



**I-SITE
CLERMONT**
Clermont Auvergne Project

Tephra fallout hazard maps with uncertainty quantification for Cotopaxi and Guagua Pichincha volcanoes

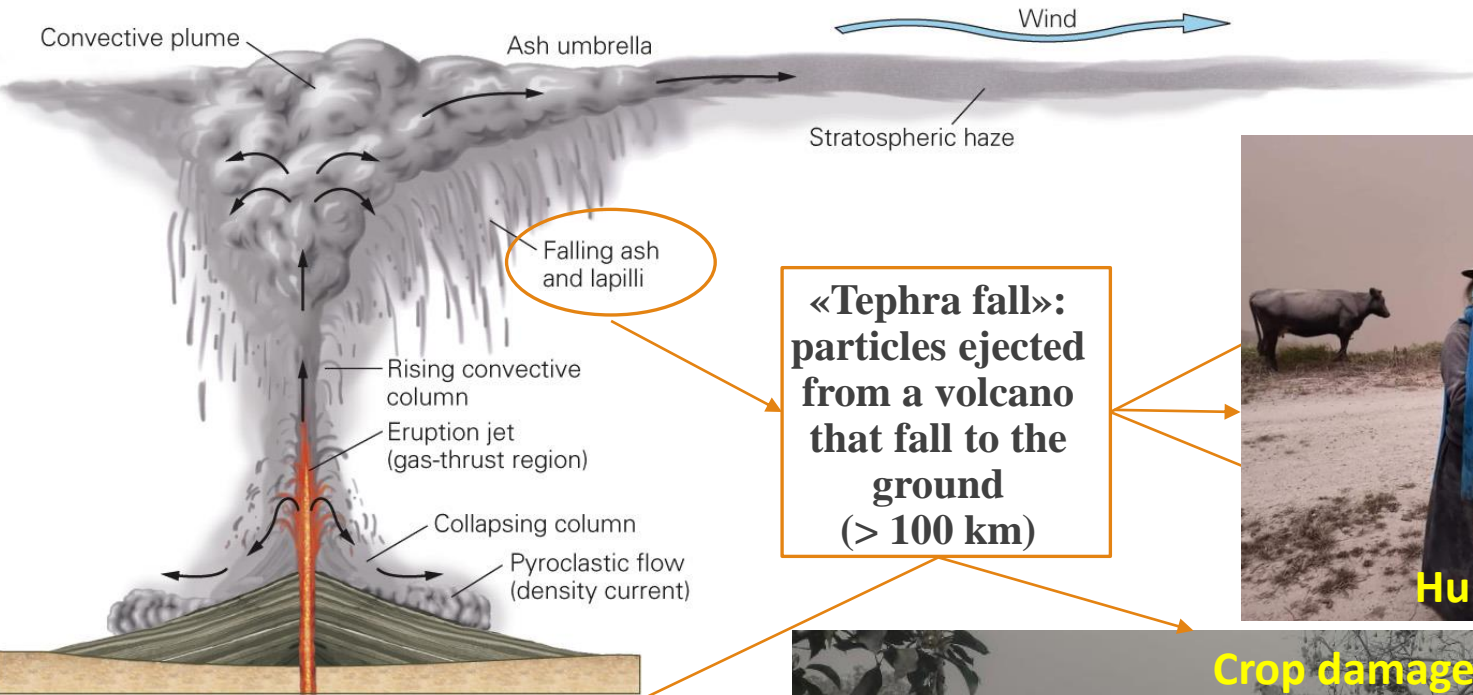
ALESSANDRO TADINI

III TALLER INTERCOMISIONES IPGH 2021, 09/12/2021

Olivier Roche, Nourddine Azzaoui, Arnaud Guillin, Pablo Samaniego, Mathieu Gouhier, Benjamin Bernard, Andrea Bevilacqua, Mattia de' Michieli Vitturi

Julia Eychenne, Silvana Hidalgo, Augusto Neri, Raffaello Cioni, Marco Pistolesi, Federica Pardini, Willy Aspinall, Elizabeth Gaunt, Silvia Vallejo, Marjorie Encalada, Hugo Yepes, Antonio Proaño, Mia Pique, Jean-Luc Le Pennec

Volcanic eruptions



**«Tephra fall»:
particles ejected
from a volcano
that fall to the
ground
(> 100 km)**



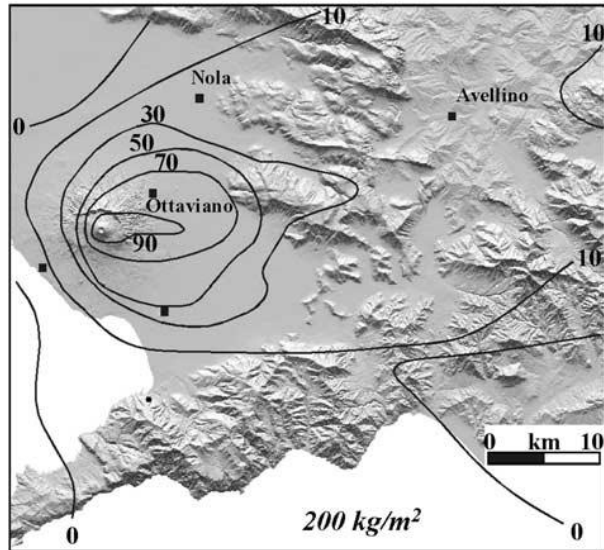
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Volcanic hazard assessemnt: hazard maps

Maps related to mass loading (kg/m^2 ou g/cm^2) or thickness (cm or mm)

Field data

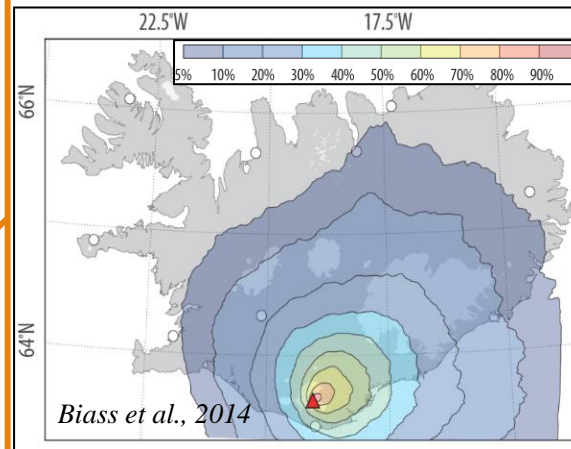
Numerical models



Cioni et al., 2003

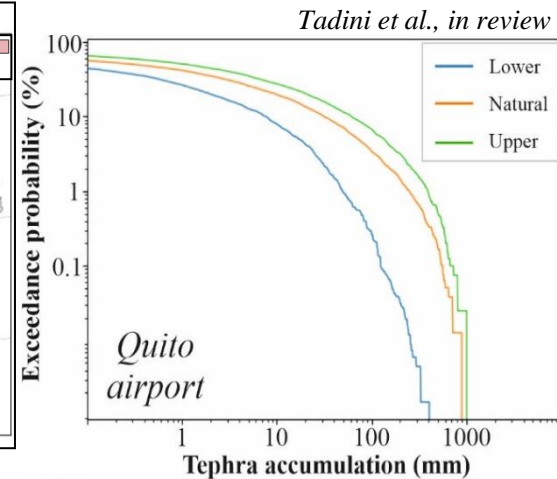
Probabilistic or Semi-probabilistic

- One or multiple scenariii
- Set of parameters
- Monte Carlo sampling



Hazard maps

- given threshold
- given probability



Hazard curves

- site(s) of interest
- Exceedance probability

Deterministic

- One scenario
- Defined parameters

Sources of uncertainty

- Uncertainty in input paramters
- Uncertainty of the numerical model
- Uncertainty on different eruption type occurrence

