

This algorithm is implemented into an object orientated frame work using C++.

### 2.3 Setting Up The System

### 2.3.1 The Dome and Talus Geometry

Geological observations show that: the volcanic talus slope is at a constant angle, $\theta$, to the horizontal, and is fixed regardless of the volcano's size; there is a smooth transition between
the talus and the dome, i.e. $h$ and $h_{x}$ are continuous; when the dome is small it is roughly hemispherical. The initial function of dome height $h(x, 0)$ is therefore taken to be a circle, thus

$$
\begin{equation*}
h(x, 0)=\sqrt{h_{0}^{2}-x^{2}} \tag{2.23}
\end{equation*}
$$

where $h_{0}$ is an initial central maximum dome height at $x=0$ given from observation; it is acting in this case as the radius of the hemispherical dome. The interface point, $x_{I}$, is determined from the geometry of the model to be the point at which the tangent to the dome forms an angle $\theta$ to the $x$ axis; thus, from the above

$$
h^{2}=h_{0}^{2}-x^{2} .
$$

Differentiating implicitly gives

$$
2 h \frac{d h}{d x}=-2 x
$$

so that

$$
\frac{d h}{d x}=\frac{-x}{\sqrt{\left(h_{0}^{2}-x_{I}^{2}\right)}} .
$$

At the interface the gradient is equal to the talus slope, $-\tan \theta$, therefore

$$
\tan \theta=\frac{x_{I}}{\sqrt{\left(h_{0}^{2}-x_{I}^{2}\right)}}
$$

Rearranging gives

$$
\begin{equation*}
x_{I}=\frac{h_{0} \tan \theta}{\sqrt{1+\tan ^{2} \theta}}, \tag{2.24}
\end{equation*}
$$

which is the location of the interface and the dome's last Lagrangian cell boundary. The initial talus end location, $x_{T}$, is then found from

$$
x_{T}=\frac{h_{I}}{\tan \theta}+x_{I}
$$

which is a rearrangement of equation (2.4).

### 2.3.2 Discretisation of the Dome into Lagrangian Cells

Now that the location of the interface is known the dome can easily be split into $N$ cells of equal width,

$$
k=\frac{x_{I}}{N} .
$$

A cell is defined to have its lower edge at $x_{i-1}$ and its upper edge at $x_{i}$ for $i=1,2 \ldots I$; the first cell's lower limit is fixed at $x=0$. Thus, the upper cell boundaries are simply given by

$$
x_{i}=\frac{i x_{I}}{N}
$$

the height at each cell upper bound being given by (2.23), the equation of the dome's initial circular perimeter,

$$
h\left(x_{i}, 0\right)=\sqrt{h_{0}^{2}-x_{i}^{2}} .
$$

The dome's initial volume (cross sectional area per unit slab length) is

$$
V_{D}(t=0)=\int_{0}^{x_{I}} \sqrt{h_{0}^{2}-x^{2}} d x
$$

which is easily solved using elementary geometry. Referring to Figure 2.1 on Page 11 and working in the coordinate system $(x, h)$ : recall that the radius of the dome's circular perimeter
is $h_{0}$; the dome region is constrained by the points $(0,0),\left(0, h_{0}\right),\left(x_{I}, h_{I}\right)$ and $\left(x_{I}, 0\right)$; construct a radius from $(0,0)$ to $\left(x_{I}, h_{I}\right)$ splitting the dome into two sections; a triangle, constrained by the points $(0,0),\left(x_{I}, 0\right)$ and $\left(x_{I}, h_{I}\right)$; and a 'slice of pie', constrained by the points $(0,0),\left(0, h_{0}\right)$ and $\left(x_{I}, h_{I}\right)$. The triangle's area is given by $\frac{1}{2} h_{I} x_{I}$, while the slice of pie has an area given by $\frac{\phi}{2} h_{0}^{2}$, where $\phi$ is some angle between the two radii $(0,0),\left(0, h_{0}\right)$ and $(0,0),\left(x_{I}, h_{I}\right)$, which needs to be determined. Consider now the talus slope which is the tangent to the circle at the point $\left(x_{I}, h_{I}\right)$, which is, by definition, perpendicular to the radii $(0,0),\left(x_{I}, h_{I}\right)$. Then by elementary geometry $\phi=\theta$ the angle of the talus slope to the horizontal, therefore,

$$
\begin{equation*}
V_{D}\left(t_{0}\right)=\frac{1}{2}\left(h_{I} x_{I}+\theta h_{0}^{2}\right) . \tag{2.25}
\end{equation*}
$$

Recalling that associated to each cell there is a constant normalized volume, $c_{i}$, and a sum of the normalized volumes, $C_{i}$, given by equations (2.9) and (2.11), respectively; these must also be determined and are done so as follows. From (2.9) and (2.11)

$$
\begin{equation*}
C_{i}=\sum_{j=1}^{i} \frac{V_{j}}{V_{D}}, \tag{2.26}
\end{equation*}
$$

where the sum of all the cell volumes upto $i$ needs to be determined and can be done so by the same method that $V_{D}(0)$ was in equation (2.25). However, it is not possible to use $\phi=\theta$ here since, the new region's boundary point $\left(x_{i}, h_{i}\right)$ is not the location of the talus tangent to the curve $h(x)$. Instead $\phi$ is determined through geometry to be

$$
\begin{equation*}
\phi=\tan ^{-1}\left[\frac{x_{i}}{h_{i}}\right], \tag{2.27}
\end{equation*}
$$

thus, from equations (2.25-2.27) the following expression is obtained for the sum of normalised cell volumes upto $i$,

$$
C_{i}=\sum_{i}^{j=1} c_{j}=\frac{1}{2 V_{D}}\left(h_{0}^{2} \tan ^{-1}\left[\frac{x_{i}}{h_{i}}\right]+h_{i} x_{i}\right) .
$$

If the $C_{i}$ are calculated sequentially for increasing $i$ then the individual cell normalised volumes, $c_{i}$ can be calculated using

$$
c_{i}=C_{i}-C_{i-1},
$$

which completes the discretisation of the volcanic dome into Lagrangian cells at $t=0$.

### 2.3.3 The Extrusion Function

Material is extruded from the conduit deep inside the volcanic dome. The conduit edge is at some distance $x_{c}$ from $x=0$, which is estimated from geological observations shortly after a major collapse of the volcanic dome and talus; this essentially wipes the crater floor clean exposing the volcanic conduit momentarily. What the exact form of $w_{s}(x)$ is inside the vent is relatively unknown, but the simplest form that it could take would be a constant step function,

$$
w_{s}(x)=\left\{\begin{array}{cc}
w_{s} & x \leq x_{c}  \tag{2.28}\\
0 & x>x_{c}
\end{array}\right.
$$

as clearly material is only emitted from inside the conduit. $w_{s}(x)$ is a vertical velocity distribution such that $\int_{0}^{x_{c}} w_{s}(x) d x$ is the total extruded volume rate $\dot{V}_{E}$. The approximation to a flat velocity distribution is seen to be reasonable from studies of bubble shapes in pyroclastic volcanic pumice [2]; pumice is solidified lava with internal bubbles. Usually bubbles are spherical, however when the lava is emitted close to the conduit walls there is a very high velocity gradient which forms long thin stretched bubbles. This is evidence for a viscosity-driven sigmoid velocity distribution near the conduit edge rather than a step; the step function is used for simplicity. Thus the integral can be found, giving the total extruded volume rate to be

$$
\dot{V}_{E}=w_{s} x_{c} .
$$

### 2.3.4 Rheology and Difference Methods

The rheology term $U$ at each cell boundary $x_{i}$ is $U_{i}$, given by equation (2.2), and is dependent on $\left(h_{i}\right)_{x}$ the $x$ derivative of the height at $x_{i}$. This derivative is found using an average of a left and right difference about $x_{i}$

$$
\begin{equation*}
\left(h_{i}\right)_{x}=\frac{\partial h_{i}}{\partial x} \approx \frac{1}{2}\left[\frac{h_{i+1}-h_{i}}{x_{i+1}-x_{i}}+\frac{h_{i}-h_{i-1}}{x_{i}-x_{i-1}}\right], \tag{2.29}
\end{equation*}
$$

except at $x=0$ and $x=x_{I}$ where $\left(h_{I}\right)_{x}=0$ and

$$
\left(h_{I}\right)_{x} \approx \frac{h_{I}-h_{I-1}}{x_{I}-x_{I-1}},
$$

respectively; since the dome is horizontal at $x=0$ and there is not a point at $x_{I+1}$.
The $x$ derivative of the rheology term at the interface, $\left(U_{I}\right)_{x}$ is required by equations (2.20$2.22)$ to find the rates of change of the cell boundaries, $\dot{x}_{i} .\left(U_{I}\right)_{x}$ is estimated by the left difference

$$
\begin{equation*}
\left(U_{I}\right)_{x} \approx \frac{U_{I}-U_{I-1}}{x_{I}-x_{I-1}} \tag{2.30}
\end{equation*}
$$

since again there is no value for $U$ at $x_{I+1}$.

