- Sensitivity study of forecasted aftershock seismicity
- <sub>2</sub> based on Coulomb stress calculation and rate- and
- state-dependent frictional response

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### 4 Abstract.

We use the Dieterich (1994) physics-based approach to simulate the spatiotemporal evolution of seismicity caused by stress changes applied to an infinite **population** of nucleating patches modeled through a rate- and statedependent friction law. According to this model, seismicity rate changes depend on the amplitude of stress perturbation, the physical constitutive properties of faults (represented by the parameter  $A\sigma$ ), the stressing rate and the background seismicity rate of the study area. In order to apply this model 11 in a predictive manner, we need to understand the impact of physical model 12 parameters and the correlations between them. Firstly we discuss different 13 definitions of the reference seismicity rate and show their impact on the computed rate of earthquake production for the 1992 Landers earthquake sequence as a case study. Furthermore, we demonstrate that all model parameters are strongly correlated for physical and statistical reasons. We discuss this correlation emphasizing that the estimations of the **background** seismicity rate, stressing rate and  $A\sigma$  are strongly correlated to reproduce the observed aftershock productivity. Our analytically derived relation demonstrates the impact of these model parameters on the Omori-like aftershock decay: the cvalue and the productivity of the Omori law, implying a p-value smaller or equal to 1. Finally, we discuss an optimal strategy to constrain model parameters for near-real time forecasts.

#### 1. Introduction

- The spatial evolution of seismicity is commonly modeled in terms of coseismic and postseismic stress changes. Stress perturbations are simulated to model fault interaction and earthquake triggering (Harris, 1998; King and Cocco, 2001; Freed, 2005; Steacy et al., 2005a, and references therein). Several papers have pointed out the correlation between Coulomb stress changes and the seismicity rate changes after moderate-to-large magnitude earthquakes (Stein, 1999; Toda and Stein, 2003). However, these studies show that, in order to model the spatial and temporal evolution of seismicity, the fault constitutive properties have to be taken into account. To this task Dieterich (1992, 1994) proposed a model to simulate the changes in the rate of earthquake production caused by stress changes applied to an infinite population on nucleating patches modeled through a rate-and state-dependent friction law. This model has been discussed by a theoretical point of view (see Gomberg 2005-a and references therein) and widely applied to different tectonic areas (Toda et al., 1998 and 2005; Dieterich et al., 2000; Gross, 2001; Toda and Stein, 2003; Catalli et al., 2008; Llenos et al., 2009 among many others).
- According to the Dieterich model, seismicity rate changes depend on the amplitude of the stress perturbation, the physical constitutive properties of faults represented by the parameter  $A\sigma$  (where A is the constitutive parameter controlling the direct effect of friction in the rate and state formulation and  $\sigma$  is the effective normal stress), the stressing rate as well as by the **background** seismicity rate of the study area.
- The Dieterich (1994) model has been proposed as a reliable physics-based approach to forecast seismicity rate changes and to compute earthquake probability changes (Toda

and Stein, 2003; Toda et al., 2005). It has also been proposed as the key ingredient of approaches aimed at evaluating the change in probability of occurrence of a large earth-quake on a specific fault caused by the coseismic stress changes generated by previous earthquakes occurred nearby (Stein et al., 1997; Parsons et al., 2000). This latter issue is still controversially debated within the scientific community, since different opinions exist concerning the actual capability of evaluating the changes in single-fault earthquake probability through a model assuming an infinite population of nucleation patches (see Hardebeck, 2004; Gomberg et al, 2005-b).

In the present paper we only mention the problem of computing aftershock probability through seismicity rate changes, because our focus is on computing seismicity
rate changes caused by coseismic stress perturbations. We do not discuss here the
problem of the reliable assessment of time-dependent earthquake probabilities for main
shocks through renewal approaches. Our main goal is to discuss the ability to forecast
seismicity rate changes through a physics-based model, in order to assess its relevance
for society.

This paper presents the results of research activities matured in the framework of two projects, namely NERIES (Network of Research Infrastructures

for European Seismology, www.neries-eu.org) and SAFER (Seismic Early
Warning for Europe, www.saferproject.net), funded by European Community within the sixth framework program. We have faced the challenging task
to perform a retrospective testing experiment to forecast aftershocks patterns
using the 1992 Landers earthquake as a case study. While Hainzl et al. (2009)
have studied the problem of aftershock modeling taking into account the vari-

ability caused by uncertainties of computed stress perturbations, the goal of
the present manuscript is to understand the role of the main physical input parameters in forecasting seismicity rate changes through the Dieterich's
physics-based model. This sensitivity study is particularly important in order
to perform a retrospective validation, which requires an accurate analysis of
the variability and the estimate of best model parameters. The result of a
retrospective test of stress-based models in comparison to purely statistical
models is presented in the follow up paper by Woessner et al. (2009) for the
1992 Landers earthquake sequence.

# 2. Methodology

In this section we summarize the methodologies commonly adopted to compute Coulomb stress changes and to forecast seismicity rate changes through the Dieterich's model. The main goal is to point out the most important physical parameters that have to be constrained in order to perform robust applications to real study cases taking into account the correlation between the model parameters.