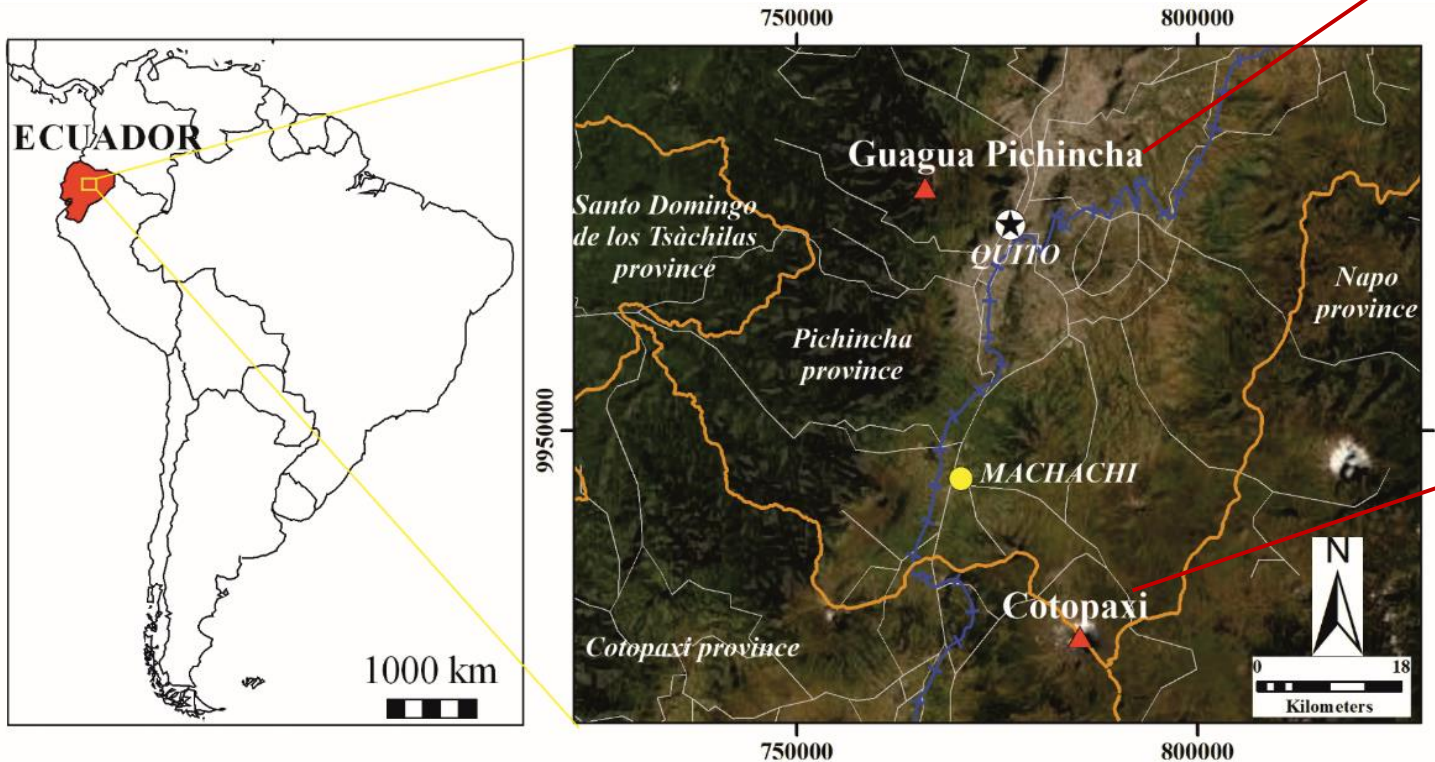
Volcanoes in Ecuador

- 21 active volcanoes in Ecuador (holocene activity)
- Quito threatened by several active volcanoes
- Several studies linked to tephra fallout hazard map production but :
 - a probabilistic approach has not been used systematically
 - uncertainty quantification has not always been applied

GUAGUA PICHINCHA

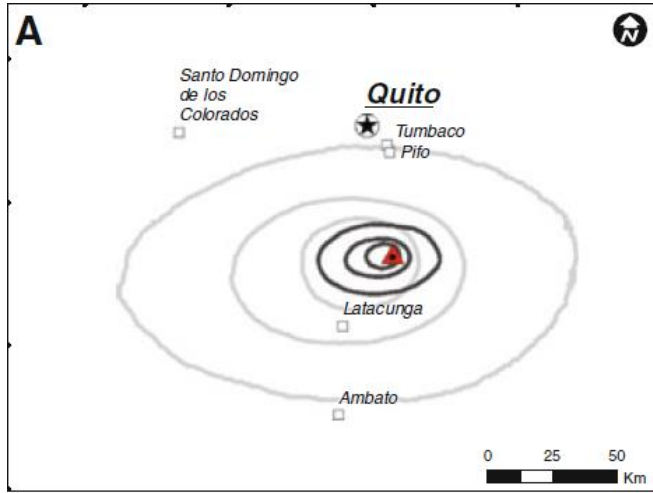


COTOPAXI

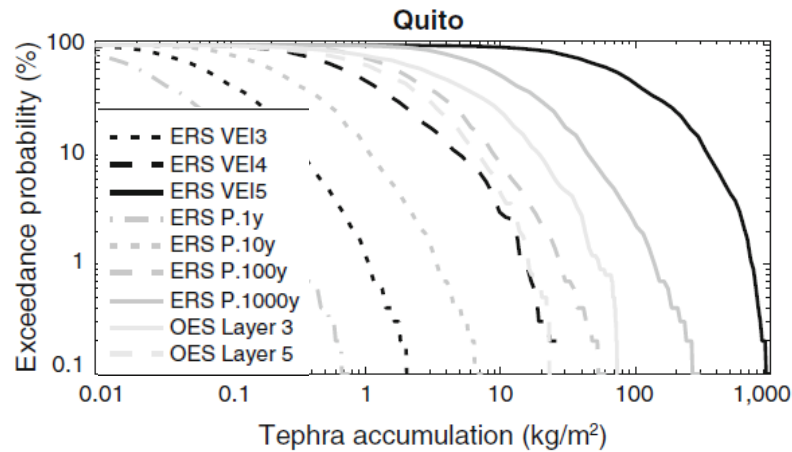
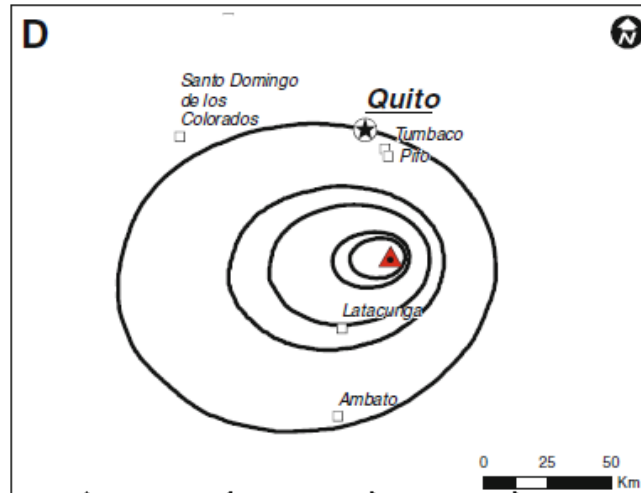


Cotopaxi: tephra fallout hazard assessment

Probability contours for given threshold values of mass loading



Different values of mass load for a given probability of occurrence (50%)



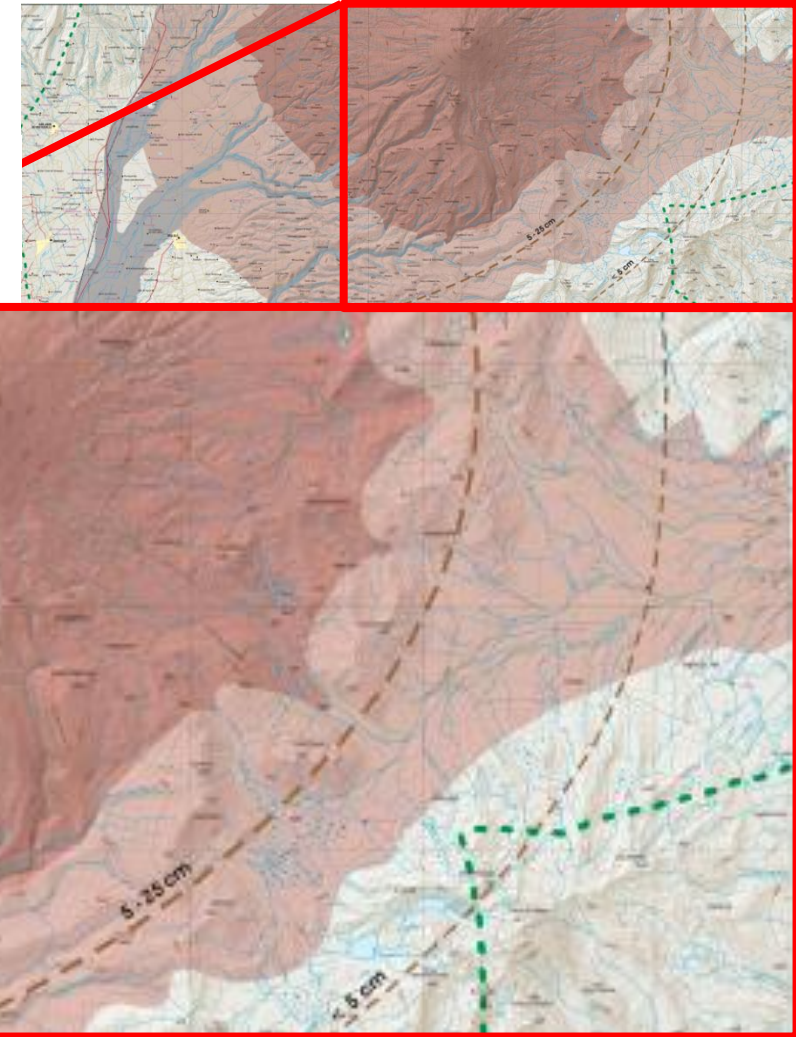
Hazard curves for specific sites

SEMI-PROBABILISTIC and PROBABILISTIC APPROACH (TEPHRA 2)