### 2.4 Time Step Evolution of the System

### 2.4.1 Lagrangian Cell Boundaries

Once the system has been fully initialised then all of the terms in equations (2.20-2.22) are known, thus $\dot{x}_{i}$, the rates of change of the cell boundaries, can easily be calculated from them. To obtain the new cell boundaries from the rates of change the Euler method is used with a
time step $\delta t$,

$$
x_{i}^{\prime}=x_{i}+\dot{x}_{i} \delta t,
$$

where $x_{i}^{\prime}$ is the new position of the cell boundary.
The problem with the Euler method is that it is not stable nor very accurate. Ideally a better time step method should be used, the Backward differentiation scheme with a RungeKutta predicting the initial points, would be superior. This will produce an unconditionally stable, accurate implicit time step method. However, Newtons method will need to be used to predict the root of the implicit equation.

### 2.4.2 Finding $h_{i}$ Using Back-Recursion

The procedure to find the time-evolved dome heights for each Lagrangian cell is actually used after the talus/dome volume balance iteration presented below, but for this iteration to work the penultimate cell height $h_{I-1}$ needs to be found by the back recursion formula which is be presented here.

The Lagrangian normalized cell volume $c_{i}$ is defined to be a constant and is given by an integral in equation (2.10). The approximation of this integral using the trapezium rule is

$$
c_{i} \approx \frac{\left(h_{i-1}+h_{i}\right)\left(x_{i}-x_{i-1}\right)}{2 V_{D}(t)}
$$

rearranging for $h_{i-1}$ yields

$$
\begin{equation*}
h_{i-1}=\frac{2 c_{i} V_{D}(t)}{x_{i}-x_{i-1}}-h_{i} \tag{2.31}
\end{equation*}
$$

which is a backward recursive formula to obtain all of the $h_{i}$ given the height at the interface, $h_{I}$. The interface height is found using equation (2.33), for the iterated talus volume, as described below.

### 2.4.3 Talus/Dome Volume Balance Iteration

Equation (2.3) is the conservation law which tells us that the lava extruded in one time step is responsible for the change in volume of the dome and the talus. However, the relative amounts of material are unknown and will be functions of time; an iterative approach is required. A further unknown is the end location of the talus, which is needed to calculate the height of the dome/talus interface $h_{I}$ in equation (2.4). But given the new volume of the talus, then this height can also be found via the area of a triangle

$$
\begin{equation*}
V_{T}=\frac{1}{2} h_{I}\left(x_{T}-x_{I}\right) \tag{2.32}
\end{equation*}
$$

and using (2.4) and rearranging gives

$$
\begin{equation*}
h_{I}=\sqrt{2 V_{T} \tan \theta} \tag{2.33}
\end{equation*}
$$

The bi-section method of iteration is used to find the correct relative dome/talus volume fractions and the Neumann interface condition (2.19) is used as the constraint. This method relies on logical consequences of the Lagrangian volume normalized cells. First let $\left(h_{I}\right)_{x}$ be estimated by a left hand difference,

$$
\begin{equation*}
\left(h_{I}\right)_{x} \approx \frac{h_{I}-h_{I-1}}{x_{I}-x_{I-1}} . \tag{2.34}
\end{equation*}
$$

Now consider choosing as the volume balance a $100 \%$ increase in talus volume, i.e. $\delta V_{E}=\delta V_{T}$ and $\delta V_{D}=0$. This will result in the largest possible increase in $h_{I}$. The constraint demands that $\left(h_{I}\right)_{x}=-\tan \theta$, which will not be possible here since the volume of the dome has not changed, thus nor will the volume of the last element. If the volume of the cell is unchanged then the only way for $h_{I-1}$ to increase in height to match $h_{I}$ and satisfy the Neumann interface condition is for the cell to become much thinner than it was previously. It is also clear that $\dot{x}_{I} \geq 0$, otherwise the dome will be contracting horizontally, therefore the last cell will not have
thinned to the correct degree to allow the derivative condition to be satisfied; $\left(h_{I}\right)_{x}$ will be shallower than required.

Conversely, consider a $100 \%$ increase in the dome volume so that the talus volume remains unchanged. If the talus volume is unchanged then the interface height will also be unchanged. Even though the cell edges will have moved to increase the width of the cells, the volume of the cell will also increase to match the dome's volume change, and thus the $h_{I-1}$ will have to increase substantially. Since $h_{I}$ has not changed then $\left(h_{I}\right)_{x}$ will now be steeper than it was previously, which is incorrect. It is clear that the correct gradient will occur somewhere between the two extreme volume distributions.

The bi-section iteration method runs as follows:

1. Chose a 50:50 dome/talus volume balance so that $\delta V_{D}=\delta V_{T}=\frac{1}{2} \delta V_{E}=\frac{a}{b} \delta V_{E}$;
2. Obtain $h_{I}$ from equation (2.33), with $V_{T}^{\prime}=V_{T}+\delta V_{T}$;
3. Find $h_{I-1}$ from equation (2.31), with $V_{D}^{\prime}=V_{D}+\delta V_{D}$;
4. Estimate $\left(h_{i}\right)_{x}$ from equation (2.34);
5. Test whether this gradient estimate is inside a small error window of the required $-\tan \theta$;
6. If $\left|\left(h_{i}\right)_{x}\right|<\tan \theta$ then the talus fraction is too large, otherwise the dome fraction is too large;
7. Whichever volume fraction is too large, $\frac{a}{b}$ is reduced to $\frac{a_{1}^{\prime}}{b_{1}^{\prime}}=\frac{2 a-1}{2 b}$, while the other one is increased to $\frac{a_{2}^{\prime}}{b_{2}^{\prime}}=\frac{2 a+1}{2 b}$;
8. Repeat the iteration using the new talus and dome volumes, $\frac{a_{1}^{\prime}}{b_{1}^{\prime}} V_{E}$ and $\frac{a_{2}^{\prime}}{b_{2}^{\prime}} V_{E}$, respectively.

Once the relative dome and talus volumes have been found by the iteration the corresponding new location for the end of the talus slope is found from equation (2.6).

### 2.4.4 Time Step Results

Once the iterative method has found the dome and talus volumes, $h_{I}$ is calculated from equation (2.33) and the cell heights $h_{i}$ are then found back recursively by equation (2.31). The important parameters of the model are the cell boundaries and the cell heights, so they are stored. $\left(h_{i}\right)_{x}$ is calculated from the difference method given in equation (2.29), which is then used to calculate the lava rheology term $U_{i}$ using equation (2.2). The left handed difference in equation (2.30) is used to find $\left(U_{I}\right)_{x}$. Thus, all of the new values for the time step have been found and it is possible to move onto the next one.

## Chapter 3

## The Radial Volcano System

Now that the slab system has been derived and understood it is possible to move onto the more realistic axi-symmetric model, which correctly represents the cone geometry of a lava dome volcano. The derivation follows a similar rout but there are added complications due to the necessity to integrate the volumes over the annuli from which they are now constructed.

### 3.1 The Mathematical Model

### 3.1.1 Rheology Equations and Continuity

Switching to a radially symmetric system is achieved by a change from the Cartesian coordinate $(x)$ to the polar coordinate $r$. The rheology equation (2.1) changes back to the form found in [3],

$$
\begin{equation*}
\frac{\partial h}{\partial t}+\frac{1}{r} \frac{\partial}{\partial r}(r U)=w_{s}(r) \tag{3.1}
\end{equation*}
$$

where

$$
U=\frac{-n}{n+1}\left|\frac{\partial h}{\partial r}\right|^{\frac{1}{n}-1} Y^{1+\frac{1}{n}}\left[r-\frac{n Y}{2 n+1}\right] \frac{\partial h}{\partial r} \Theta(Y)
$$

and

$$
Y=r-\frac{B}{\left|\frac{\partial h}{\partial r}\right|}
$$

The mass conservation law, given in equation (2.3), now becomes,

$$
\dot{V}_{E}=\int_{0}^{2 \pi} \int_{0}^{r_{c}} w_{s}(r) r d r d \phi=\dot{V}_{D}+\dot{V}_{T}
$$

from the necessity to sum over the annuli from which the volume is constructed. Taking the extrusion velocity function $w_{s}(r)$ to be a step as given in equation (2.28), allows the integral to be found, thus

$$
\begin{equation*}
\pi w_{s} r_{c}^{2}=\dot{V}_{D}+\dot{V}_{T} \tag{3.2}
\end{equation*}
$$