#### 2.1. Computing Coulomb stress changes

Coulomb stress changes ( $\Delta CFF$ ) are calculated through the following relation:

$$\Delta CFF = \Delta \tau + \mu \cdot (\Delta \sigma_n + \Delta P) \tag{1}$$

where  $\Delta \tau$  is the shear stress in the direction of slip on the assumed causative fault plane,  $\Delta \sigma_n$  is the normal stress changes (positive for unclamping or extension),  $\mu$  is the friction coefficient and  $\Delta P$  is the pore pressure change (see Harris, 1998; King and Cocco, 2001). The relation used to compute the coseismic pore pressure changes distinguishes the constant apparent friction model from the isotropic poroelastic model (Cocco and Rice, 2002). According to the former model, pore pressure changes depend on the normal stress changes  $\Delta P = -B\Delta\sigma_n$ , where B is the Skempton coefficient which varies between 0 and 1 (Beeler et al., 2000; Cocco and Rice, 2002 and references therein). Therefore, using this model, equation (1) can be written as

$$\Delta CFF = \Delta \tau + \mu' \cdot \Delta \sigma_n \tag{2}$$

where  $\mu' = \mu(1-B)$  is usually called the effective friction coefficient. On the contrary, the isotropic poroelastic model assumes that pore pressure changes depend on the volumetric stress changes (first invariant of the stress perturbation tensor)  $\Delta P = -B(\Delta \sigma_{kk}/3)$ , and therefore equation (1) becomes:

$$\Delta CFF = \Delta \tau + \mu \cdot (\Delta \sigma_n - B \frac{\Delta \sigma_{kk}}{3}). \tag{3}$$

Thus, in both equations (2) and (3) the values of the friction and the Skempton coefficients have to be adopted in order to compute stress perturbations. Cocco and Rice
(2002) discussed the difficulties in distinguishing between these two models also in realistic complex fault zones with inelastic or anisotropic properties. Beeler et al. (2000)
suggested using equation (3) because it is more general and applicable to different tectonic areas. This represents a first source of variability in computing static
coseismic stress changes, which is commonly not considered since equation (2)
is widely adopted to compute seismicity rate changes (see Beeler et al., 2000).

# 2.2. Resolving Coulomb stress changes onto receiver faults

The calculation of Coulomb stress changes requires **the definition of** the geometry and the faulting mechanism of the target faults **upon which** stress perturbations are resolved.

Two approaches are commonly adopted; the first one relies on resolving stress changes onto a prescribed faulting mechanism (that is, to assign strike, dip and rake angles of the target faults). This means that fault geometry and slip direction are input parameters of stress interaction simulations. McCloskey et al. (2003) proposed using geological constraints in order to calculate Coulomb stress perturbations for forecasting the spatial pattern of seismicity. However, this strategy does not always seem to be applicable, due to the complexity of fault systems for instance, as pointed out by Nostro et al. (2005) in their application to the 1997 Umbria-Marche (Italy) seismic sequence. The 100 second approach relies on the calculation of the optimally oriented planes for Coulomb 101 failure (often called OOPs). In this case, instead of assigning the strike, dip and rake 102 angles of the receiver faults, we have to assign the magnitude and the orientation of the 103 principal axes of the regional stress field  $\sigma_{ij}^r$  (see King and Cocco, 2001, and references 104 therein). The optimally oriented planes are identified at each grid point of the numerical computation by finding the values of strike, dip and rake that maximize the total stress 106 tensor defined as  $\sigma_{ij}^{tot} = \sigma_{ij}^r + \Delta \sigma_{ij}$ , where  $\Delta \sigma_{ij}$  is the coseismic stress perturbation. After assigning the absolute values of the principal stress components and the orientation of the stress tensor (trend and plunge of each axis), two equivalent OOPs are obtained at each 109 node of the **3D** grid. 110

The predicted focal mechanisms associated with the OOPs strongly depend on the orientation and magnitude of the regional stress field. Therefore, Coulomb stress changes computed for OOPs are associated with theoretical focal mechanisms, which might differ from real fault plane solutions. This might be the case also for stress changes resolved onto

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prescribed receiver faults, although in this latter case constraints from structural geology

and a direct control of the expected faulting mechanisms might reduce the variability.

Therefore, we remark here that resolving stress changes on receiver faults,
through either the identification of prescribed receivers or the calculation of
OOPs, requires to assign further input parameters. As we will discuss in
the following the choice of one of these two simulation strategies will lead
to completely different patterns of Coulomb stress perturbations, particularly

### 2.3. Computing the rate of earthquake production

near the causative faults.

We briefly describe here the Dieterich (1994) model to compute the changes in the rate of earthquake production caused by coseismic stress perturbations. The seismicity rate R after the application of a stress perturbation is a function of the state variable  $\gamma$ , stressing rate  $\dot{\tau}$  and the **background** seismicity rate r (see also Toda and Stein, 2003 and Toda et al., 2005):

$$R = \frac{r}{\gamma \dot{\tau}}.\tag{4}$$

Under a constant stressing **rate without** stress perturbations, the state variable is at the steady state and takes the value

$$\gamma_0 = \frac{1}{\dot{\tau}},\tag{5}$$

which according to (4) gives R = r. This implies that, in absence of any stress perturbation, the seismicity rate at the steady state is given by the **background** rate of earthquake production. We assume here that the stressing rate does not change before and after the main shock, being equal to  $\dot{\tau}$ . Following Dieterich (1994) the rate R can be

interpreted as a statistical representation of the expected rate of earthquake production in a given magnitude range. An applied stress perturbation to the fault population modifies the seismicity rate through the evolution of the state variable given by:

$$\gamma_n = \gamma_{n-1} exp\left(\frac{-\mathbf{S}}{A\sigma}\right). \tag{6}$$

where  $\gamma_{n-1}$  and  $\gamma_n$  are the values of the state variable just before and after the applied stress change (S), respectively.  $A\sigma$  is the constitutive parameter of the rate- and state-dependent law governing fault friction; we remind here that  $\sigma$  is the effective normal stress also named  $\sigma_{eff}$  in the following of the text. The evolution of state variable is governed by the following law:

$$d\gamma = \frac{1}{A\sigma} \left[ dt - \gamma S \right]. \tag{7}$$

where S in (6) and (7) is the "modified" Coulomb stress change  $S = \Delta CFF$  and it is given by (Dieterich et al., 2000; Catalli et al., 2008 and references therein):

$$S = \Delta CFF = \Delta \tau + (\mu - \alpha) \cdot \Delta \sigma_{eff} = \Delta \tau + \mu_{eff} \cdot \Delta \sigma_{eff}$$
 (8)

where  $\Delta \sigma_{eff} = (\Delta \sigma_n + \Delta P)$ ,  $\mu_{eff} = (\mu - \alpha)$ , where  $\alpha$  is the positive **non-dimensional** parameter controlling the normal stress changes in the Linker and Dieterich (1992) constitutive law. This parameter is necessary to account for normal stress changes in the rateand state-dependent frictional approach, and consequently the parameter multiplying the effective normal stress changes in (8) is not the friction coefficient as usually assumed in Coulomb stress computations [see (1) and also Harris, 1998].

A positive stress perturbation caused by an earthquake occurred nearby will decrease the state variable  $\gamma$ , so that the target fault slips at higher rate. A drop in the state variable results in an increase in the seismicity rate. According to the Dieterich (1994) model, the state variable  $\gamma$  increases with time after the stress changes according to

$$\gamma_{n+1} = \left(\gamma_n - \frac{1}{\dot{\tau}}\right) \cdot exp\left(\frac{-\Delta t\dot{\tau}}{A\sigma}\right) + \frac{1}{\dot{\tau}},\tag{9}$$

where  $\Delta t$  is the time elapsed after the stress perturbation and  $\gamma_n$  is calculated through (6).

### 3. Impact of model parameters

The calculation of seismicity rate changes caused by coseismic stress perturbations re-131 quires the choice of the following main input parameters: the amplitude of the Coulomb 132 stress perturbation (which depends on other parameters as described in sections 133 2.1 and 2.2), the constitutive parameter  $A\sigma$ , the stressing rate  $\dot{\tau}$  and the background 134 seismicity rate r. In this section we focus on the last three input parameters describ-135 ing the rate- and state-dependent model to forecast seismicity rate changes. Hainzl et 136 al. (2009) have discussed the impact of uncertainties and variability of coseis-137 mic stress change amplitudes. We solely emphasize here that Coulomb stress changes 138 depend on several "a priori" input parameters such as the friction and the Skempton 139 coefficients, and the  $\alpha$  parameter of the rate and state model (see equation 8). According to several authors (see Harris, 1998; King and Cocco, 2001; and Catalli et al., 2008) the effect of the friction coefficient on the stress perturbation and the seismicity rate change patterns is usually modest. On the contrary, the choice of the poroelastic model can be of relevance for computing Coulomb stress changes (equations 2 and 3). We also point out that, according to equation (8), the effective normal stress changes are multiplied by an effective coefficient of friction which depends on both the friction coefficient and the  $\alpha$  parameter.

# 3.1. The background seismicity rate

In this section we discuss the definition of the **background seismicity rate** as well as its impact on the computed seismicity rate changes through the Dieterich (1994) model. This model assumes that before the application of a stress perturbation the 150 state variable  $\gamma$  is at a steady state, which means that it does not change 151 with time. Indeed, it is assumed that this initial value  $(\gamma_o)$  is equal to the 152 inverse of the stressing rate (which is taken constant in time in the most 153 common formulation of the Dieterich model); therefore, according to (4) the 154 seismicity rate before the application of the stress perturbation is equal to the 155 background rate r. We describe such a background rate through a stationary 156 seismicity rate. The background seismicity rate r is an important variable in any fault 157 population model. The background seismicity rate is the rate of earthquake production in absence of any stress perturbation and it is associated with a spatially non-uniform stationary process (see for instance Toda et al., 2005). According to this definition, background events are expected to occur independently of each other (i.e., the nucleating patches do not interact), and therefore the background seismicity rate can be also considered as a time independent Poisson process. 163 In the present study, we refer to the "background seismicity" rate as a time independent smoothed seismicity rate computed in a prescribed time window using a declustered catalog.

Different procedures can be applied for declustering a seismic catalog. In the present study we adopt the background rate measured through the ETAS model (Ogata, 1988; 1998) following the method proposed by Zhuang et al. (2002). The ETAS model defines

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where  $\mu(x,y)$  is the time independent spatially non-uniform background seismicity rate,

the seismicity rate at time t and location (x, y) as the sum of two contributions

$$\lambda(t, x, y) = \mu(x, y) + \sum_{i: t_i < t} \frac{K e^{\tilde{\alpha}(M_i - M_c)}}{(t - t_i + c)^p} \frac{c_{dq}}{[(x - x_i)^2 + (y - y_i)^2 + d^2]^q}.$$
 (10)