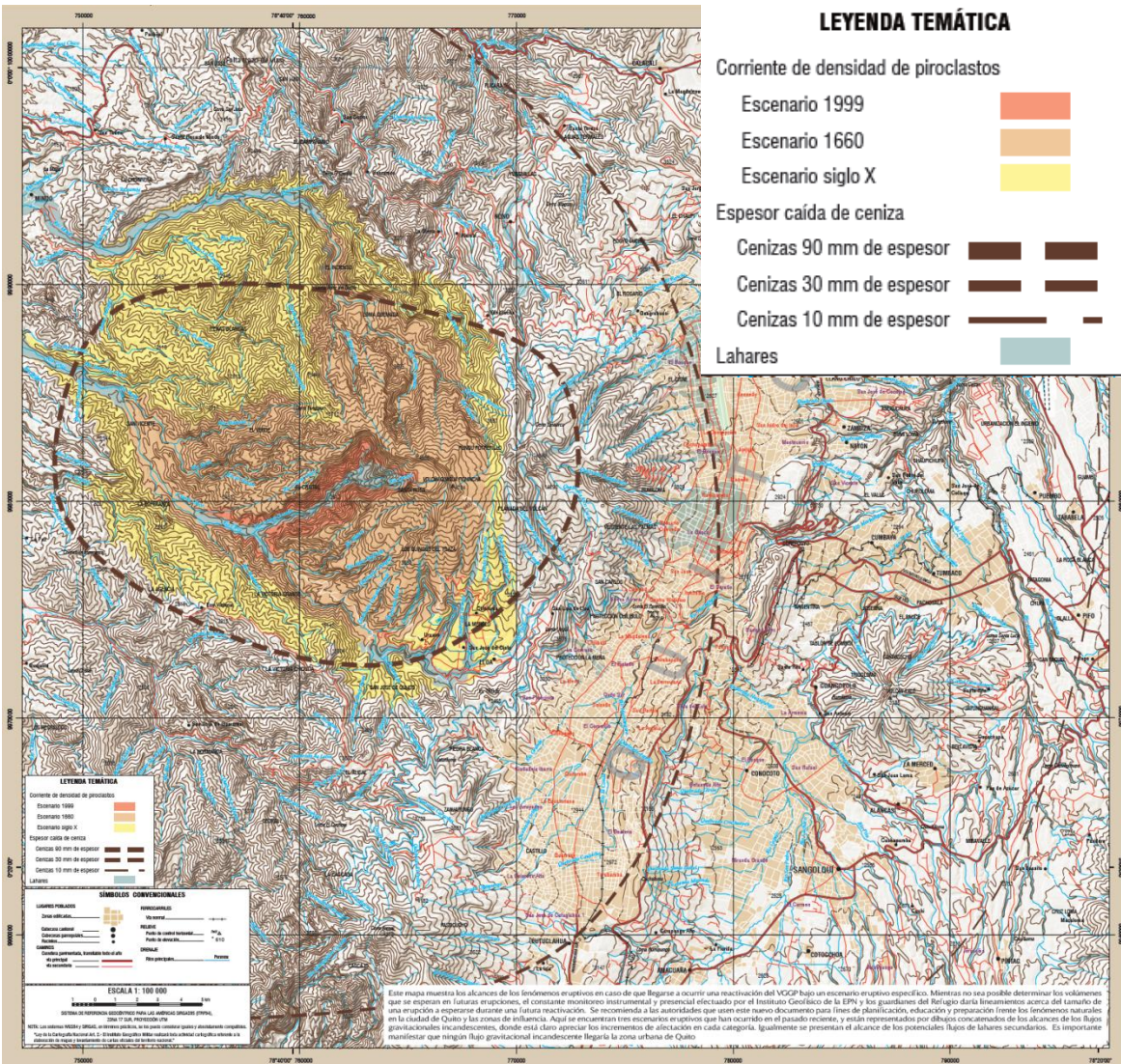
Biass and Bonadonna, 2013

Multi-hazard map (2016)

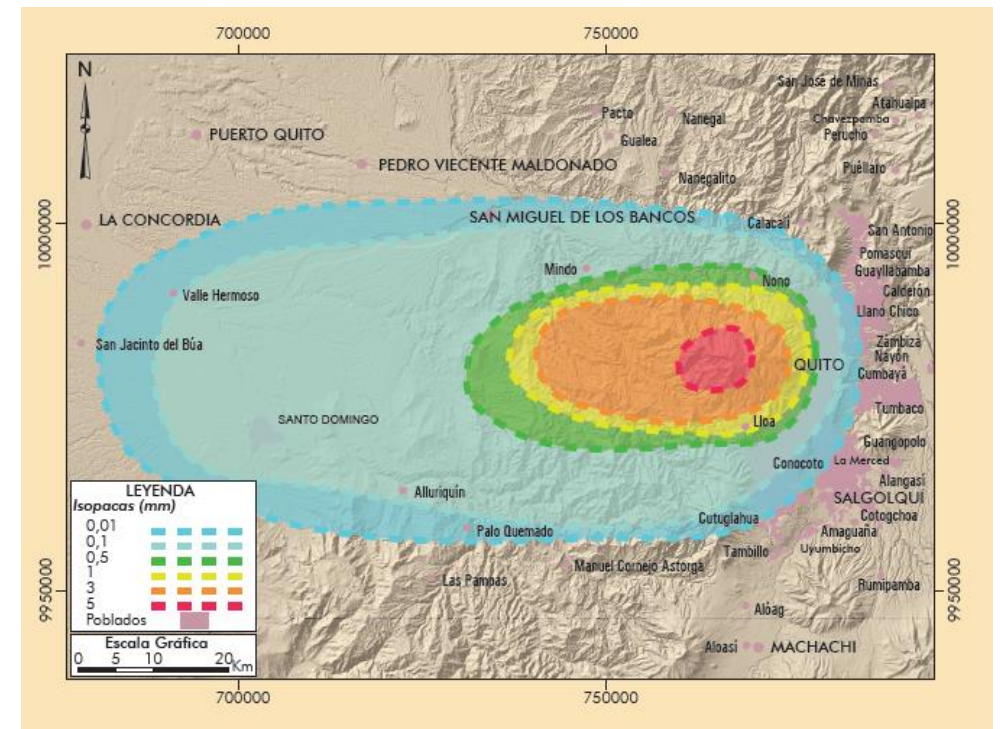
DETERMINISTIC APPROACH (FIELD DATA)



Guagua Pichincha: tephra fallout hazard assessment



- Multi-hazard map (2019)
- Tephra fallout hazard: modeling of 3 benchmark scenarios (1999-2001, AD 1660 and AD 970) with Ash 3D – **DETERMINISTIC APPROACH WITH MULTIPLE SCENARIOS**



Project objectives

Producing tephra fallout hazard maps for Cotopaxi and Guagua Pichincha and creating hazard curves for sensitive sites in Quito