### 3.1.2 Dome and Talus

The height of the interface is still given by equation (2.4), however the talus volume must now be considered via the integral

$$
V_{T}=\int_{0}^{2 \pi} \int_{r_{I}}^{r_{T}} h(r) r d r d \phi,
$$

because of the annulus nature of the volume. Here $h(r)$ is the function that describes the talus slope, which from the equation of a straight line is seen to be

$$
h(r)=\left(r_{T}-r\right) \tan \theta .
$$

Thus

$$
V_{T}=\int_{0}^{2 \pi} \int_{r_{I}}^{r_{T}}\left(r_{T}-r\right) \tan \theta r d r d \phi,
$$

$$
\begin{align*}
& =2 \pi \tan \theta \int_{r_{I}}^{r_{T}}\left(r_{T} r-r^{2}\right) d r \\
& =2 \pi \tan \theta\left[\frac{r_{T} r^{2}}{2}-\frac{r^{3}}{3}\right]_{r_{I}}^{r_{T}} \\
& =\frac{\pi}{3} \tan \theta\left[r_{T}^{3}-3 r_{T} r_{I}^{2}+2 r_{I}^{3}\right] . \tag{3.3}
\end{align*}
$$

The talus volume rate is found by implicit differentiation with respect to time, since $r_{T}$ and $r_{I}$ are both functions of time;

$$
\begin{equation*}
\left.\dot{V}_{T}=\pi \tan \theta\left[r_{T}^{2} \dot{r}_{T}-2 r_{T} r_{I} \dot{r}_{I}-\dot{r}_{T} r_{I}^{2}+2 r_{I}^{2} \dot{r}_{I}\right)\right] . \tag{3.4}
\end{equation*}
$$

Similarly the initial volume of the dome, which is bounded by the arc of a circle, needs to be found via

$$
V_{D}\left(t_{0}\right)=\int_{0}^{2 \pi} \int_{0}^{r_{I}} h(r) r d r d \phi
$$

Here $h(r)$ is given by equation (2.23) thus

$$
V_{D}\left(t_{0}\right)=\int_{0}^{2 \pi} \int_{0}^{r_{I}} \sqrt{\left(h_{0}^{2}-r^{2}\right)} r d r d \phi
$$

This integral can be found by substitution of $y=r^{2}$, and thus $d y=2 r d r$,

$$
\begin{align*}
V_{D} & =2 \pi \int_{0}^{r_{I}} \sqrt{\left(h_{0}^{2}-y\right)} \frac{d y}{2} \\
& =\frac{-2 \pi}{3}\left[\left(h_{0}^{2}-y\right)^{\frac{3}{2}}\right]_{0}^{r_{I}} \\
& =\frac{-2 \pi}{3}\left[\left(h_{0}^{2}-r^{2}\right)^{\frac{3}{2}}\right]_{0}^{r_{I}} \\
& =\frac{2 \pi}{3}\left[h_{0}^{3}-\left(h_{0}^{2}-r_{I}^{2}\right)^{\frac{3}{2}}\right], \tag{3.5}
\end{align*}
$$

where $h_{0}$ is the maximum height, which occurs at $r=0$ and is the radius of the circular boundary of the dome at time $t=0$.

### 3.1.3 Lagrangian Mesh

Consider now the constant normalised volume Lagrangian cells, such that the rate of change of $c_{i}$ with time is zero as before. As with the slab model it is possible to sum all of the cells upto $i$, therefore we can take

$$
\frac{d C_{i}}{d t}=0,
$$

where we recall that

$$
C_{i}=\sum_{j=1}^{i} c_{j}=\sum_{j=1}^{i} \frac{V_{i}}{V_{D}},
$$

where

$$
\begin{equation*}
V_{i}=\int_{0}^{2 \pi} \int_{r_{i-1}}^{r_{i}} h(r) r d r d \phi \tag{3.6}
\end{equation*}
$$

due to the need to consider the annulus nature of the volume, as was done for the entire dome volume. Thus, the timed rate of change of $C_{i}$ yields

$$
\frac{d}{d t} \int_{0}^{2 \pi} \int_{0}^{r_{i}} \frac{h r}{V_{D}} d r d \phi=0
$$

and the chain rule gives

$$
2 \pi \frac{\partial}{\partial t} \int_{0}^{r_{i}(t)} \frac{h r}{V_{D}} d r+2 \pi \frac{\partial}{\partial r}\left[\int_{0}^{r_{i}(t)} \frac{h r}{V_{D}} d r\right] \frac{\partial r_{i}}{\partial t}=0
$$

noticing that $r$ in the first term is independent of time and integrating the second term generates

$$
2 \pi \int_{0}^{r_{i}} r \frac{\partial}{\partial t}\left[\frac{h}{V_{D}}\right] d r+2 \pi \frac{h_{i} r_{i}}{V_{D}} \dot{r}_{i}=0
$$

where $\frac{\partial r_{i}}{\partial t}$ is rewritten as $\dot{r}_{i}$. Use of the quotient rule on the first term and then multiplying through by $V_{D}$ results in

$$
2 \pi \int_{0}^{r_{i}}\left[r h_{t}-\frac{r h \dot{V}_{D}}{V_{D}}\right] d r+2 \pi h_{i} r_{i} \dot{r}_{i}=0
$$

Equation (3.1) and the integral form of $C_{i}$ are substituted for the first and second terms, respectively, giving

$$
2 \pi \int_{0}^{r_{i}}\left[r w_{s}(r)-\frac{\partial}{\partial r}(r U)\right] d r+2 \pi h_{i} r_{i} \dot{r}_{i}=C_{i} \dot{V}_{D}
$$

and then performing the integration

$$
\pi w_{s} r_{i}^{2}-2 \pi U_{i} r_{i}+2 \pi h_{i} r_{i} \dot{r}_{i}=C_{i} \dot{V}_{D}
$$

which gives $i$ equations for the $i$ unknowns $\dot{r}_{i}$. Equation (3.2) is substituted for $\dot{V}_{D}$, the unknown rate of change of dome volume,

$$
\begin{equation*}
\pi w_{s} r_{i}^{2}-2 \pi U_{i} r_{i}+2 \pi h_{i} r_{i} \dot{r}_{i}=C_{i} \pi w_{s} r_{c}^{2}-C_{i} \dot{V}_{T} \tag{3.7}
\end{equation*}
$$

Since $\dot{V}_{T}$, the rate of change of talus volume, is given by equation (3.4) we realise here that each of the $i$ equations also contains the unknowns $\dot{r}_{I}$ and $\dot{r}_{T}$, which can be removed as follows.

### 3.1.4 Formation of the Last Equation

Consider $\dot{r}_{T}$ : The rate of change of the interface height due to the talus is given by equation(2.17) (with $x \rightarrow r$ ), which rearranges to give

$$
\dot{r}_{T}=\frac{1}{\tan \theta} \frac{\partial h_{I}}{\partial t}+\dot{r}_{I} .
$$

However, $\frac{\partial h_{I}}{\partial t}$ is not known, though differentiating equation (3.1) by the product rule allows it to be eliminated, together with the observation that $w_{s}\left(r_{I}\right)=0$, this yields

$$
\frac{\partial h_{I}}{\partial t}+\frac{U_{I}}{r_{I}}+\frac{\partial U_{I}}{\partial r}=0
$$

therefore

$$
\begin{equation*}
\dot{r}_{T}=\dot{r}_{I}-\frac{1}{\tan \theta}\left[\frac{U_{I}}{r_{I}}+\frac{\partial U_{I}}{\partial r}\right] . \tag{3.8}
\end{equation*}
$$

Now consider $\dot{r}_{I}$ : If we recall that for the $I^{\text {th }}$ equation in (3.7) $C_{I}=1$ and $w_{s} \in\left[0, r_{c}\right]$, which implies that the first term becomes $\pi w_{s} r_{c}^{2}$ when $r_{i}>r_{c}$, then at the dome/talus interface

$$
\begin{equation*}
\dot{V}_{T}=2 \pi r_{I}\left(h_{I} \dot{r}_{I}+U_{I}\right), \tag{3.9}
\end{equation*}
$$

which, along with equation (3.4), gives us two equations for $\dot{V}_{T}$. $\dot{r}_{T}$ can be eliminated from equation (3.4) by using equation (3.8) to give

$$
\begin{equation*}
\dot{V}_{T}=\pi\left[\left(r_{T}^{2}-r_{I}^{2}\right)\left(\dot{r}_{I} \tan \theta-\frac{U_{I}}{r_{I}}-\frac{\partial U_{I}}{\partial r}\right)+2 \dot{r}_{I}\left(r_{I}^{2}-r_{I} r_{T}\right) \tan \theta\right] . \tag{3.10}
\end{equation*}
$$

When both of these equations for $\dot{V}_{T}$ are combined and rearranged for the rate of change of the interface location with time, the following expression is obtained

$$
\begin{equation*}
\dot{r}_{I}=\frac{2 r_{I} U_{I}+\left(\frac{U_{I}}{r_{I}}+\frac{\partial U_{I}}{\partial r}\right)\left(r_{T}^{2}-r_{I}^{2}\right)}{\tan \theta\left(r_{T}-r_{I}\right)^{2}-2 r_{I} h_{I}} \tag{3.11}
\end{equation*}
$$

which is now the $I^{\text {th }}$ equation for the rates of change of the cell boundaries.

