Probabilistic invasion maps of pyroclastic density current hazard by using long-term vent opening mapping and simplified invasion models: application to Campi Flegrei caldera (Italy)

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The objective

The PDC hazard mapping in the CF caldera is particularly challenging due to

- 1) the large uncertainty on future vent location
- 2) the unpredictable scale of future activity, and
- 3) the complex dynamics of PDC (particularly over the 3D caldera topography)



Satellite image of Campi Flegrei caldera (Bisson et al., 2007)

A quantitative probabilistic mapping of PDC invasion, possibly able to account for the intrinsic uncertainties of the system, is needed for hazard assessment.

We focused our work on the **quantification of the different sources of uncertainty** in order to produce median and quantile probabilistic maps.

The methodology

In order to produce a long-term probability map of PDC hazard of the CF caldera we **considered the main sources of uncertainty** by using **probability density functions** and **simplified PDC invasion models**. In particular, we used:

•a **probability map of new vent opening** using new field work and mathematical modelling about past eruptive activity and caldera volcanological features.

•a probability law describing the distribution of eruptive scales (i.e. PDC invasion areas) of past events at CF (i.e. we do not need to select a specific reference scenario)

• simplified PDC invasion models

The final invasion map was obtained by *Monte Carlo simulation* by sampling the possible events w.r.t. the above pdf distributions. Whenever possible probability distributions were considered together with the *associated uncertainties*.

The production of the probabilistic vent opening map

We based on the assumption that the probability of vent opening can be expressed as a **weighted combination of spatial distributions of relevant variables** (i.e. past vents, faults and fractures).

In particular we focused on the quantification of some sources of uncertainty such as:

- Uncertainty on the spatial location of eruptive vents/fissures (with reference to the last 15 kyrs)
- Uncertainty due to the incompleteness of the datasets of the variables considered (i.e. past vent openings, faults and fractures)
- Uncertainty on the relative weights of the different variables considered

Vent opening data with uncertainty

16 Olibano

28 Nisida



Epoch I: 33 vents (about 10.6-15 kyrs ago)

Epoch III and Mt Nuovo: 29 vents (about 3.5-5.5 kyrs ago and 1538 AD)



Epoch II: 8 vents (about 9.1-9.6 kyrs ago)







Partition of the CF caldera for vent opening

Caldera partition

1	Capo_miseno
2	Baia
3	Averno_mn
4	Gauro
5	Toiano_pz
6	Solfatara
7	Pisani
8	Astroni
9	Agnano
10	Pianura
11	Soccavo
12	Bagnoli
13	Nisida
14	Mare
15	CI



We partitioned the caldera in 15 zones by taking into account the **spatial and temporal clustering** of past vents and the actual **morphological features** of the caldera.

This has the motivation to discriminate between the zones that have a different history of activity, also based on the experts opinion.

We counted the number of ellipses contained in each zone (or the associated fraction contained) obtaining three **maps of the frequency of past vents**, one for each epoch of activity.

Distribution of faults and fractures densities

The fracture map shows the value of density of fracturation, as number of fractures per meter, obtained from discrete sampling.





The fault map shows the value of density of faulting also including the historical deformation patterns.

Assignment of weights by expert judgement

The experts also estimated the **percentage of completeness of the datasets**. The complementary percentage (i.e. unmapped past vents, fractures and faults) was assigned to **homeogeneus maps**.

75% 95% 90% 80% 80% **Faults Fractures** Vents of epoch II Vents of epoch I Vents of epoch III In order to favor the assignment of weights to the geological features a simple logic tree was adopted (all relative weights were scaled to sum to 100%). The weights given to the vents of the three epochs **40% STRUCTURAL FEATURES** 60% PAST VENTS were assumed per single vent and therefore were then normalized. 30% EPOCH II 40% EPOCH III 60% FRACTURES 40% FAULTS **30%** EPOCH I

Completeness of datasets (Reliability percentage)

The percentages were assigned as **modal values** and the uncertainty about them was then described using triangular distributions.

We also considered the possibility that the probability of vent opening would be correlated to other **neglected features** of the system. This has been estimated of the order of **10%**.