By using the coupled PLUME-MoM/HYSPLIT model



By applying a *doubly stochastic approach* to quantify



Range of variation of input parameters for the model



Probability of occurrence of different eruption types



Under/Overestimation of the numerical model



Define hazard maps/curves

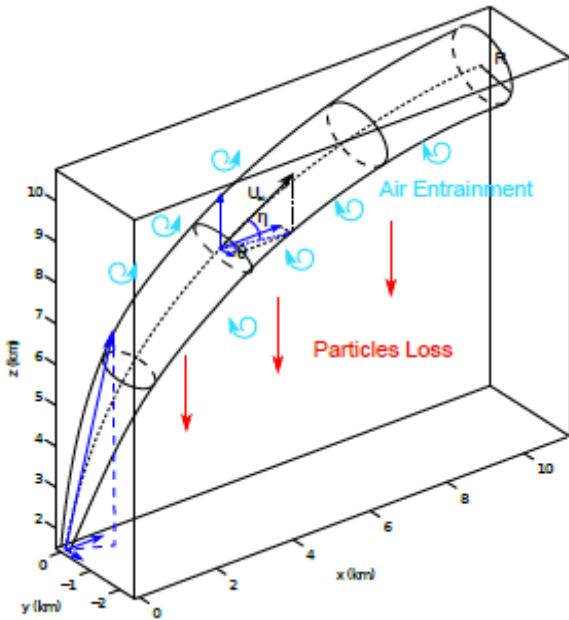


Define uncertainty

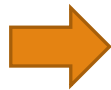
Tephra fallout numerical modelling

PLUME-MoM

Eulerian integral model for the steady-state dynamic of a plume in a 3-D coordinates system

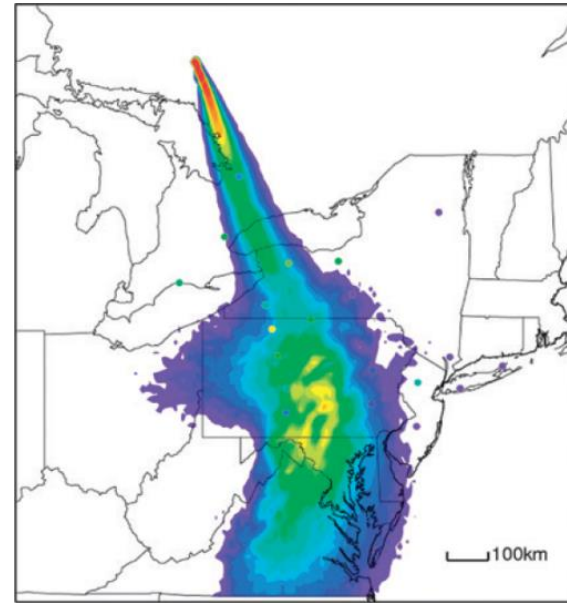


Initialisation



HYSPLIT

Hybrid model (Lagrangian-Eulerian) for tephra transport, dispersion and sedimentation

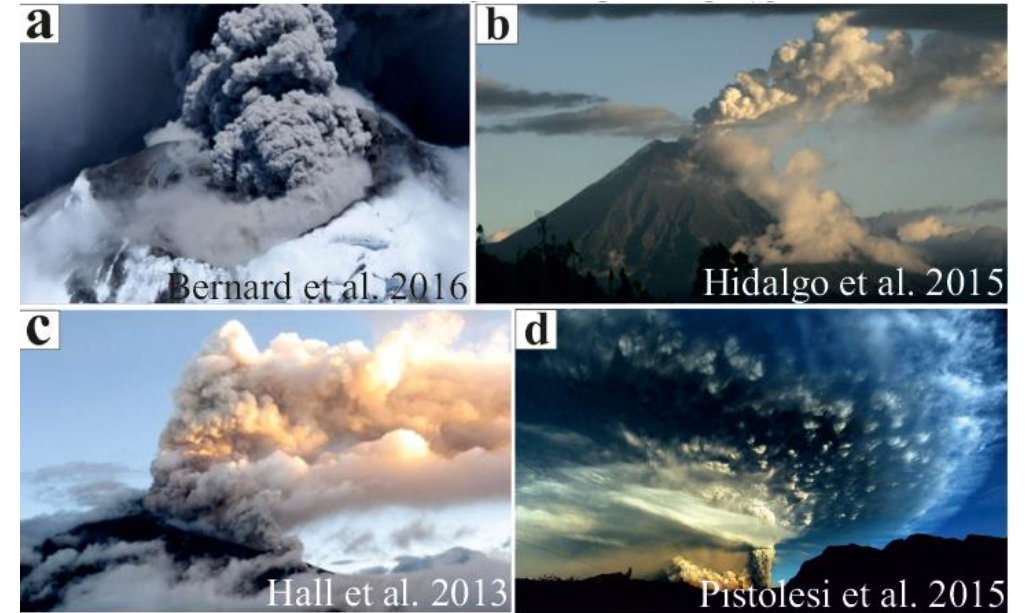


Point/surface sources

Uncertainty quantification

Tadini et al. (2020)

- With respect to plume height
- With respect to mass loading at specific sites
- With respect to grain size at specific sites

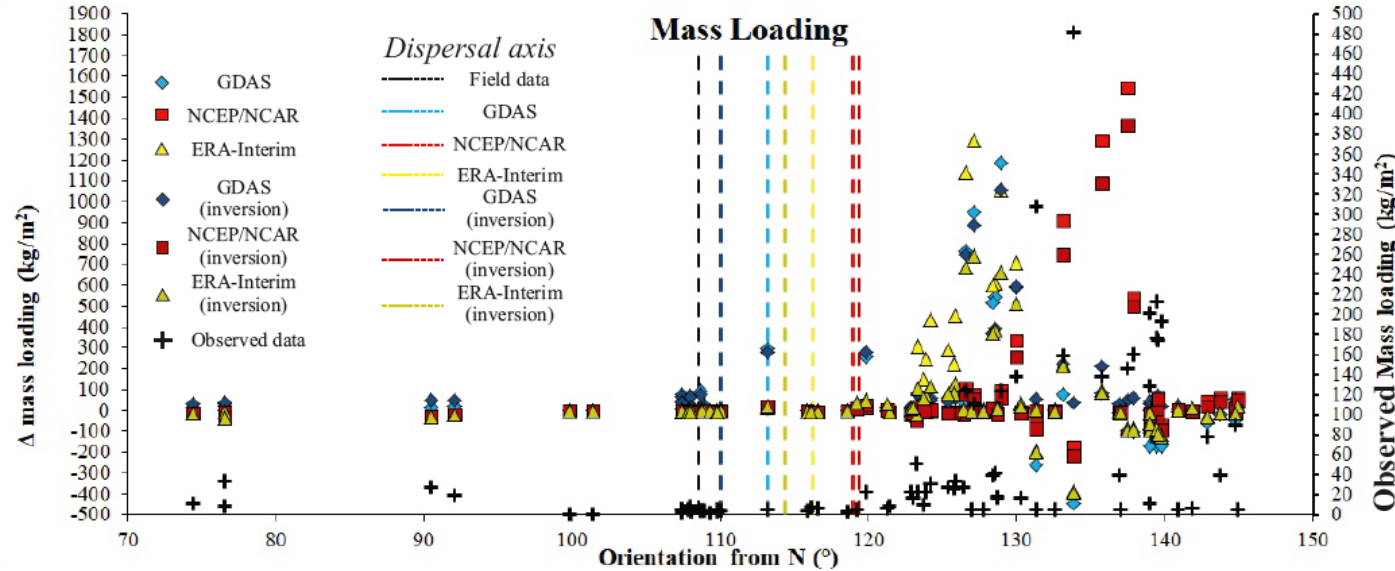


a) Cotopaxi (08/2015-12/2015) Hydrovolcanic/Ash emission
b) Tungurahua (14-30/07/2013) Violent Strombolian
c) Tungurahua (16/08/2006) SubPlinian
d) Cordón Caulle (04-06/06/2011) SubPlinian

Coupling by F. Pardini e M. De' Michieli Vitturi

Uncertainty quantification of the model

Tadini et al. (2020)



JGR Solid Earth

RESEARCH ARTICLE
10.1029/2019JB018390

Quantifying the Uncertainty of a Coupled Plume and Tephra Dispersal Model: PLUME-MOM/HYSPLIT Simulations Applied to Andean Volcanoes

A. Tadini¹, O. Roche¹, P. Samaniego^{1,2}, A. Guillin³, N. Azzaoui³, M. Gouhier¹, M. de' Michieli Vitturi⁴, F. Pardini⁴, J. Eycheenne⁴, B. Bernard², S. Hidalgo², and J. L. Le Pennec^{1,5}

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$$\begin{cases} \frac{MO}{MML} = \frac{\sum_{i=1}^{N_o} \Delta_i}{N_o} & \text{for } \Delta_i > 0 \\ \frac{MU}{MML} = \frac{\sum_{i=1}^{N_u} \Delta_i}{N_u} & \text{for } \Delta_i < 0 \end{cases}$$

PLUME-MoM/HYSPLIT more suited for reproducing medium/large magnitude eruptions (subplinian or plinian)

Mean overestimation coefficient



MO/MML_{Cordón Caulle 2011} = 1.48

Mean underestimation coefficient



MU/MML_{Cordón Caulle 2011} = -0.49

Mean Overestimation (MO)

Mean Underestimation (MU)

Mean Mass Loading (MML)

μ_{ML} = mean of the observed mass loading

Δ mass loading = $ML_{computed} - ML_{observed}$

Δ_i = Δ mass loading for the i-esimal section

Expert elicitation/1

HOW?