### 3.1.5 Equations as a Matrix System

The $i$ equations in $i$ unknowns given in equation (3.7) form the matrix system

$$
\mathbf{K} \underline{r}=\underline{f}
$$

where $\mathbf{K}$ is an $I \times I$ matrix

$$
\mathbf{K}=\left[\begin{array}{ccccc}
K_{1} & 0 & 0 & 0 & M_{1} \\
0 & K_{2} & 0 & 0 & M_{2} \\
0 & 0 & \ddots & \vdots & \vdots \\
0 & 0 & \cdots & K_{I-1} & M_{I-1} \\
0 & 0 & \cdots & 0 & M_{I}
\end{array}\right]
$$

and $\underline{r}$ and $\underline{f}$ are the vectors

$$
\underline{r}=\left[\begin{array}{c}
r_{1} \\
r_{2} \\
\vdots \\
r_{I}
\end{array}\right] \quad \text { and } \quad \underline{f}=\left[\begin{array}{c}
f_{1} \\
f_{2} \\
\vdots \\
f_{I}
\end{array}\right] .
$$

The system can be rewritten

$$
\mathbf{D}_{\underline{r^{*}}}{ }^{*}+\mathbf{M} \underline{r}=\underline{f}
$$

where $\mathbf{D}$ is a diagonal matrix and the * denoted a size of $(I-1)$ and

$$
\mathbf{M}=\left[\begin{array}{ccccc}
0 & 0 & 0 & 0 & M_{1} \\
0 & 0 & 0 & 0 & M_{2} \\
0 & 0 & \ddots & \vdots & \vdots \\
0 & 0 & \cdots & 0 & M_{I-1} \\
0 & 0 & \cdots & 0 & M_{I}
\end{array}\right]
$$

Thus

$$
\mathbf{D}_{\underline{r^{*}}}{ }^{*}+r_{I} \underline{m}^{*}=\underline{f}^{*},
$$

where $\underline{m}^{*}$ is now a column vector. The $I^{t h}$ equation is now simply

$$
r_{I} M_{I}=f_{I},
$$

thus the matrix system

$$
\mathbf{D}^{*} \underline{r}^{*}=\underline{f}^{*}-\frac{f_{I}}{M_{I}} \underline{m}^{*}
$$

can now be solved. From equation (3.7) and (3.10) we can identify

$$
\begin{aligned}
K_{i} & =2 h_{i} r_{i} \\
M_{i} & =C_{i} \tan \theta\left(r_{T}-r_{I}\right)^{2} \\
M_{I} & =\tan \theta\left(r_{T}-r_{I}\right)^{2}-2 h_{I} r_{I} \\
f_{i} & =C_{i} w_{c} r_{i}^{2}+2 U_{i} r_{i}-w_{i} r_{i}^{2}+C_{i}\left(r_{T}^{2}-r_{I}^{2}\right)\left(\frac{U_{I}}{r_{I}}+\frac{\partial U_{I}}{\partial r}\right), \\
f_{I} & =2 U_{I} r_{I}+\left(r_{T}^{2}-r_{I}^{2}\right)\left(\frac{U_{I}}{r_{I}}+\frac{\partial U_{I}}{\partial r}\right)
\end{aligned}
$$

noticing that the factor of $\pi$ has cancelled.

### 3.2 The Algorithm

Equations (3.7) and (3.11) provide a way to find the rates of change of the Lagrangian cell boundaries in the radial geometry; however, as before what is really required is the evolution of the dome height and growth of the talus slope with time. The algorithmic method to find these is similar to the one given for the slab model and is given briefly here;

Set up the system at $t=0$ :

1. Chose an initial height distribution for the dome and talus, $h(r, 0)$, from geological ob- servations.
2. Given the interface condition for $\left(h_{I}\right)_{r}$ and the initial function $h(r, 0)$, find the talus end point $r_{T}$, the interface location, $r_{I}$ and the total dome volume, $V_{D}$.
3. Discretise the dome into Lagrangian cells, finding: $r_{i} ; h_{i} ; V_{i} ; c_{i} ; C_{i} \forall i$.
4. Use a difference method to estimate the height gradient, $\left(h_{i}\right)_{r} \forall i$.
5. Calculate the Rheology term, $U_{i}$ and its derivative $\left(U_{I}\right)_{r} \forall i$ via a difference scheme.

Once the system is set up the time evolution can begin:

1. Find the interface boundary rate $\dot{r}_{I}$ and us it to calculate the talus volume rate, $\dot{V}_{T}$.
2. Find the remaining cell boundary rates, $\dot{r}_{i}$ for $i=1,2 \ldots(I-1)$.
3. Calculate the new cell edges for the time step, $x_{i}$ using an IVP method.
4. Given the new interface boundary position, iterate the relative dome and talus volume growth until the interface condition for $\left(h_{I}\right)_{x}$ is satisfied
5. Calculate the new talus end position from the new talus volume using Newtons method.
6. Calculate the interface height, $h_{I}$ from the talus end position.
7. Use back recursion to calculate all of the remaining dome heights, $h_{i}$, from $h_{I}$.
8. Find the new values of $\left(h_{i}\right)_{x}, U_{i}$, and $\left(U_{i}\right)_{x}$.
9. Move to the next time step.

### 3.3 Setting Up The Radial System

### 3.3.1 The Dome and Talus Geometry

The method of setting up the initial dome and talus geometry is identical to the one presented in Section 2.3.1 for the slab geometry (with $x$ replaced by $r$ ), since it is simply based on the cross sectional geometry through the volcano from $r=0$ to $r=r_{T}$.

### 3.3.2 Discretisation of the Dome into Lagrangian Cells

The discretisation of the dome into Lagrangian cells, with lower and upper edges at $r_{i-1}$ and $r_{i}$ and their corresponding heights, respectively, is achieved via the same procedure described in Section 2.3.2. However, the initial volume of the dome is now calculated by integration around the annuli as shown in equation (3.5). From this it is clear that

$$
\begin{equation*}
C_{i}=\frac{2 \pi}{3 V_{D}}\left[h_{0}^{3}-\left(h_{0}^{2}-r_{i}^{2}\right)^{\frac{3}{2}}\right], \tag{3.12}
\end{equation*}
$$

and thus if the $C_{i}$ are calculated sequentially for increasing $i$ then the individual cell normalised volumes, $c_{i}$ are given by

$$
c_{i}=C_{i}-C_{i-1},
$$

as before.

### 3.3.3 Rheology and difference methods

The method for calculating $\left(h_{i}\right)_{r}, U_{i}$ and $\left(U_{i}\right)_{r}$ are unchanged from those presented in Section 2.3.4 for the slab model.

### 3.4 Time Step Evolution of the System

### 3.4.1 Lagrangian Cell Boundaries

When the radial volcanic system has been initialised then the rate of change of the talus/dome interface with time can be found from equation (3.11), which is used to calculate the rate of change of the talus volume from equation (3.9). This allows all of the remaining cell boundary rates of change to be found from equation (3.7). The Euler method is used to find the new cell boundaries from the rates in the same way as it was for the slab model.

### 3.4.2 Talus/Dome Volume Balance Iteration

The bi-section iteration for the dome and talus volumes using the interface condition $\left(h_{I}\right)_{r}=$ $-\tan \theta$ as a constraint runs exactly as laid out in Section 2.4.3. However, here the equation for the rate of change of the volume of the talus is now given by (3.4) which is a cubic polynomial in $r_{T}$, the end of the talus slope. Calculation of $r_{T}$ for each iteration of the bi-section method is not possible directly, as it was for the slab model; Newton's method must be used. The cubic polynomial in $r_{T}$ is

$$
f\left(r_{T}\right)=r_{T}^{3}-3 r_{I}^{2} r_{T}+2 r_{I}^{3}-\frac{3 V_{T}}{\pi \tan \theta}
$$

Newton's method to find the primary root of $f\left(r_{T}\right)$ is

$$
\begin{equation*}
r_{n+1}=r_{n}-\frac{f\left(r_{n}\right)}{f^{\prime}\left(r_{n}\right)} \tag{3.13}
\end{equation*}
$$

where $f^{\prime}\left(r_{T}\right)$ is the differential of $f\left(r_{T}\right)$,

$$
f^{\prime}\left(r_{T}\right)=3 r_{T}^{2}-3 r_{I}^{2}
$$

and $r_{n}$ is the $n^{\text {th }}$ iteration to find the root. The previous known value of $r_{T}$ is used as a starting point as it will be near to the required root for small time steps.