K and  $\tilde{\alpha}$  are the productivity parameters related to the numbers of events triggered by 168 each earthquake, c is a time constant and the exponent p controlling the decay of the 169 sequence.  $M_c$  is the **completeness** magnitude, while i identifies the triggering event 170 occurring at time  $t_i$  with magnitude  $M_i$ . d and q are the parameters characterizing the 171 spatial distribution of triggered events,  $\sqrt{(x-x_i)^2+(y-y_i)^2}$  is the distance between the 172 location (x, y) and the epicenter of the i-th earthquake  $(x_i, y_i)$  and  $c_{dq}$  is a normalization 173 factor. Therefore, using the ETAS model we can measure the spatially non-uniform (i.e., 174 clustered in space) background seismicity rate as  $r = \mu(x, y)$ . 175 The definition and the measure of a reference or a background seismicity rate 176 is still controversial (Hainzl and Ogata, 2005; Lombardi et al., 2006; Lombardi and Mar-177 zocchi, 2007) and different approaches are used in the literature. Catalli et al. (2008) for instance adopted a reference seismicity rate computed by smoothing seismicity on a prescribed time window using a complete (undeclustered) catalog in order to model seismicity rate changes through the Dieterich approach. We use this definition in the present work and we refer to the "reference seismicity" rate as a time independent smoothed seismicity rate computed by using an undeclustered catalog. Thus, contrary to the background, the reference seismicity rate contains all the sequences and the triggered events within the selected time window. It is important to point out that in this latter 186 case the reference seismicity rate cannot be considered as the rate of earthquake produc-

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tion in absence of any stress perturbation. To estimate in this way a stationary mean

rate, the time period selected for smoothing the seismicity has to be longer than the 189 duration of seismic sequences within the adopted time interval. The choice of the time 190 window is **relevant** for both the computed background and the reference seismicity rates 191 (Marsan, 2003; Marsan and Nalbant, 2005), but the latter is certainly more affected by 192 this subjective choice and by the temporal variability of completeness magnitude. 193 Figure 1 shows the calculation of the reference (r(x,y), left panel) and background 194  $(\mu(x,y), \text{ right panel})$  seismicity rates computed for the area struck by the 1992 Landers 195 earthquake. The reference seismicity rate has been computed by smoothing the seismic-196 ity in the 8 years (1984-1991) preceding the 1992 main shock using the Frankel (1995) 197 algorithm. The minimum magnitude used for smoothing is 3.0, the maximum depth 30 198 km and the correlation distance 5 km; the adopted b-value is equal to 0.91. We use in this study the same values adopted in the retrospective forecasting test described by Woessner et al. (2009). The mean value of the reference seismicity rate is  $3 \cdot 10^{-6}$  events/day  $\cdot km^2$ . The background seismicity rate has been computed through equation (10) using the same minimum magnitude and time period. The mean value of the background seismicity rate is  $1.5 \cdot 10^{-6}$  events/day  $\cdot km^2$ . It is evident from Figure 1 204 that both the pattern and the absolute values of seismicity rates are different and we will show below how this difference affects the predicted seismicity rate changes. 206

Figure 2 displays the map of the difference at each grid point between the computed reference (left panel) or background (right panel) seismicity rate and their average value measured for the whole area. This figure **shows** that both the background and the reference seismicity rates are larger than their associated average values in nearly the

same area. As expected the variability of the reference seismicity rate is larger than that of the background rate. This figure depicts that in both cases the Big Bear 212 aftershock lies in the area of largest positive difference between spatially non-213 uniform seismicity rates and their average values. On the contrary, east of 214 the causative fault system, where the Hector Mine earthquake occurred in 215 1994, this difference is negative, which means that the non-uniform rates are 216 smaller than their mean values (note that we are analyzing here the seismicity 217 before the 1992 Landers main shock). This raises the question if a uniform 218 background seismicity rate is a good assumption to forecast seismicity rate 219 changes. The resulting average rates for the whole area correspond to 0.176 and 0.086 220 events/day for the reference and the background seismicity rate, respectively. 221

In many studies and applications (see Gomberg et al., 2005-a; Toda and Stein, 2003, among many others) the background seismicity rate is assumed spatially uniform. We have computed the seismicity rate changes caused by the 1992 Landers main shock and the Big Bear largest aftershock using the mean values of both the reference and the background seismicity rates given above. In this case, the ratio between the forecasted cumulative number of triggered earthquakes for both models (we have kept all the other pa-227 rameters  $A\sigma$  and  $\dot{\tau}$  fixed and equal to 0.04 MPa and  $5.6 \cdot 10^{-6}$  MPa/day; these values are consistent with those proposed by Toda et al. 2005) is nearly equal 229 to the corresponding ratio between the values of the estimated background and reference 230 seismicity rates (see Figure 3 dashed curves). A different application performed 231 by using spatially inhomogeneous seismicity rates shows that the difference 232 between the seismicity rate forecast performed by using r(x,y) for the Lan-233

ders and Big Bear shocks is significantly larger than that obtained by using
the non-uniform background rate  $\mu(x,y)$  (see Figure 3 solid curves) as well as
those inferred by adopting the spatially uniform mean values (dashed curves).
However, it is important to emphasize that this result cannot be extrapolated
to other areas.

We have performed similar calculations to study the 1997 Kagoshima 239 (Japan) earthquake pair (see Toda and Stein, 2003). Two strike slip earth-240 quakes (M  $\sim$  6) struck the Kagoshima prefecture (Japan) in 1997; they were 241 just 4 km and 48 days apart and provided a good test to study stress interac-242 tions and one of the first attempts to estimate aftershock probabilities (Toda 243 and Stein, 2003). We have computed the background seismicity rate by applying the ETAS approach to the seismic catalog provided by JMA and the reference seismicity rate by smoothing the seismicity in the 10 years preceding the first Kagoshima main shock. The minimum magnitude and the maximum depth for smoothing seismicity are 2.3 and 40 km, respectively. The adopted b-value for this area is 0.9. Figure 4 shows the spatial distribution of the reference (left panel) and background (right panel) seismicity rates for the 250 Kagoshima area, which displays evident differences. The mean value of the reference seismicity rate is  $7.5 \cdot 10^{-6}$  events/day  $\cdot km^2$  and that one of the back-252 ground seismicity rate is  $2.5 \cdot 10^{-6}$  events/day  $\cdot km^2$ . We have computed the 253 predicted seismicity rate changes caused by the two main shocks using both 254 the mean and the spatially variable reference and background rates. 255 results of the numerical simulations for Kagoshima reveal just the opposite 256

outcome than those for Landers (see Figure 5). The seismicity rate forecast performed by using the uniform reference rate is larger than that obtained for the non-uniform reference rate and the opposite is found for forecasted seismicity rate changes inferred by using the background rates (constant and spatially non-uniform).