WHY?

Prompt decision or a long term-planning are needed

BUT

- No (or very little) data available
- Data source are extremely uncertain



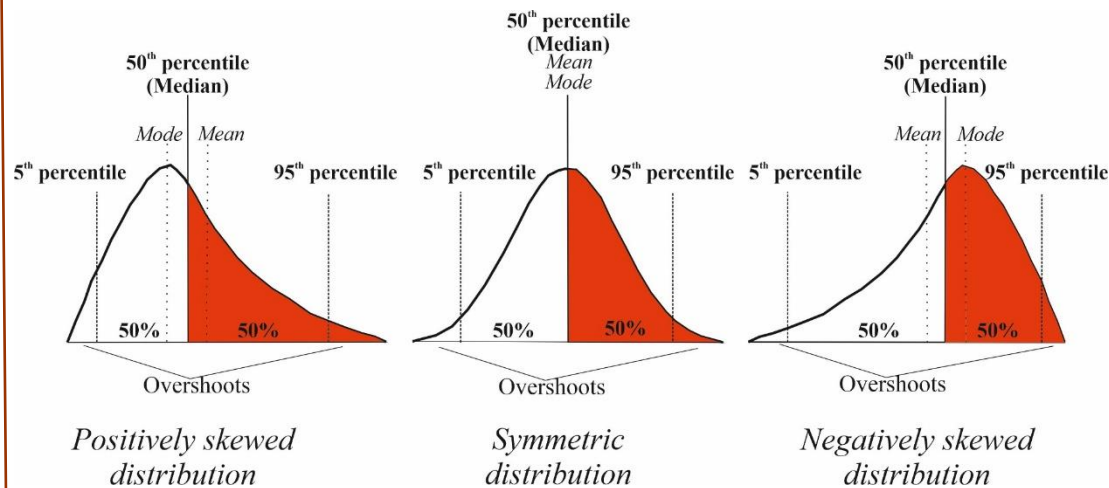
A complete quantification of uncertainty is required

The Classical Model

1. Choosing the experts
2. Seed questions
3. Target questions

Two questionnaires – median value with 5th and 95th percentiles

EACH EXPERT DEFINES A PROBABILITY DISTRIBUTION



«Scoring» method → Weighted mean of experts' answers → « Decision maker »

OUR STUDY

1. 20 experts
2. 14 seed questions
3. 55 Target questions – uncertainty range for:
 - Future eruption types (different periods)
 - Eruptive source parameters (duration, total mass, plume height)



Bulletin of Volcanology (2021) 83:35
<https://doi.org/10.1007/s00445-021-01458-z>

RESEARCH ARTICLE

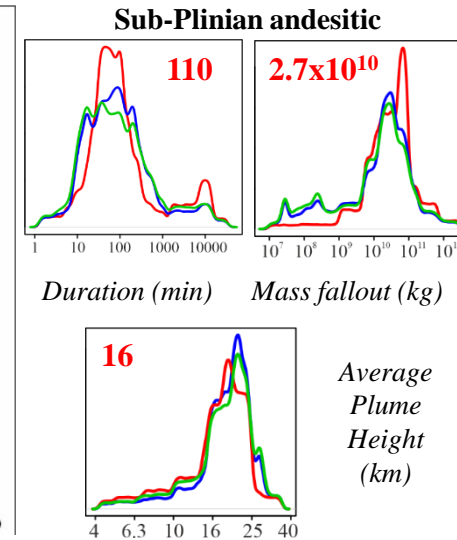
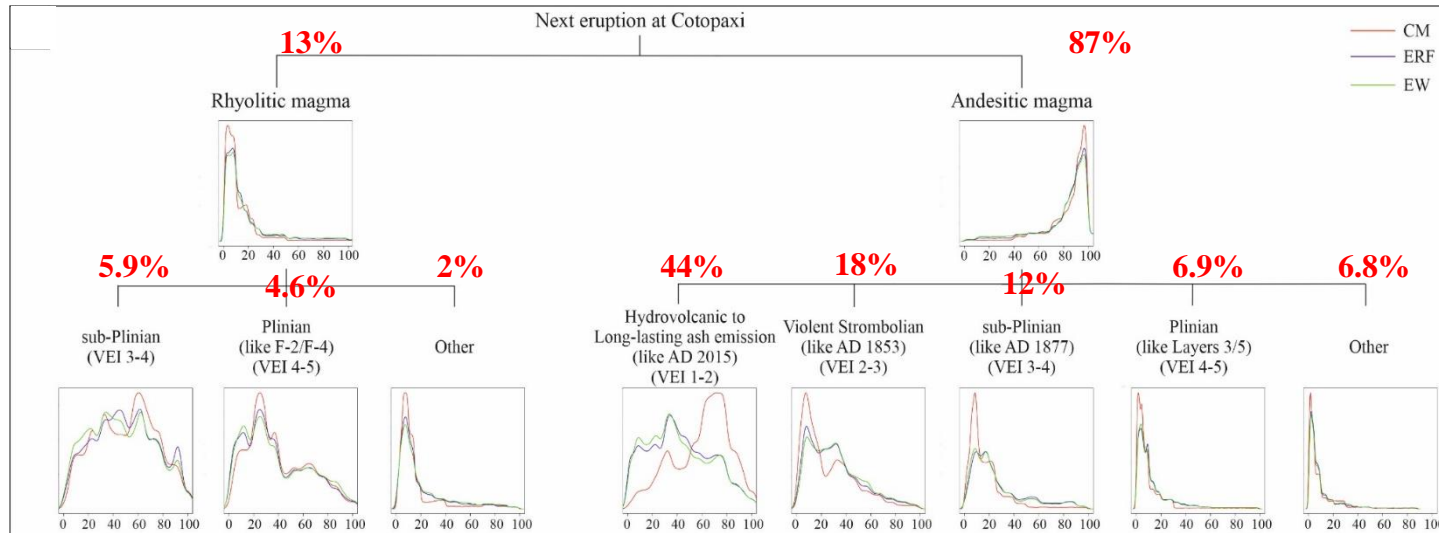
Eruption type probability and eruption source parameters at Cotopaxi and Guagua Pichincha volcanoes (Ecuador) with uncertainty quantification

Alessandro Tadini¹ · Olivier Roche¹ · Pablo Samaniego^{1,2} · Nourdine Azzaoui³ · Andrea Bevilacqua⁴ · Arnaud Guillin⁵ · Mathieu Gouhier¹ · Benjamin Bernard² · Willy Aspinall⁶ · Silvana Hidalgo² · Julia Eychenne¹ · Mattia de' Michieli Vitturi⁴ · Augusto Neri⁴ · Raffaello Cloni⁶ · Marco Pistolesi⁷ · Elizabeth Gaunt² · Silvia Vallejo² · Marjorie Encalada² · Hugo Yepes² · Antonio Proaño² · Mia Pique^{2,8}