### 3.4.3 Finding $h_{i}$ Using Back-Recursion

In the slab model the back recursion rule (2.31) came from the trapezium estimate of the integral form of $c_{i}$, the normalized Lagrangian cell volume. However, here the equation for $c_{i}$ has changed to

$$
c_{i}=\int_{0}^{2 \pi} \int_{r_{i-1}}^{r_{i}} \frac{h(r)}{V_{D}} r d r d \phi
$$

so the trapezium rule estimate is

$$
c_{i} \approx 2 \pi \frac{\frac{1}{2}\left(r_{i} h_{i}+r_{i-1} h_{i-1}\right)\left(r_{i}-r_{i-1}\right)}{V_{D}}
$$

thus the new back recursion rule is

$$
\begin{equation*}
h_{i-1} \approx \frac{c_{i} V_{D}}{\pi\left(r_{i}-r_{i-1}\right) r_{i-1}}-\frac{r_{i} h_{i}}{r_{i-1}} . \tag{3.14}
\end{equation*}
$$

However, this will fail when the height at $r=0$ is calculated for $i=1$. At this point the integral no longer represents an annular volume but a cylinder and so can be estimated via

$$
c_{1} \approx \frac{\pi r_{1}^{2}}{V_{D}}\left(h_{1}+h_{0}\right) \frac{1}{2},
$$

which is the area of the circular base of the cylinder multiplied by its average height, thus

$$
\begin{equation*}
h_{0} \approx \frac{2 c_{1} V_{D}}{\pi r_{1}^{2}}-h_{1}, \tag{3.15}
\end{equation*}
$$

is used for the height at $r=0$.

### 3.4.4 Time Step Results

Once the iterative method has found the dome and talus volumes, all of the $h_{i}$ are calculated from the back recursion equations. The important parameters of the model are the cell boundaries and the cell heights, so they are stored. $\left(h_{i}\right)_{r}, U_{i}$ and $\left(U_{i}\right)_{r}$ are calculated from difference methods and thus, all of the new values for the time step have been found and it is possible to move onto the next one.

## Chapter 4

## Running the Models

Once the models have been translated into object orientated computer code they can be run to generate results for the evolution of the slab and radial volcanic dome and talus systems. It is not a case of simply inserting the parameters observed by geologists, presented below, into the models to obtain meaningful results. Non-dimensionalisation of the system must be used and will be discussed below, before moving on to present the specifics of running the models. Results and subsequent discussions are then presented in the next Chapter.

### 4.1 Geological Observations of The Volcanic system

Geological observations [10] of a typical lava dome volcano on the island of Montserrat were made between $15^{\text {th }}$ November 2005 and $20^{\text {th }}$ May 2006, which correspond to days 3642 - 3839 measured from the beginning of lava extrusions ten years previously. The observations are:

- The gradient of Talus remains constant at approximately $35^{\circ}$. The slope is $37^{\circ}$ on the uppermost parts and $32^{\circ}$ on the lowermost.
- After a major dome collapse event the volcanic conduit can be seen on the crater floor, it is estimated to be 30 meters in diameter.
- The volume of the entire volcano was estimated approximately once a month and from
that the volume of material extruded was calculated. The extruded volume rate is seen to be dynamic over the six months of observations; an average estimate is $\dot{V}_{E}=6 \mathrm{~m}^{3} / \mathrm{s}$.
- Measured from the crater floor, $h_{0}$, the dome's central maximum height grew from 55 meters to 326 meters between the above dates.
- At the end of the measurement period the talus slope was 930 meters from the centre of the conduit, $r_{T}$.


### 4.2 Non-dimensionalisation

Non-dimensionalisation is the process of removing units from a system of mathematical equations by substitution of variables. The essence of this process is to obtain a system where all variables are less than unity and are all approximately the same size, which releases the dynamic dependence of terms with one another as the model evolves rather than the possible situation where one term dominates the evolution and thus the results. The recipe used here is described in detail in [3] but is summarised here for clarity.

The characteristic horizontal and vertical lengths, $H$ and $L$, are chosen to represent the volcanic system. From these a characteristic horizontal velocity, $V$ is chosen to be

$$
V=\frac{\rho g H^{3}}{\eta L}
$$

where $\rho$ is the lava density, $g$ is the acceleration due to gravity and $\eta$ is the lava's viscosity. The new system variables (represented by the tildes) are as follows:

$$
\begin{equation*}
\tilde{r}=\frac{r}{L}, \quad \tilde{h}=\frac{h}{H}, \quad \tilde{w}=\frac{w L}{V H}, \tag{4.1}
\end{equation*}
$$

where $w$ is a vertical velocity, i.e. the extrusion velocity of the lava, $w_{s}$.

The paper then derives the Bingham number of the lava fluid to be

$$
B=\frac{\tau_{p} H}{\eta V}=\frac{\tau_{p} L}{\rho g H^{2}},
$$

where $\tau_{p}$ is the yield stress of the fluid. Values of the variables are given to be

$$
\tau_{p}=10^{5} \mathrm{~Pa}, \quad \rho=2600 \mathrm{~kg} \mathrm{~m}^{-3}, \quad \eta=10^{9} \mathrm{Pas},
$$

with $g=10 \mathrm{~ms}^{-1}$ as usual.
To perform the non-dimensionalisation in this case, $L$ and $H$ need to be chosen. Starting with the information that at the beginning of the observation period the maximum height of the dome was 55 meters, and using the dome/talus set up procedure described in Section 2.3.1 the end of the talus is found to be 95 meters. The characteristic dimensions are taken to be ten times larger than these parameters; $L=950$ and $H=550$ to force the requirement that $\tilde{r}$ and $\tilde{h}$ be smaller than unity, while allowing large growth before reaching the characteristic values. The rest of the values are as follows:

$$
\tilde{r}=0.1, \quad \tilde{h}=0.1, \quad V=4.55 \mathrm{~m} / \mathrm{s}, \quad B=0.01 .
$$

$\tilde{w}_{s}$, is found from the volume extrusion rate given by the geological observations. The velocity will not be the same for the slab and radial models due to the different geometry. For the slab system $\dot{V}_{E}=2 x_{c} w_{s}$ thus, $w_{s}=0.2 \mathrm{~m} / \mathrm{s}$ and $\tilde{w}_{s}=0.076$. While for the radial system $\dot{V}_{E}=\pi w_{s} r_{c}^{2}$, thus $w_{s}=0.0085 \mathrm{~m} / \mathrm{s}$ and $\tilde{w}_{s}=0.0032$.

There also exists a characteristic time, $T=\frac{L}{V}$ which gives a non-dimensional unit of time as

$$
\begin{equation*}
\tilde{t}=\frac{t}{T}=0.005 \tag{4.2}
\end{equation*}
$$

### 4.3 The Slab Model - Choosing $\delta t$ and $I$

Initially it is very difficult to choose a good time step size, $\delta t$, and number of Lagrangian cells, $I$, that will allow an accurate stable evolution of the volcanic system, due to the complex nature of the model. The initial time step size was chosen to be the non-dimensional time found above, since this is the natural unit of time for the system; the number of cells chosen was 30 . The code was run repeatedly with various time steps and cell number to observe the models behavior. The model was deemed to run successfully if it reached one million time steps without failing and did not have appreciable oscillations in the final solution of the height.

| Model | $I$ | $\delta t$ | $N_{\text {steps }}$ | Comment/failure |
| :--- | :---: | :--- | ---: | :--- |
| A | 30 | 0.005 | 40903 | Convergence - oscillations |
| B | 30 | 0.01 | 0 | Convergence failure |
| C | 30 | 0.0025 | 66465 | Convergence - oscillations |
| D | 30 | 0.001 | 125163 | Convergence -oscillations/-ve(52-694) |
| E | 30 | 0.0005 | 201228 | Convergence -oscillations/-ve(131-323) |
| F | 30 | 0.00025 | 322592 | Convergence -oscillations/-ve(37-1870) |
| G | 30 | 0.0001 | 600338 | Convergence - oscillations/-ve(32-3515) |
| H | 30 | 0.00005 | 958726 | Convergence -oscillations/-ve(30-5040) |
| J | 30 | 0.00001 | 1000000 | Success, $1 \%$ oscillations, -ve(35-6142) |
| K | 40 | 0.001 | 127041 | Convergence -oscillations/-ve(0-358) |
| L | 50 | 0.001 | 1707 | Convergence $-\dot{x}_{i}$-ve(100-379)(1606-1707) |
| M | 50 | 0.0005 | 4125 | Convergence $-\dot{x}_{i}$-ve(0-720)(3853-4125) |
| N | 50 | 0.00025 | 330397 | Convergence -oscillations/-ve(0-1887) |
| P | 50 | 0.0001 | 615290 | Convergence - oscillations/-ve(0-3513) |
| R | 75 | 0.0001 | 4791 | Convergence $-\dot{x}_{i}$-ve(0-4791) |
| S | 75 | 0.00005 | 8261 | Convergence $-\dot{x}_{i}$-ve(0-5004)(8251-8261) |
| T | 75 | 0.00001 | 1000000 | Success, 0.1\% oscillations, -ve(0-9816) |

Figure 4.1: Various runs of the slab model to find one that is successful and stable. Models that fail have the reason stated. Numbers in brackets show the time step range when negative cell boundary velocities existed.