This apparent paradox can be explained by considering that the signs of the 262 Coulomb stress changes affect the computed cumulative number of triggered aftershocks. 263 A high reference seismicity rate in a stress shadow area will not produce any enhanced seis-264 micity rate changes. On the contrary, a higher reference rate in a region of enhanced 265 Coulomb stress will produce a significant increase of seismicity rate. Therefore, the 266 expected seismicity rate change will strongly depend on the spatial correlation between applied stress changes and the background or reference seismicity rates. In particular, high seismicity rate changes are expected for positive correlations, but irrelevant changes of the rate of earthquake production for anti-correlations. Therefore, the opposite results found for the 1992 Landers and the 1997 Kagoshima earthquakes depend on the different correlation between the spatial pattern of Coulomb stress changes and seismicity rate changes. 273

Figure 6 shows the map of Coulomb stress changes computed at 7.5 km depth (mid of
the seismogenic layer) after the 1992 Landers main shock (left panel) and after the main
shock and the Big Bear aftershock (right panel) using equation (2) and resolving stress
changes onto prescribed target vertical faults striking N330° (dip 90°) with a rake angle
of 180°. The slip distribution for the Landers earthquake used for these calculations is
taken from Wald and Heaton (1994), while for the Big Bear earthquake is taken from

Jones and Hough (1995). The stress changes are computed for:  $\alpha = 0.25$ ,  $\mu = 0.75$  and B = 0.47 (which yields  $\mu' = 0.4$ ). Using these stress changes we have calculated the seismicity rate changes through equations (4), (6) and (9). A visual comparison between figures 2 and 6 reveals that a large area with high background or reference seismicity rates lies in stress shadows.

Although non-uniform background seismicity can be expected from a physical point of
view, the application of inhomogeneous reference or background models should be taken
with care. First, an appropriate estimation of the spatial seismicity fluctuations requires
a better data coverage than is available in many applications. Second, because
of the above mentioned dependence on the spatial correlation, non-uniform
background models are more sensitive to the calculated stress changes, which
are known only with large uncertainties due to uncertain slip distribution, fault
geometry and small-scale stress heterogeneities (see Sudhaus and Jónsson, 2009;
Hainzl et al., 2009, for further discussion).

#### 3.2. $A\sigma$ and the stressing rate

The effects of **individual** input parameters in the Dieterich model have been previously discussed in the literature (see Belardinelli et al., 1999; Toda and Stein, 2003; Catalli et al., 2008, and references therein). Indeed, it is well known that  $A\sigma$  controls the instantaneous increase of the seismicity rate: the smaller the  $A\sigma$  value the larger the seismicity rate change. Equations (6) and (7) show that this parameter controls both the instantaneous change and the following evolution of the state variable  $\gamma$ . Console et al. (2006) and Catalli et al. (2008) have shown that the total number of triggered events over infinite times does not depend on  $A\sigma$ . Indeed, the time integral of the net rate of promoted

seismicity R'(t) = R(t) - r over infinite times is given by

$$N_{\infty} = \int_0^{+\infty} R'(t)dt = \frac{r}{\dot{\tau}}S. \tag{11}$$

According to this relation the net number,  $N_{\infty}$ , of promoted earthquakes over infinite times depends only on the background rate, the stressing rate and the Coulomb stress perturbation.

The role of the stressing rate on the predicted seismicity rate changes has been already discussed in the literature (see Toda et al., 2002; Llenos et al., 2009). It is evident from equations (5) and (9) that the stressing rate  $\dot{\tau}$  controls the state variable evolution before and after the stress perturbation. The stressing rate is of particular importance for modeling the seismicity rate changes and the Omori-like aftershock decay because it controls for a given  $A\sigma$  the duration of the aftershock sequence. Indeed, one of the relevant implications of the Dieterich (1994) approach is that the aftershock duration  $t_a$  does not depend on the magnitude of the main shock and it is controlled by

$$t_a = \frac{A\sigma}{\dot{\tau}}.\tag{12}$$

Thus, the rate-and-state dependent friction model for seismicity rate changes can equivalent alently be stated by the three parameters  $r, A\sigma, t_a$  instead of  $r, A\sigma, \dot{\tau}$ . Finally, despite equation (11) predicts that the total number of triggered events over infinite times does not depend on  $A\sigma$ , we emphasize that for time periods shorter than  $t_a$ , the adopted  $A\sigma$  value affects the cumulative number of triggered earthquakes.

## 4. Correlations between parameters

The model parameters are strongly correlated for physical and statistical reasons. Based on the the balance of seismic moment release, Catalli et al. (2008) deduced an analytically approximate relation to link the stressing rate to the reference seismicity rate, under the assumption that r accounts for all the events in a given magnitude range without declustering:

$$\dot{\tau} \cong \frac{rM_0^*}{W_{seis}} \frac{b}{1.5 - b} \left( 10^{(1.5 - b)(M_{max} - M^*)} - 1 \right) \tag{13}$$

where r is the reference seismicity rate,  $M_0^*$  the seismic moment of the magnitude  $M^*$ 303 earthquake,  $W_{seis}$  the thickness of the seismogenic zone (Catalli et al., 2008), b is the 304 parameter of the Gutenberg-Richter distribution,  $M_{max}$  and  $M^*$  are the maximum and 305 minimum magnitudes, respectively. Note that in (13) the reference seismicity r(x,y) must 306 include all the earthquakes in the given magnitude range to estimate the stressing rate 307 through the proposed approximate relation. We emphasize that this relation suggests the 308 input parameters  $\dot{\tau}$  and r of the physics-based model to be linearly correlated. According to (12) and (13) a spatially variable stressing rate (inferred from a spatially nonuniform reference seismicity rate) implies a spatially variable aftershock duration 311 time  $t_a$ . This in turns impacts the forecasted seismicity rate changes.