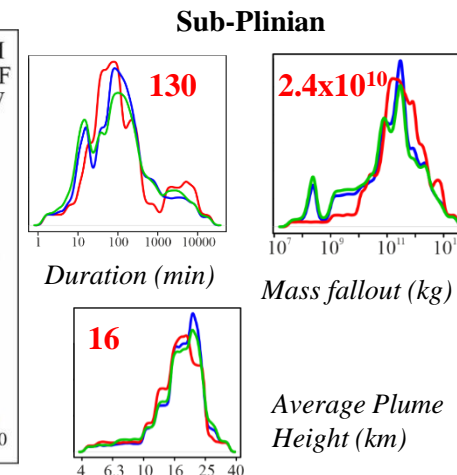
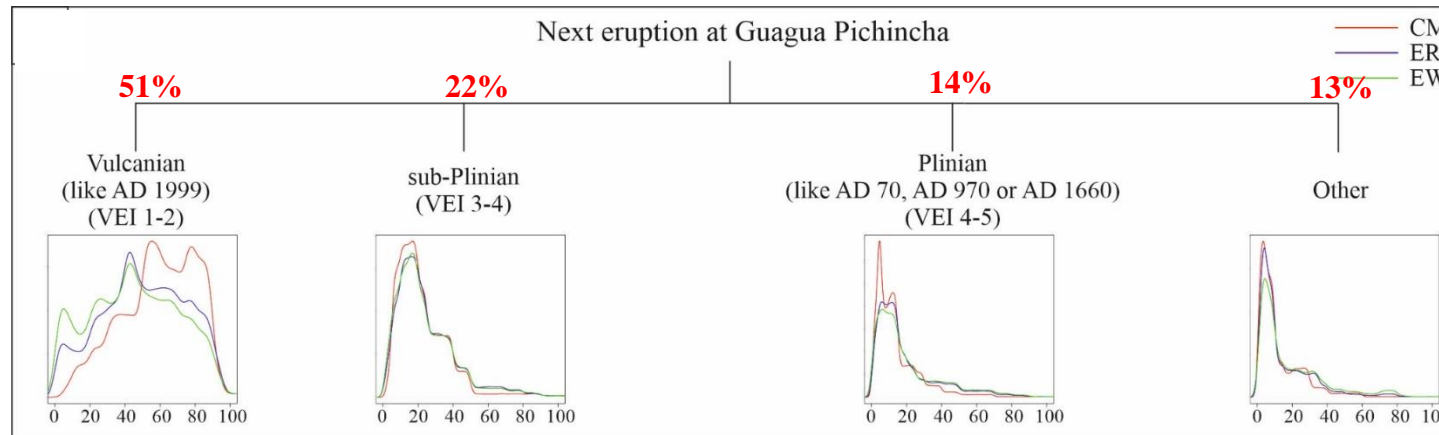
Received: 29 October 2020 / Accepted: 9 April 2021
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Expert elicitation/2

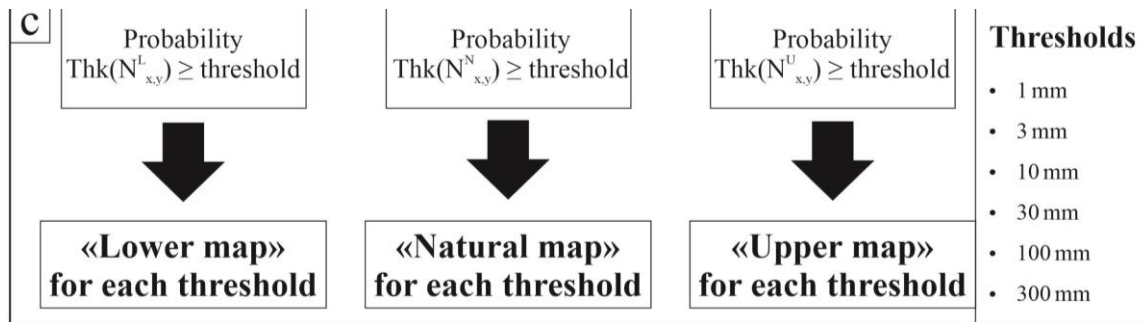
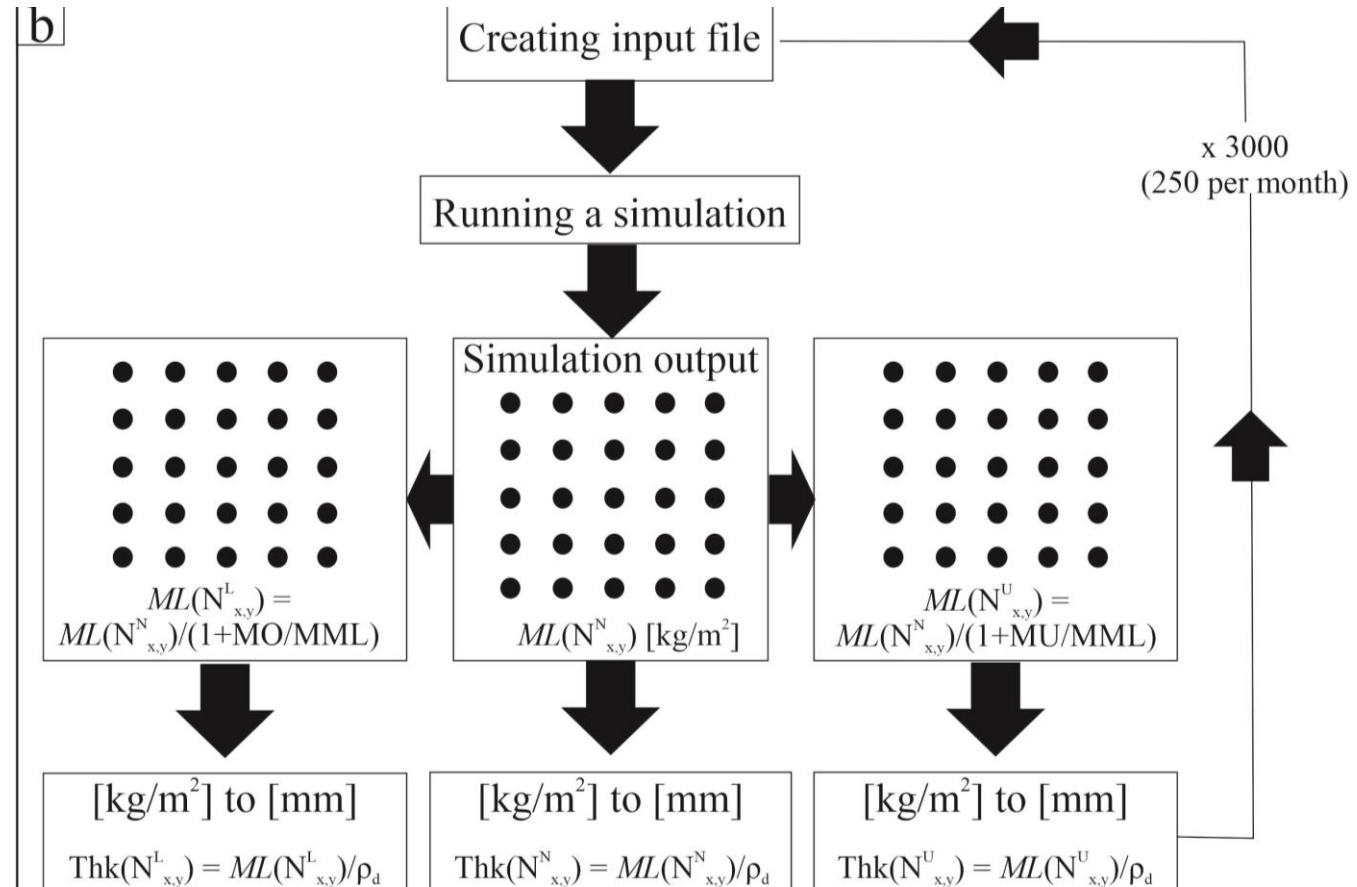
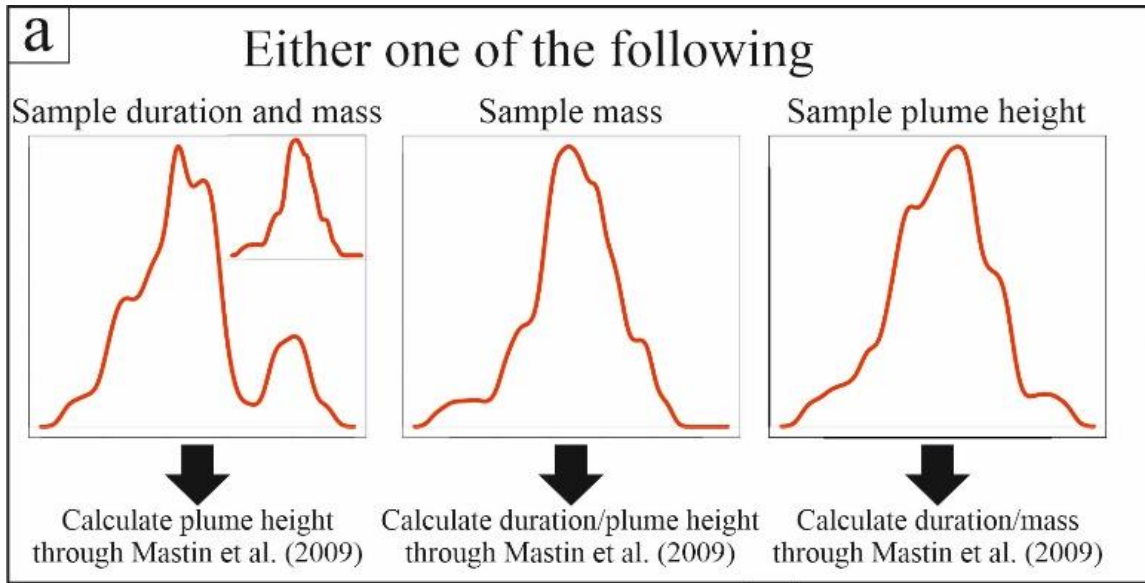
COTOPAXI