While running the code it was observed that all models that ultimately failed did so due to lack of convergence of the dome/talus volume balance at the interface. Either the dome or the talus iterated towards zero growth and still the gradient at the interface did not satisfy the condition of $-\tan \theta$. If the code was allowed to run without this criteria satisfied then it never
recovered from it and a discontinuity in the gradient at the interface was seen to grow. For this reason the first failure of the bi-section algorithm was taken as the ultimate point of failure of the model. However, studies suggest that there are two underlining reasons for the convergence failure: either growth of oscillations in the height; or negative cell boundary velocities; see Section 5.1.

Figure 4.1 shows the input parameters of several models which were run and their outcome. From the starting value of $\delta t$ in model A , the time step was then increased in size to 0.01 and the model failed on the first iteration, this would appear to be a good estimate of the maximum time step allowed for the system to remain stable for several iterations. From here the time step is reduced until a successful outcome is achieved in model J. Subsequent models had their number of cells increased, the time step was seen to require further reduction to again obtain a long lasting stable solution.

### 4.4 The Radial Model - Choosing $\delta t$ and $I$

Theoretically, the radial model is a more realistic representation of reality than the slab model, as already discussed, because it reproduces the axi-symmetric geometry of a real volcano. However, the results presented here should be considered as preliminary ones because the model is observed to exhibit unusual behavior; several possible improvements to the model will be suggested.

| Model | $I$ | $\delta t$ | $N_{\text {steps }}$ | Comment/failure |
| :--- | :--- | :--- | ---: | :--- |
| A1 | 30 | 0.005 | 0 | Total convergence failure |
| B1 | 30 | 0.0025 | 24 | Convergence -ve $\dot{x}_{i}$ |
| C1 | 30 | 0.001 | 60 | Convergence -ve $\dot{x}_{i}$ |
| D1 | 30 | 0.0005 | 86 | Convergence -ve $\dot{x}_{i}$ |
| E1 | 30 | 0.00025 | 104 | Convergence -ve $\dot{x}_{i}$ |
| F1 | 30 | 0.0001 | 116 | Convergence -ve $\dot{x}_{i}$ |
| G1 | 30 | 0.00005 | 121 | Convergence -ve $\dot{x}_{i}$ |
| H1 | 30 | 0.000025 | 123 | Convergence -ve $\dot{x}_{i}$ |
| J1 | 30 | 0.00001 | 125 | Convergence -ve $\dot{x}_{i}$ |
| K1 | 30 | 0.000005 | 125 | Convergence -ve $\dot{x}_{i}$ |
| A2 | 40 | 0.005 | 0 | Total convergence failure |
| B2 | 40 | 0.0025 | 16 | Convergence -ve $\dot{x}_{i}$ |
| C2 | 40 | 0.001 | 56 | Convergence -ve $\dot{x}_{i}$ |
| D2 | 40 | 0.0005 | 76 | Convergence -ve $\dot{x}_{i}$ |
| E2 | 40 | 0.00025 | 86 | Convergence -ve $\dot{x}_{i}$ |
| F2 | 40 | 0.0001 | 90 | Convergence -ve $\dot{x}_{i}$ |
| G2 | 40 | 0.00005 | 91 | Convergence -ve $\dot{x}_{i}$ |
| H2 | 40 | 0.000025 | 92 | Convergence -ve $\dot{x}_{i}$ |
| A3 | 50 | 0.005 | 0 | Total convergence failure |
| B3 | 50 | 0.0025 | 16 | Convergence -ve $\dot{x}_{i}$ |
| C3 | 50 | 0.001 | 150 | Convergence -ve $\dot{x}_{i}$ |
| D3 | 50 | 0.0005 | 94 | Convergence -ve $\dot{x}_{i}$ |
| E3 | 50 | 0.00025 | 79 | Convergence -ve $\dot{x}_{i}$ |
| F3 | 50 | 0.0001 | 76 | Convergence -ve $\dot{x}_{i}$ |
| G3 | 50 | 0.00005 | 75 | Convergence -ve $\dot{x}_{i}$ |
| A4 | 20 | 0.005 | 0 | Total convergence failure |
| B4 | 20 | 0.0025 | 13 | Convergence -ve $\dot{x}_{i}$ |
| C4 | 20 | 0.001 | 81 | Convergence -ve $\dot{x}_{i}$ |
| D4 | 20 | 0.0005 | 123 | Convergence -ve $\dot{x}_{i}$ |
| E4 | 20 | 0.00025 | 153 | Convergence -ve $\dot{x}_{i}$ |
| F4 | 20 | 0.0001 | 175 | Convergence -ve $\dot{x}_{i}$ |
| G4 | 20 | 0.00005 | 184 | Convergence -ve $\dot{x}_{i}$ |
| H4 | 20 | 0.000025 | 189 | Convergence -ve $\dot{x}_{i}$ |
| J4 | 20 | 0.00001 | 191 | Convergence -ve $\dot{x}_{i}$ |
|  |  |  |  |  |


| Model | $I$ | $\delta t$ | $N_{\text {steps }}$ | Comment/failure |
| :--- | :---: | :--- | ---: | :--- |
| A5 | 15 | 0.005 | 0 | Total convergence failure |
| B5 | 15 | 0.0025 | 9 | Convergence -ve $\dot{x}_{i}$ |
| C5 | 15 | 0.001 | 99 | Convergence -ve $\dot{x}_{i}$ |
| D5 | 15 | 0.0005 | 207 | Convergence -ve $\dot{x}_{i}$ |
| E5 | 15 | 0.00025 | 240 | Convergence -ve $\dot{x}_{i}$ |
| F5 | 15 | 0.0001 | 252 | Convergence -ve $\dot{x}_{i}$ |
| G5 | 15 | 0.00005 | 259 | Convergence -ve $\dot{x}_{i}$ |
| H5 | 15 | 0.000025 | 263 | Convergence -ve $\dot{x}_{i}$ |
| J5 | 15 | 0.00001 | 264 | Convergence -ve $\dot{x}_{i}$ |

Figure 4.2: Running the radial model failed to find one that was successful and stable.

The first values of $\delta t$ and $I$ were taken to be the same as they were for the slab model. Then, $\delta t$ was decreased and $I$ increased in the hope of finding a stable model evolution. None were found; all of the attempts are displayed in Figure 4.2. All of the models exhibited the same behavior: the cells started with positive $\dot{x}_{i}$ for several iterations; with each consecutive iteration $\dot{x}_{i}$ decreases until eventually the last one, $\dot{x}_{I}$, becomes negative; the rest then swiftly follow within a few iterations; eventually the cell boundaries cross over producing negative heights and the model terminates shortly afterwards. No models recovered or ran for long once negative velocities had emerged. Thus, the final number of iterations displayed in Figure 4.2 was the point at which the model developed negative $\dot{x}_{i}$.

Eventually $I$ was decreased and the model was seen to run for more iterations, in fact the model appears more stable for fewer cells. However, the models still displayed the same chain of events leading to failure that is described above. One further observation is that the models do not seem to develop negative velocities at a fixed time after $t=0$, but it appears to depend on $\delta t$ and once this becomes small enough, negative $\dot{x}_{i}$ appear after the same number of iterations, and thus at an earlier time; this is unlikely to be the model becoming more accurate for smaller time steps because it is the first step towards the system's failure.

## Chapter 5

## Results and Discussion

### 5.1 The Slab Model

Of the seventeen versions of the slab model presented in Figure 4.1 three are carefully selected and presented here to demonstrate the main three types of behavior displayed:

Model A is chosen first because it is one of the few that runs without negative values of $\dot{x}_{i}$ appearing, it also forms height oscillations which are visible after 40000 iterations as shown in Figure 5.1.

Model M is selected because it is one of the few runs which fails while it has negative values of $\dot{x}_{i}$. It is also unusual that it starts with negative call boundary velocities before moving into a fully positive phase before returning to negative ones again. It quickly develops large oscillations, demonstrated in Figure 5.2, and thus ultimately fails to converge.

Model T is chosen because it was the most stable solution found after running many versions of the code and carefully selecting the input parameters between each run. It was one of only two models which ran to one million iterations but it had smaller oscillations than model J. If the model is run for half a million time steps then there are no oscillations; as displayed in Figure 5.4. However, the volcano has grown so much relative to the original that it is difficult


Figure 5.1: Model $\mathbf{A}-\delta t=0.005 I=30$ : the initial geometry at $t=0 ; 10000$ iterations; and the termination of the model at 40903 iterations.
to compare the two, for this reason two plots are made using this model, both of which contain the height distribution after 50000 steps, for comparison.

Generally, as the models in Figure 4.1 were run, the time step and cell widths were decreased, this means that the later models will be more stable and accurate; which is why they ran successfully for a greater number of iterations.