In addition, relation (13) and equation (11) predict that the total number of triggered earthquakes over infinite times only depends on the stress change amplitude. This
implies that assessing the variability of Coulomb stress changes is extremely important
(Hainzl et al., 2009).

Even stronger correlations between the parameters are obtained from a statistical point of view if early aftershock data are available and are used to constrain input pa-

rameters for forecasting attempts. We demonstrate in the following that in the
case of an observationally constrained aftershock decay, the background rate r and the
aftershock relaxation time  $t_a$  are strongly correlated to **determine** the aftershock productivity. This implies that according to (12) and (13) all the three main input parameters
of the rate and state approach are correlated.

According to the Dieterich (1994) model, the seismicity rate changes caused by a stress perturbation S (at time t = 0) can be also written in the following way, which is equivalent to (4),

$$R = \frac{r}{1 + \left[exp\left(-\frac{S}{A\sigma}\right) - 1\right] \cdot exp\left(-\frac{t\dot{\tau}}{A\sigma}\right)}.$$
 (14)

Using relation (12) and defining  $\psi = exp\left(-\frac{S}{A\sigma}\right)$ , we can write (14) as

$$R = \frac{r}{1 + (\psi - 1) \cdot exp\left(-\frac{t}{t_a}\right)},\tag{15}$$

which for  $t \ll t_a$  becomes

$$R \approx \frac{r}{1 + (\psi - 1) \cdot \left(1 - \frac{t}{t_a}\right)} = \frac{r}{\psi - (\psi - 1) \cdot \left(\frac{t}{t_a}\right)}.$$
 (16)

After simple rearrangements (16) is written as

$$R \approx \frac{\frac{rt_a}{1-\psi}}{\left[\frac{\psi t_a}{1-\psi} + t\right]},\tag{17}$$

which is the Omori law with a p-value equal to 1, the c-value is given by

$$c = \psi t_a / (1 - \psi) \tag{18}$$

and the productivity by

$$K = rt_a/(1-\psi) \tag{19}$$

These equations show that the productivity depends not only on the stressing

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rate (see Llenos et al., 2009), but also on the background rate and the parameter  $A\sigma$ . However, if equation (13) holds and  $\dot{\tau}$  is linearly proportional to  $r, \frac{r}{\dot{\tau}}$ becomes constant and the productivity only depends on  $A\sigma$ .

If the stress jump is large compared to the parameter  $A\sigma$ , then  $1-\psi\approx 1$  and the 328 Omori parameters become  $c \simeq \exp(-\Delta S/A\sigma) \cdot t_a$  and  $K \simeq rt_a$  (see Dieterich, 1994). 329 For  $c < t \ll t_a$ , the rate decays according to  $R \approx K/t$  and thus if the  $t_a$  is changed by a 330 factor  $\kappa$ , the background rate r has to be changed by a factor  $1/\kappa$  to fit the same observed 331 decay. To get a similar fit on short time scales  $(t \ll t_a)$ , the c-value should be also the 332 same. Our calculations imply that for a spatially uniform background rate r and tectonic 333 loading  $\dot{\tau}$ , the aftershock duration  $t_a$  is also uniform but not the productivity K and the 334 c-value. The latter parameter **defines** the delay before the onset of the 1/t-decay. The 335 c parameter and the productivity depend on the  $\Delta CFF$ -value of the stress changes which will be spatially non-uniform and distance dependent. This implies that K and c will depend on the spatial coordinates (i.e., spatially variable) due to the spatial fluctuations of  $(1 - \psi)$  around 1 and  $\psi$  above zero, respectively. The superposition of aftershock sequences with c-values differing in this way has previously shown to result in apparent p values < 1 for an exponential stress distribution [Helmstetter & Shaw 2006]. Smaller p-values at the beginning of aftershock sequences have been reported in several previous studies that use high-resolution waveform data to 343 quantify early aftershocks (Peng et al., 2006, 2007; Enescu et al., 2007; 2009). 344

Using the constraints from observations of the earliest aftershocks, namely the K and c-value, the only free parameter that remains in (14) is  $t_a$ . Taking equations (18) and (20), we can express r and  $\psi$  as a function of the aftershock duration time

 $t_a$ ,  $\psi = c/(c+t_a)$  and  $r = K/(c+t_a)$ , and we get

$$R(t) = \frac{K}{c + t_a - t_a \exp\left(-\frac{t}{t_a}\right)},\tag{20}$$

which holds for  $t < t_a$ .

Figure 7 summarizes the correlation between input parameters for the rate and state model. Indeed, this figure shows that, locally (i.e., for a given value of stress perturbation), almost the same decay caused by a positive or a negative stress step on short and intermediate time scales is achieved for different combinations of input parameters which follow the functional dependencies:  $r \cdot t_a = const$  and  $\psi \cdot t_a = const$ .

Thus, if early aftershock observations are available to constrain the seismicity decay, the frictional parameters should not be set independently but **rather** in accordance with the above mentioned relations. Aftershock forecasts **that take** these correlations implicitly into account by **maximizing** the likelihood function for the **earliest** aftershocks **are** discussed for the Landers case by Hainzl et al. (2009).