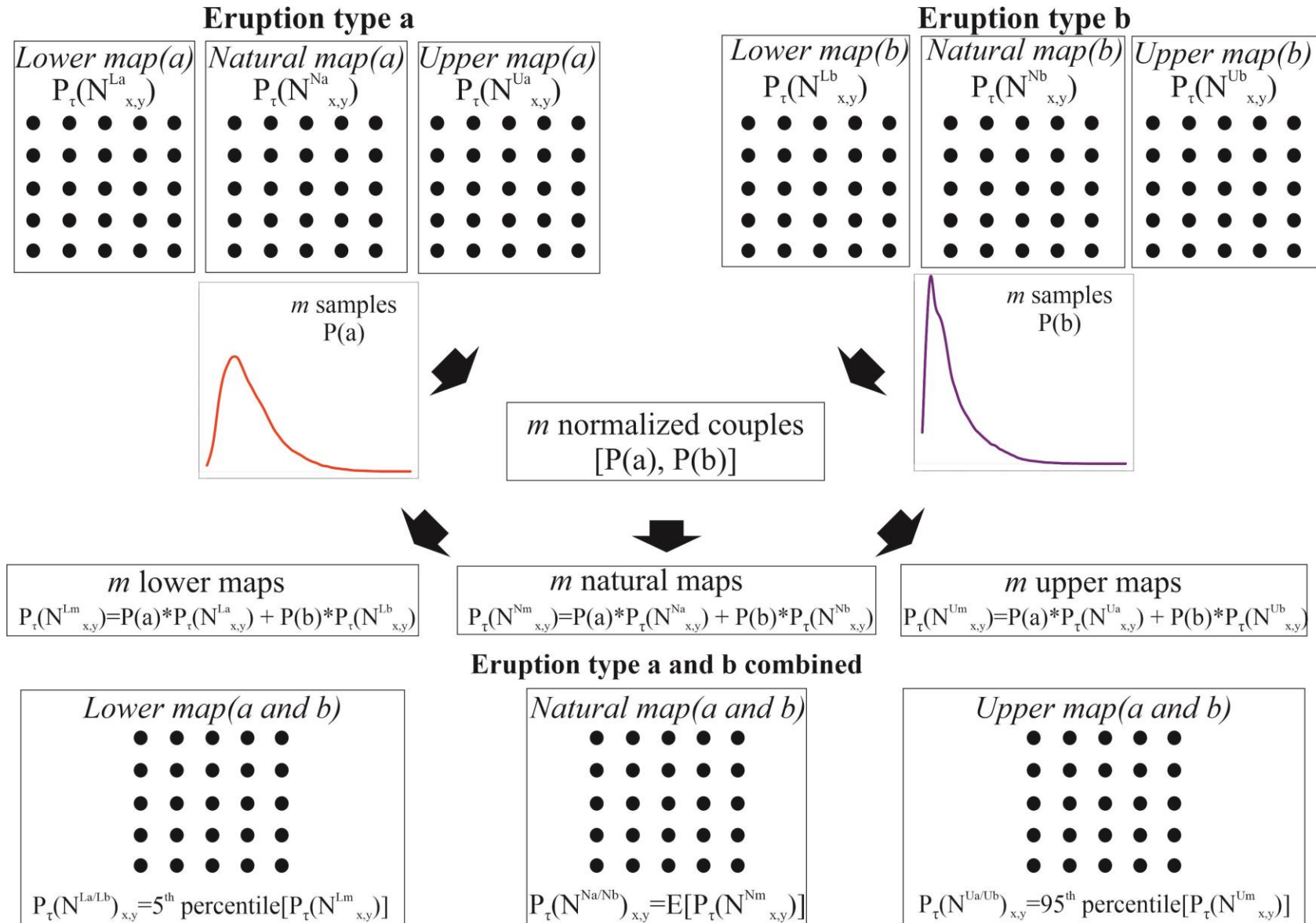
GUAGUA PICHINCHA



Hazard maps production



Hazard maps production



Hazard maps

Hazard maps for sub-plinian and plinian eruptions considered individually or together:

- for Cotopaxi, rhyolitic (2) and andesitic (2) – *TOTAL 4*
- for Guagua Pichincha, dacitic (2) – *TOTAL 2*

Tephra fallout probabilistic hazard maps for Cotopaxi and Guagua Pichincha volcanoes (Ecuador) with uncertainty quantification

A. Tadini¹, N. Azzaoui², O. Roche¹, P. Samaniego^{1,3}, B. Bernard³, A. Bevilacqua⁴, S. Hidalgo³, A. Guillin², M. Gouhier¹



Given thickness thresholds (1 - 300 mm) and different probabilities

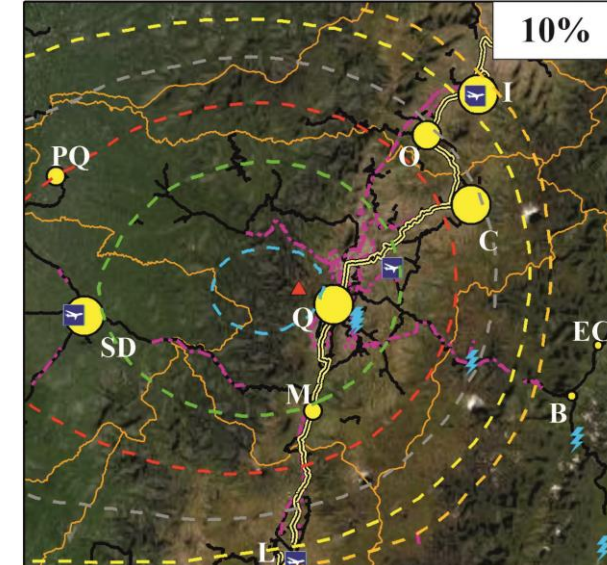
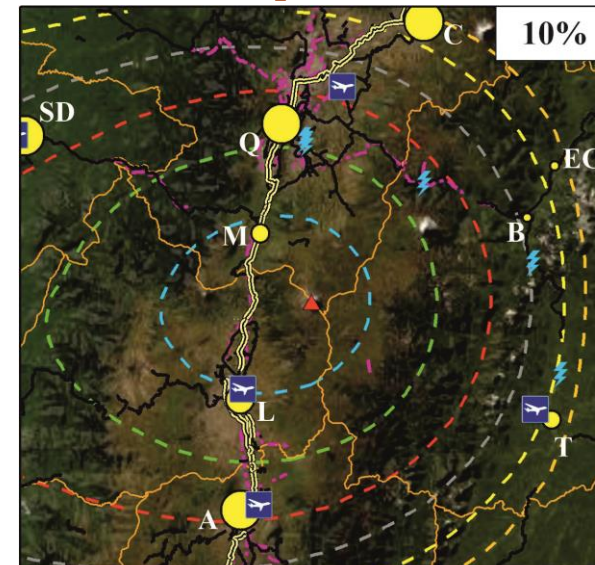
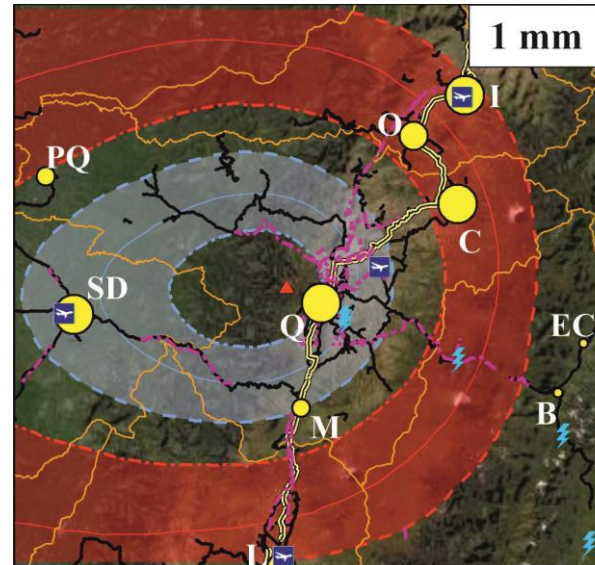
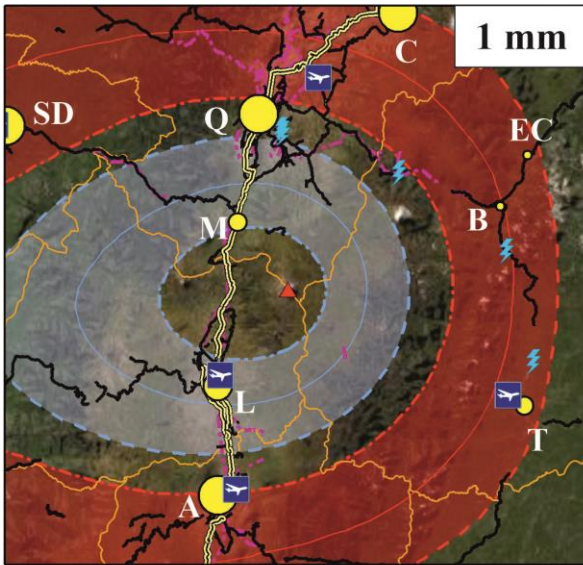
Given probability (10% and 50%) and different thickness thresholds