Model A (Figure 5.1) did not undergo a period of negative cell velocities and for this reason the evolution of the model rapidly moves horizontally. Between zero and 10000 iterations there is substantial height increases too. However, from 10000 to the termination of the model at a little over 40000 steps it is noticed that beside the growth of oscillations, the height of the interface has grown only very slightly. It is observed that the oscillations in the height start at small $x$ and grow in height, as they grow they also move along the solution to larger $x$, until eventually they reach the interface and grow further. Ultimately the model fails because the bisection iteration cannot find a volume fraction for the dome and talus which allows the gradient condition to be satisfied. This model is clearly unstable and will generate a less accurate height


Figure 5.2: Model M- $\delta t=0.0005 I=50$ : the initial geometry at $t=0$ and the termination of the model at 4125 iterations.
evolution than ones with smaller $\delta t$ and larger $I$; it is thus discarded when drawing conclusions relating to reality.

Model M (Figure 5.2) undergoes two periods of negative growth with positive growth for several thousand iterations in between. The first period contains negative $\dot{x}_{i}$ for the cells nearest to $x=0$ and starts with only a few cells, grows upto eight negative cells and then decays back to positive growth, this period appears smooth and well structured. The second period however, displays different characteristics, with alternate cell edges being positive and negative throughout the cell range on one time step and then all positive on the next time step; this fluctuation varies more wildly as the model decays further into instability.

When the model terminates after 4125 steps the solution is seen to have essentially just grown vertically, $x_{I}$ is only slightly larger than it was at $t=0$. Large oscillations have appeared causing the models convergence to fail in much the same way as it did for Model A, however, here the cells have developed an alternate thick, thin structure due to the negative velocities in the second period, which either causes the height oscillations or adds to those already developing.


Figure 5.3: Model T- $\delta t=0.00001 I=75$ :the initial geometry at $t=0 ; 10000$ iterations; and 50000 iterations.


Figure 5.4: Model $\mathbf{T}-\delta t=0.00001 I=75$ :the initial geometry at $t=0 ; 50000$ iterations; and half a million iterations.

This model is also discarded as it is unstable.
Model T (Figures 5.3 and 5.4) is stable for half a million iterations and only small oscillations, in the region of $0.1 \%$, developed after a total of one million steps. For this reason it is felt that this is the most accurate model. It is noticed that the first 9816 steps have some negative cell velocities, investigation shows that it is several cells at small $x$ and the number of them swells and decays rhythmically upto a maximum of about twelve cells before eventually returning to an entirely positive state. The plot after the first 10000 steps shows that the talus/dome interface has actually moved to the left but grown in height substantially, it is only after this period that all of the cells acquire positive velocities and the interface moves to the right.

At first this would seem counter intuitive, as surly the volcano must simply grow if material is extruded into it. Well, if we examine equations (2.20-2.22), which are responsible for producing the cell edge velocities, we see that $C_{i}$ is constant and that the amount of material extruded into a cell will not change by much if the cell width changes only slowly; which it must do as the negative values of $\dot{x}_{i}$ are only small. Thus, the main dynamic variables are $U$ and $\left(U_{I}\right)_{x}$ which are functions of $h$ and $h_{x}$; the $h$ in equations (2.20-2.22) will simply set the size of $\dot{x}_{i}$. In fact upon examination of equation (2.2) and the model output: $U_{i} \geq 0 \forall i$ since $\left(h_{i}\right)_{x}<0 \forall i$; and $\left(U_{I}\right)_{x} \geq 0$; the talus length $\left(x_{T}-x_{I}\right)$ also remains positive and grows. Thus, $U_{i}$ contributes to $\dot{x}_{i}<0$ and $\left(U_{I}\right)_{x}\left(x_{T}-x_{I}\right)$ to $\dot{x}_{i}>0$. As time passes the talus grows regardless of the direction of travel of the cells and thus $\left(U_{I}\right)_{x}\left(x_{T}-x_{I}\right)$ grows, mean while $U_{i}$ slowly decays due to its dependence on an increasing $h$ and a decreasing $h_{x},(h(x)$ flattens as it increases) until eventually $\left(U_{I}\right)_{x}\left(x_{T}-x_{I}\right)$ dominates and the $\dot{x}_{i}$ return to positive values. Physically this can be thought of as the viscous fluid being lifted up by the extruded lava beneath, and it is only when it has been pushed up high enough that it is able to begin to flow under gravity outwards away from the vent, as demonstrated in the paper [3] where the equations for $U$ were derived.

Thus, it is concluded that the negative cell boundary velocities are an acceptable feature of the model and that the model demonstrates that the volcano initially undergoes vertical growth with horizontal growth only due to the talus length being fixed by the dome's height.

Then the dome slows its vertical growth and enters a period dominated by horizontal growth which pushes the talus outward, the talus volume growth slows because $\left(h_{I}\right)_{t}$ is smaller.

It would be interesting to compare this model with the rate of pyroclastic flows, which form the talus, to see if they decrease as the volcano grows, echoing the slowing of the talus volume increase. However, it may be that the frequency of pyroclastics with certain start locations changes from the top of the dome to lower down the slopes as a function of volcano size, this would occur as the talus is pushed out by the expanding dome and restructuring itself internally rather than having new material distributed onto its surface.

However, it must be realised that the slab model is not entirely physical, as already discussed.

### 5.2 The Radial Model



Figure 5.5: Model $\mathbf{J} 5-\delta t=0.00001 I=15$ : the initial geometry at $t=0$ and after 264 iterations when the model failed.

Figure 5.5 shows the resultant height distribution after the 264 time steps of radial model J5. Even though this model has only had positive cell boundary velocities the cell edges are
seen to have changed little, with the majority of the dome's growth going into the height of the cells. The first sign of oscillations has appeared at small $x$ but they do not get the opportunity to manifest the entire distribution before some $\dot{x}_{i}$ become negative, which for the radial model is terminal. However, we recall that for the most accurate and stable slab model run (T) there was a period when several cells had $\dot{x}_{i}<0$ and this was deemed to be satisfactory behavior. It would thus appear plausible that the radial model should follow a similar path of initial vertical growth followed later by horizontally dominated growth. The radial model would thus appear to be initially producing good results before premature termination.

The observation that the model fails earlier when more cells are included can be explained by the fact that the cell boundary velocities are not dependent on the width of the cell but its upper edges location relative to the origin and the conduit, and via incorporation into $U_{i}$, the height and its $x$ derivative. Thus, when there are more cells it takes less time for the boundaries to cross one another, if the time step is not reduced appropriately. However, given the observation that the first appearance of negative velocities stablises to a fixed number of iterations as $\delta t$ decreases then it is clear that the model will fail sooner when $I$ increases if the time step size is at this limit; as displayed in Figure 4.2.

We conclude that two investigations need to be launched: the first should further examine the causes and behavior of the appearance and growth of negative $\dot{x}_{i}$ from the interface via comparisons with the slab model; the second should look at the counter intuitive failure of the model to run for more time steps for smaller $\delta t$ and larger $I$.

There are some initial criticisms of the way that the radial model is structured which should be improved, however, whether these are the responsible for the failings highlighted above is unclear.

The first is that when the slab model was built the Lagrangian cells were split into equal widths and thus had normalized volumes, $c_{i}$, of roughly the same magnitude. In the radial model the $x$ separation of the cell edges has not changed, however, now the volumes are annular rings and thus the volumes are not of similar magnitude. The cell widths should be changed to
obtain volumes of approximately the same size, i.e. $\Delta r \propto \frac{1}{r}$. Exactly what effect this feature will have is unclear, but it could well be equivalent to having a variable stability across the dome as the cells change in magnitude; which clearly is not ideal.

The second is that there is a subtle approximation occurring when the bi-section method finds the dome and talus volume rates. The algebra will produce a different value based on terms from the previous time step, which is then used to calculate $\dot{x}_{i}$. This will be correct to first order but it would be better to implement some form of iterative approach to update values so that the algebraic and iterative volume rates are the same; a suitable method needs to be found. Of cause it could also be that the best way to include the interface gradient condition of $\left(h_{I}\right)_{x}=-\tan \theta$ is not through an iterative approach, as it may prove possible to include it algebraically, this should also be investigated.

### 5.3 Re-Dimensionalisation

Once the models have been run it is straight forward to return the system to real units using equations (4.1) and (4.2). Slab model T displayed after 50000 time steps in Figure 5.3 can be calculated to have grown from 55 to 330 meters in height and from 95 to 880 meters in length in a time of 100 seconds; which is substantially faster than the reality displayed in Section 4.1. However, the height is very close but the talus a little short.

### 5.4 Comparisons With Previous Work

As far as is known this is the first study of lava dome volcano growth to incorporate the talus slope. This means that the results presented here are not directly compatible with the results of previous work. Also, it is ideally the radial model which should be compared with other work, but due to the limitations generated when the model runs, comparisons are made with the slab model.

The endogenous lava dome growth modelled using a two-dimensional finite element mesh
solution to Navier-Stokes developed in [1] produced results for the height profile that initially rise retaining the circular symmetry of the initial conditions and later bulge out at the base changing the aspect ratio to a low wide dome. This tends to support the conclusions of the slab model that there is an initial vertical dominated growth and later a horizontal dominated growth. An almost identical height distribution is also obtained in [3] where horizontal expansion dominates the later periods of growth, further enforcing validity of the slab model's output.