### 5. Forecasting seismicity rate changes

In this section we **present** as an example simulations of the rate of earthquake production caused by the 1992 Landers **earthquake**. **We compare** and discuss the model predictions based on stress changes calculated by resolving stress onto prescribed receivers as
well as onto OOPs. **Figure 8** displays the **predicted** seismicity rate changes **computed**from mean Coulomb stress perturbations, averaged between stress changes
estimated at 7 and 11 km depth, both immediately after the main shock (panels a
and b) and 30 days after it (panels c and d); thus, the latter includes also the stress perturbations caused by the Big Bear aftershock. The calculations are performed **using** the

Dieterich (1994) model resolving stress changes onto prescribed receivers oriented as those used for Figure 4 (a and c) as well as onto OOPs associated with a horizontal  $\sigma_1$  oriented N7°, a vertical  $\sigma_2$  and a horizontal  $\sigma_3$  (b and d). Here we have assumed **the** uniform background seismicity rate (0.086 events/day, corresponding to  $1.5 \cdot 10^{-6}$  events/day km²) shown in Figure 1, a constant stressing rate ( $2 \cdot 10^{-6}$  MPa/day) and a value for  $A\sigma$  equal to 0.02 MPa. As discussed in the previous section several combinations of these parameters can yield the same forecasts of seismicity rate if the proposed scaling is respected.

This figure confirms that when the only difference is resolution of stress perturbations onto prescribed receivers or OOPs a completely different pattern of forecasted
rate of earthquake production may result. This is evident close to the causative faults,
where seismicity shadows predicted by the model for stress perturbations resolved onto
prescribed receivers become enhanced seismicity rates for OOPs model. In order to
further point out this finding, we have shown in Figure 9 the difference between the seismicity rate changes computed for the prescribed receivers and
the OOPs models. As expected the largest difference is found around the
causative faults.

The difference between forecasted rates of earthquake production computed adopting
OOPs and prescribed receivers is evident also in the aftershock decay following the main
shock. Figure 10 shows the decay rate of aftershocks predicted through mean stress
changes (averaged between values estimated at 7 and 11 km depth, as in Figure 8) resolved onto OOPs (red curves) and onto prescribed receivers (blue curves).
Dashed curves display the aftershock decay in areas which experienced mean stress
changes smaller than 0.5 MPa, while solid curves show the whole aftershock decay for

unconstrained stress perturbations. This figure suggests that the difference decreases for increasing time after the main shock. The peak in the aftershock decay shown in Figure 10 is the seismicity rate change caused by the Big Bear aftershock.

In some previous studies (Toda et al., 2003; Steacy et al., 2004) the authors proposed

excluding seismicity close to the causative faults in order to improve the forecasted

seismicity rate changes. Figure 10 shows the consequences of limiting the computed

Coulomb stress changes, which indirectly corresponds to excluding near-fault regions.

This figure suggests that the choice of this simulation strategy has important implications

on the predicted temporal decay of early aftershocks.

#### 6. Discussions and conclusive remarks

The application of physics-based models to near real-time forecast attempts requires a robust validation through retrospective modeling and statistical tests. In order to perform these applications the input model parameters have to be constrained a priori based on the available data and information for the target study area. **Previous studies** constrain model parameters with different strategies and **sometimes** without a comprehensive analysis of their correlation. In this study we aim to understand the impact of physical model parameters in forecasting seismicity rate changes.

We use the Dieterich (1994) model which is widely used to simulate the changes in the rate of earthquake production caused by stress changes. In this study we focus on the main input parameters of the Dieterich's approach: the physical constitutive properties of faults (represented by the parameter  $A\sigma$ ), the stressing rate and the reference seismicity rate of the study area. **Hainzl et al. (2009) have discussed** the effect of the variability of the amplitude of stress perturbations as well as the effect of small-scale heterogeneities characterizing the stress change pattern near the causative faults (see also Marsan,
2006; Helmstetter and Shaw, 2006).

A number of input parameters have to be constrained to compute stress perturbations 411 and the associated seismicity rate changes. These model parameters are strongly corre-412 lated. Our inferred correlations demonstrate that different sets of model parameters can 413 yield the same rate of aftershock decay. In particular, the rate-and-state dependent fric-414 tion model for seismicity rate changes can equivalently be formulated in terms of the three 415 parameters  $r, A\sigma, \dot{\tau}$ , as well as  $r, A\sigma, t_a$ . One relevant implication is that the inferred cor-416 relations do not allow the physical interpretation of adopted values of model parameters. 417 In other words, it is difficult to compare values of  $A\sigma$  parameter inferred from modeling 418 the rate of earthquake production with those resulting from laboratory experiments of 419 rock friction. At the same time, it is difficult to constrain  $A\sigma$  from the aftershock decay **parameter**  $t_a$ , as commonly done in the literature, because this estimate depends on the correlation with the stressing rate  $\dot{\tau}$ . 422

An important choice is the definition of the background seismicity rate, in particular,
the use of declustered or non-declustered precursory seismicity and its spatial variability.

Despite the use of spatially variable reference or background seismicity rates is physically
reasonable and corroborated by observations (see Toda and Stein, 2003; Zhuang et
al., 2002; Toda et al., 2005, among many others), the application of these
models is not straightforward because of the spatial correlation between seismicity rate and the pattern of calculated stress perturbations. Indeed, spatially non-uniform background models are more sensitive to the uncertainties
of slip distribution as well as to the heterogeneity of stress patterns. This can

discourage the adoption of non-uniform reference or background seismicity
rates to forecast the rate of earthquake production.