Cotopaxi

Guagua Pichincha

Cotopaxi

Guagua Pichincha



Contour (%)

Lower (5 th perc)	Natural (mean)	Upper (95 th perc)
--- 10	— 10	--- 10
--- 50	— 50	--- 50
■ 10% unc. area		■ 50% unc. area

Surface (km²) of 1mm-10%

Population within 1mm-10%

Coto: 13k – 20k – 25k

Pich: 12k – 19k – 24k

Coto: 2.2M – 4.1M – 4.4M

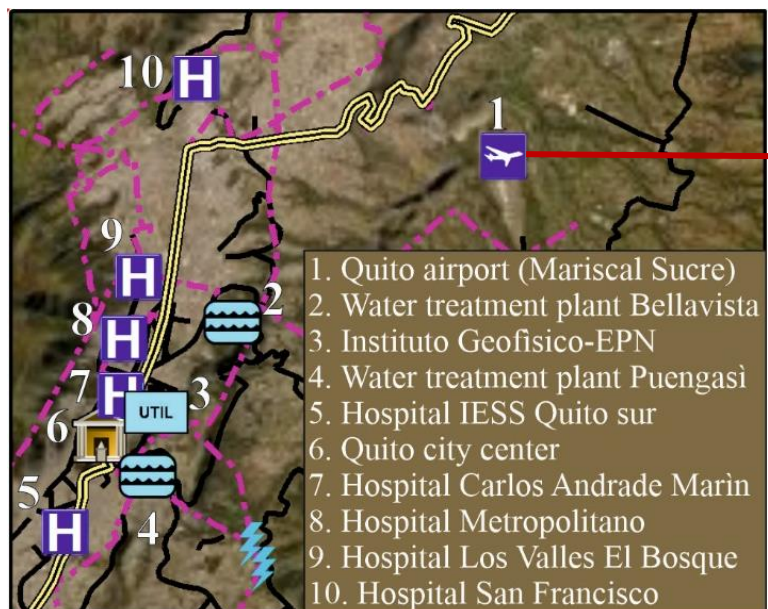
Pich: 3.3M – 3.8M – 4.1M

Contour (mm)

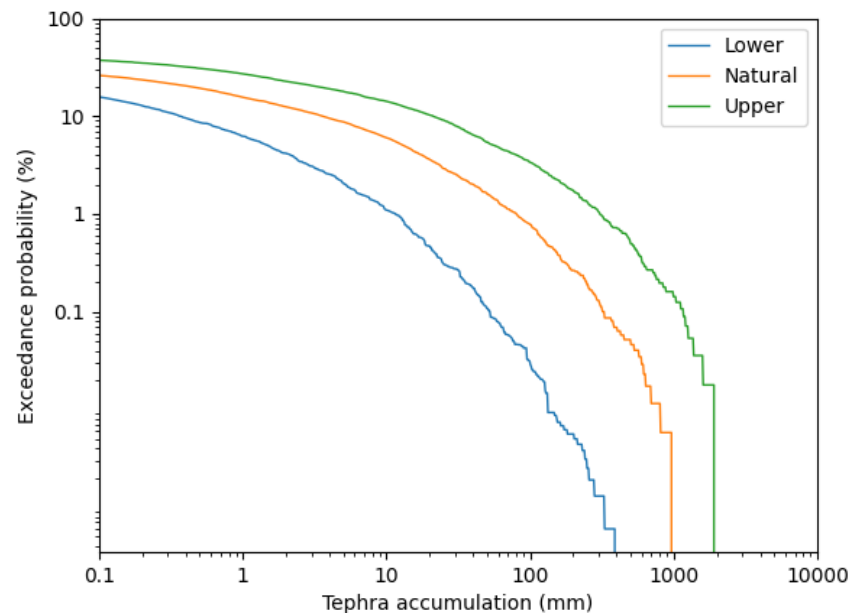
Upper (95 th perc)	
--- 1	--- 30
--- 3	--- 100
--- 10	--- 300

Hazard curves

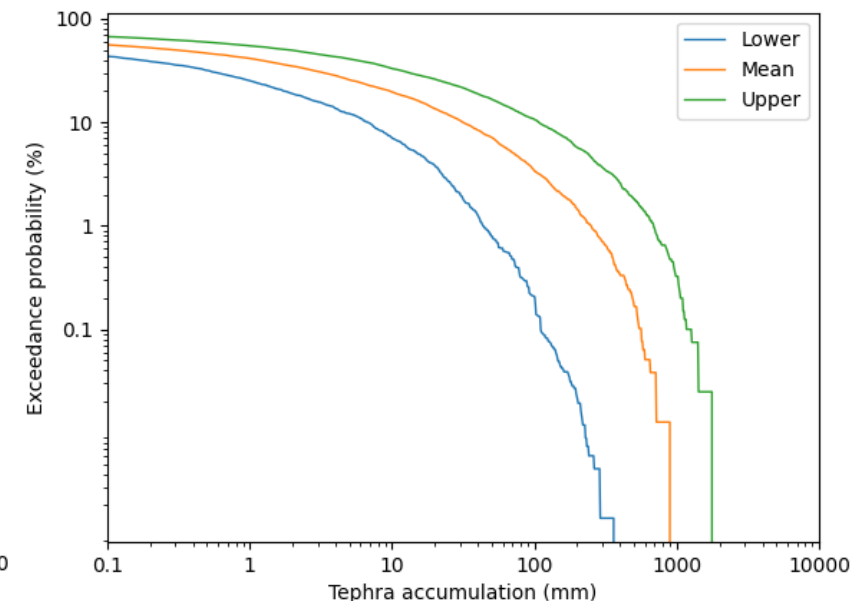
For a more detailed study of the city of Quito : hazard curves for 10 sensitive sites



Cotopaxi



Guagua Pichincha



1mm : 6.4% - **15.9%** - 24.0%
 3mm : 3.4% - **11.0%** - 18.0%
 10mm : 1.3% - **6.3%** - 11.1%
 30mm : 0.3% - **2.8%** - 6.1%
 100mm : 0.1% - **0.8%** - 2.1%
 300mm : 0 - **0.1%** - 0.4%

1mm : 26.3% - **41.3%** - 50.4%
 3mm : 16.6% - **30.8%** - 40.2%
 10mm : 7.9% - **19.6%** - 27.3%
 30mm : 2.4% - **10.4%** - 16.2%
 100mm : 0.3% - **3.4%** - 6.7%
 300mm : 0 - **0.7%** - 1.7%

Conclusions

- **Uncertainty quantification of the model** – *definition of mean under/overestimation coefficients of the model*
- **Uncertainty quantification** for the probability of occurrence of different **eruption types** for the range of **eruptive source parameters** – *expert elicitation session*
- **Hazard maps** produced for sub-plinian and plinian eruptions considered separately and together
 - **Cotopaxi** (4 eruption types)
 - **Guagua Pichincha** (2 eruption types)
- Two map types:
 1. for a given **tephra accumulation threshold** and different probabilities
 2. for a given **probabilité donnée et différents seuils d'accumulation de téphra**
- Three maps (« lower », « natural » et « upper ») that quantify the different sources of uncertainty
- **Quito** : **hazard curves** defined for **10 sensitive sites**

Thanks for your attention!