After the radial model has been investigated further, it would be interesting to develop a version that does not include a talus to facilitate further examination of the effect of the slope on the model and comparisons to previous work.

## Chapter 6

## Conclusions and Future Opportunities

### 6.1 Summary of Conclusions

Two height averaged expanding Lagrangian mesh models were developed of a lava dome volcano and it's attached talus slope; the first used a simple slab geometry while the second was axisymmetric. The models were developed in C++ using an object orientated class frame-work. The following observations were drawn:

- An accurate and stable solution of the slab model was found with 75 cells and a time step of $\delta t=0.00001$ which ran for one million iterations.
- No stable solution could be found for the radial model.
- Models which failed did so due to lack of convergence of the bi-section method of obtaining dome/talus volume balance at the interface.
- It was discovered that there were two reasons for this: oscillations in the height distribution; and negative cell boundary velocities.
- Unstable slab models eventually suffered from oscillations in the height distribution, while all radial models eventually suffered from negative cell velocities.
- Oscillations of the height solution in the slab model are believed to arise from the Euler time step method and the trapezium rule estimate of the back recursion height calculation; these need to be improved.
- Features leading to the failure of the radial model need further investigation, though the volume of the Lagrangian cells is suspected as being contributory along with the implementation of the Neumann condition at the interface.
- Negative cell boundary velocities were seen to be an acceptable part of the slab model evolution.

The following conclusions were drawn:

- The stable solution of the slab model implies an initial vertical growth of the dome with thinning of the cells followed by a horizontally dominated growth period, where the talus volume increases slowly.
- The longest running radial model appears to initially follow the same period of vertical growth.
- Observations of the frequency and location of pyroclastic flows on the talus could be used to check the validity of the model's evolution.
- Comparisons of the slab model to real observations show roughly correct sizes, however the rate of growth appears spurious and requires further investigation.
- Comparisons of the slab model to previous models show a similar evolutionary path of vertical followed by horizontal growth.


### 6.2 Future Opportunities

### 6.2.1 Improvements to the Radial Model

Immediate improvements to the radial model should be:

- Better selection of the Lagrangian cell widths to obtain similar normalized volumes for all cells.
- Replacement of the Euler time step, with a backward differentiation method using a Runge-Kutta to find the first few steps will produce an unconditionally stable time stepping method.
- An improvement of the back recursion via the trapezium rule needs to be found.
- Investigate the appearance and spread of negative cell boundary velocities.
- Improve the implementation of the interface boundary gradient condition.
- Production of a version of the model without the talus.


### 6.2.2 Improvements to the Talus Representation

In the models presented here, the talus is simply represented by a slope who's size is governed by constrains based on geological observations. the dynamics of what is occurring inside the granular structure of the slope is not included; ideally this should be represented.

There are many studies of talus slope structures [11]-[15], ranging from observational statistical sorting of debris to experiments on sand piles to rigorous Navier-Stokes fluid dynamical models. It would be premature to consider the statistical sorting of rock sizes throughout the talus due to the dynamics of their deposition by descent. The Navier-Stokes approach is a recent competitive model to the well established Savage-Hutter model, [16] and [17], which has invoked great interest in the literature as shown in a recent review [18]. Even though it was originally developed for snow avalanches the Savage-Hutter model would appear to be the most
promising way forward. Briefly summarised, this model consists of the hyperbolic partial differential equations of a depth averaged down-slope velocity $u$ and local avalanche layer thickness $h$ :

$$
\begin{gather*}
\frac{\partial h}{\partial t}+\frac{\partial}{\partial t}(h u)=0  \tag{6.1}\\
\frac{\partial}{\partial t}(h u)+\frac{\partial}{\partial t}\left(h u^{2}+\frac{\beta_{x}}{2} h^{2}\right)=h s_{x} \tag{6.2}
\end{gather*}
$$

where $s_{x}$ is a dynamic driving force and $\beta_{x}$ is a dynamic pressure/friction coefficient. Application of these equations to the talus slope as Lagrangian cells need to be investigated as well as the interaction at the dome/talus interface with the Rheological lava equations. This method should make it possible to obtain an expression for the velocity of the end of the talus slope, which would remove the need for an iterative approach to finding the volume rates of the dome and the talus.

It could also prove feasible to recreate the pyroclastic deposition of material onto the talus as a shock like event by using conservation law schemes [19].

### 6.2.3 Moving to Two Dimensions

At this stage it is not clear if it is possible to represent the dome and the talus as a two dimensional Lagrangian grid. However, if it is feasible, then this will allow the talus to take on a non-triangular shape as the interface will be able to flex freely, rather than being a vertical line; this would be a better representation of reality.

Ultimately but probably much further into the future it would hopefully be possible to build a full two-dimensional finite element model of the talus slope and add it onto the lava dome models presented in [1] which are currently being developed further [20]. However, due to the nature of the expansion of the volcano, the finite element method will need to incorporate a moving mesh, thus it may well be beneficial to investigate the implementation of the appropriate
talus dynamics within a Lagrangian framework first.

## Bibliography

[1] A.J. Hale, Computationally Modelling the Lava Dome at the Soufriere Hills Volcano, Montserrat, PhD Thesis. Reading University (2004),
[2] J. Blower, Bubble Formation in Lava, PhD Thesis. Bristol University
[3] N.J. Balmforth, A.S. Burbidge, R.V. Craster, J. Salzig \& A. Shen Visco-Plastic Models of Isothermal Lava Domes J. Fluid Mech. (2000), vol. 403, pp. 37-65
[4] N.J. Balmforth, R.V. Craster \& R. Sassi Dynamics of Cooling Viscoplastic Domes J. Fluid Mech. (2004), vol. 499, pp. 149-182
[5] R.W. Griffiths \& J.H Fink Solidifying Bingham Extrusions: A Model for the Growth of Silicic Lava Domes J. Fluid Mech. (1997), vol. 347, pp. 13-36
[6] D.I. Osmond \& R.W. Griffiths The Static Shape of Yield Strength Fluids Slowly Emplaced on Slopes J. Geophys. Res. (2001), vol. 106, pp. 16241-16250
[7] A.J. Hale \& G. Wadge Numerical Modelling of the Growth Dynamics of a Simple Silicic Lava Dome Geophys. Res. letters (2003), vol. 30, No 19
[8] R.M. Iverson Lava Domes Modeled as Brittle Shells that Enclose Pressurized Magma, with Application to Mount St. Helens Journal source unknown
[9] H.E. Huppert, J.B. Shepherd, H. Sigurdsson \& R.S.J. Sparks On Lava Dome Growth with Application to the 1979 Lava Extrusion of the Soufriére of St. Vincent J. Volc. Geoth. Res. (1982), vol. 14, pp. 199-222
[10] Geoff Wadge, Private e-mail communications.
[11] F.L. Perez Talus Fabric and Particle Morphology on Lassen Peak, California, Geogr. Ann. (1989), vol. 71A(1-2), pp. 43-57
[12] K. Liffman, M. Nguyen, G Metcalf \& P Cleary Forces in Piles of Granular Material: An Analytic and 3D DEM Study, Granular Matter (2001), vol. 3, pp. 165-176
[13] I. Stratham A Scree Slope Rockfall Model, Earth Surf. Proc. (1976), vol. 1, pp. 43-62
[14] B. Voight \& D. Elsworth Failure of Volcano Slopes, Geotechnique (1997), vol. 47(1), pp. 1-31
[15] P. Jop, Y. Forterre \& O. Pouliquen A Constitutive Law for Dense Granular Flows, Nature (2006), vol. 441, pp. 727-730
[16] S.B. Savage \& K. Hutter The Motion of a Finite Mass of Granular Material Down a Rough Incline, J. Fluid Mech. (1989), vol. 199, pp. 177
[17] S.B. Savage \& K. Hutter The Dynamics of Avalanches of Granular Materials from Initiation to Runout. Part 1: Analysis, Acta Mechanica (1991) vol. 86, pp. 201-223
[18] K. Hutter, Y. Wang \& S.P. Pudasaini The Savage-Hutter Avalanche Model. How Far Can it be Pushed?, Philosophical Transactions A: Mathematical, Physical and Engineering Sciences, the Royal Society, London, Vol. 363(1832), 1507-1528
[19] Y.C Tai, S. Noelle, J.M.N.T Gray \& K. Hutter Shock-Capturing and Front-Tracking Methods for Granular Avalanches, J. Comp. Phys. (2002) vol. 175, pp. 269-301
[20] ESSCC, University of Queensland, Computational Volcanology web pages, shake200.esscc.uq.edu.au/twiki/bin/view/ESSCC/ComputationalPlanetaryScaleSimulation


[^0]:    ${ }^{1}$ Neglecting mouse induced repetitive strain injuries to the wrist.

[^1]:    ${ }^{2}$ The lava is deposited internally.
    ${ }^{3}$ The lava is deposited externally

[^2]:    ${ }^{1}$ See Section 4.2 for more information.