Preliminary probabilistic vent opening map (1) 2.0 The values plotted represent the percentage of vent opening per square kilometer. 18.63% 4.83% 21.67% 17.28% 11.52% Vents I Vents II Faults Vents III **Fractures** Homogeneous maps

representing lack of information

26.07%

Preliminary probabilistic vent opening map (2)

By considering the above described uncertainty sources and using **Monte Carlo simulation** we obtained the **5% and 95%ile maps of probability of vent opening** as well as specific distributions of uncertainty in specific places.



To **express the uncertainty** about the weight just given with the homogeneous maps we simulated to concentrate each part of it on single zones of the partition randomly extracted during this Monte Carlo simulation.



Probability law of the distribution of PDC invasion areas

To produce a probability law representing the scale of the eruption, we focused directly on the invaded areas of past events.

The **distribution of PDC areas** were derived from a revision of the Orsi et al. (2004) dataset.

Epoch I

_bellavista_volcano
gauro_volcano
_st_teresa_volcano
j_la_pietra_volcano
_torre_cappella_volcano
2_Soccavol_tephra
3_pomici_principali_tephra
4_paleopisani_tephra
6_soccavo2_tephra
7_soccavo3_tephra
20_soccavo4_tephra
21_paleosanmartino_tephra
22_minopoli2_tephra
23_soccavo5_tephra
25_pisani2_tephra
28_mte_spaccata_tephra
30_pisani3_tephra
32_bacoli_volcano
33_porto_miseno_volcano







Invasion area densities were produced for **different periods** (5 vs 15 kyrs) and **probability density functions** (e.g. lognormal, etc.)

We are working to assess an uncertainty distribution also around this probability density.



Simplified PDC invasion models

To produce probabilistic invasion maps we implemented a few *simplified PDC invasion models* able to describe the *influence of caldera topography*. In particular:

•Circular invasion area model

(i.e. actual topographic effects neglected, accounts for an average past topography of the caldera)

•Energy line model (Hsu 1975)

(i.e. energy cone, linear decay of flow energy)

•Box model (*Huppert and Simpson 1980, Dade and Huppert 1996*) calibrated by using the **2D multiphase flow model PDAC** (*Neri et al. 2003, Esposti Ongaro et al. 2007*)

The PDC "box model"

The dynamics of the PDC are described as the collapse of a finite volume of dense fluid in a lighter surrounding atmosphere and on a flat surface.

The homogeneous box model gives the **relationship between front velocity and time** as a function of initial conditions, with only one calibration parameter (Froude number, experimentally equal to 1.19) (von Karman, 1940)



Sketch of the lock-exchange configuration

For **particle-laden currents** (Huppert and Simpson, 1980):

$$\frac{\mathrm{d}L}{\mathrm{d}t} = u = \mathrm{Fr}(g'h)^{1/2}$$
$$\frac{\mathrm{d}\phi}{\mathrm{d}t} = -\frac{V_s\phi}{h}$$
$$g' = \phi g(\rho_p - \rho_a)/\rho_a \equiv \phi g'_p$$

The PDC calibrated box model (2)

Once the value of I_{max} is known, it is possible to compute the kinetic energy of the flow front and therefore the height of the topographic relief that can be overcome.



Preliminary probability maps by using the three simplified models



Probability maps by considering the uncertainty on vent locations

The maps represent the mean and the 5 and 95%ile considering the uncertainty on the probability map of vent opening.

The maps were obtained by using the calibrated **box model with** $C_3 = 2 \text{ m}^{2/3}/\text{s}$.



Concluding remarks

- The preliminary hazard maps explicitly consider the **two main unknowns** of the system, i.e. the **vent location** and the **eruption scale**.
- A preliminary **probabilistic map of vent opening**, able to incorporate the associated **uncertainty**, was produced by assigning relative weights to different geological features by using **expert judgement**.
- All the hazard maps produced appear to **capture the first-order features** of the probability of invasion. Main differences are shown along the **caldera rims** where the topographic effect is captured by the **energy line and the calibrated box model**.
- The uncertainty on the probability of **vent location** appears to have a **large effect** on the invasion map.
- Further progress appears to be linked to the use of PDC models able to describe the **3D features of the caldera** and to a better **quantification of the uncertainty sources**.

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