Assuming a constant background seismicity rate has also implications on 434 the stressing rate. Catalli et al. (2008) have used spatially variable stressing 435 rate patterns inferred from non-uniform reference seismicity rates through re-436 lation (13). However, this choice implies: (i) a dependence on the maximum 437 magnitude for the study area, (ii) a spatially variable  $t_a$ , (iii) the lack of a 438 depth dependence (since  $\dot{\tau}$  is computed from seismicity in the whole seismo-439 genic layer) and, finally, (iv) a correlation between two out of three input parameters of the Dieterich model (r and  $\dot{\tau}$  or  $t_a$ ). For these reasons, a con-441 stant stressing rate seems to be preferable together with a spatially uniform 442 reference seismicity rate. These considerations also suggest to conclude that using the background seismicity rate instead of the reference rate is a more effective assumption to forecast the rate of earthquake production. This will also guarantee to better satisfy the assumption of a stationary seismicity rate before the application of the stress perturbation.

Llenos et al. (2009) discuss the effect of temporal changes of stressing rate
caused by aseismic deformation and their effect to the background and the
aftershock rates. In agreement with these authors, we have shown in this study
that the aftershock productivity depends on the stressing rate (see equations
17 and 20). Llenos et al (2009) analyzed the rate of earthquake production
during several seismic swarms and concluded that the stressing rate transients
increase the background seismicity rate without affecting the clustered (i.e.,

triggered) seismicity rate. This contradicts the predictions of the Dieterich 455 (1994) model, when background seismicity and stressing rates are assumed to 456 be uncorrelated (as in numerous applications published in the literature). In 457 the present study, we investigate the rate of earthquake production following 458 a large earthquake. We assume that the stressing rate does not change before 459 and after the application of the stress perturbation. This also allows the use 460 of Coulomb stress changes (instead of shear stress perturbations) to model 461 the evolution of the gamma variable. Our results suggest that for aftershock 462 sequences the productivity depends on both the background seismicity and the 463 stressing rates (see equation 17) and that, because of the correlation between 464 model parameters, it is impossible to separate their contributions by analyzing 465 aftershock decay rates in real sequences.

The analysis of correlations among model parameters discussed in this study (equations 16 and 17) relies on the assumption that  $t \ll t_a$ . The inferred correlations are relevant for near-real time (i.e., short term) forecast attempts. Indeed, we have shown that these correlations hold at short time scales. However, the definition of "short" time scale depends on  $t_a$ . It has to be noted, however, that the predicted aftershock decay for longer 471 times (that is, when  $t \ll t_a$  does not hold) might deviate from the expected Omori law. 472 Finally, we emphasize that two alternative modeling strategies to resolve Coulomb stress 473 changes on target receivers (OOPs or prescribed receivers), which are both likely choices 474 for near real time applications, yield very different predictions of seismicity rate changes 475 (see Steacy et al., 2005b). In particular, these authors and Hainzl et al. (2009) 476 concluded that models that incorporate the regional stress field (i.e., OOPs) tend to pro-477

duce stress maps that best fit the observed spatial aftershock distribution. We emphasize,
however, that the improved ability to forecast seismicity rate changes may be achieved
renouncing to match the aftershock focal mechanisms. We also point out here that the
expected variations in modeled Coulomb stress changes through equations (2) and (3) represent a further contribution to the uncertainties in stress perturbation amplitudes. This
further suggests the need to include uncertainties and variability of stress amplitudes in
forecasting seismicity rate changes.

The results of the present study are of relevance to: (i) identify reliable strategies
for constraining model parameters for forecasting attempts; (ii) interpret the result of the
retrospective statistical tests (see Woessner et al., 2009); (iii) emphasize the necessity
of reducing the "a priori" choices to compute Coulomb stress perturbations.

Most of applications constrain model parameters from seismicity before the origin time
of the causative main shock, thus analyzing the background seismicity rate. However,
the results of this study suggest that early aftershocks, when available, can also be used to
constrain model parameters. This can be done, for instance, by computing background stationary seismicity rate through the ETAS approach. This strategy is
novel and original and relies on the acknowledgment that model parameters have to be
constrained taking into account their correlations and the scaling relations proposed in
this study.

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# Figure Captions

**Figure 1.** Reference r(x,y) (a) and background  $\mu(x,y)$  (b) seismicity rates computed 623 for the study area. Red dots show the epicenter of the 1992 Landers mainshock and the Big Bear aftershock. The reference seismicity rate is computed in the 8 years preceding 625 the 1992 main shock (1984-1991) using the Frankel algorithm for smoothing the seismicity of a complete (undeclustered) catalog (see text for the details of these calcualtions). The 627 background seismicity rate has been computed through equation (10) and the ETAS 628 approach. The black dots in this figure indicate the epicenters of earthquakes 629 occurred before the 1992 Landers main shock, while the gray dots depicts the 630 aftershock locations. 631

Figure 2. Difference between the spatially non-uniform seismicity rate and the average value measured for the whole area: (a) displays the difference for the reference seismicity rate, while (b) shows that one for the background seismicity rate. Red and blue colors indicate a local value larger or smaller than the average value, respectively.

Figure 3. Cumulative number of events calculated through the Dieterch (1994) model assuming a spatially non-uniform reference and background seismicity rates (solid curves) and a constant reference and background seismicity rates corresponding to their average values (dashed curves). For all these calculations the stressing rate is constant  $\dot{\tau} = 5.6 \cdot 10^{-6}$  MPa/day and  $A\sigma = 0.04$  MPa. Blue curves identify the calculations performed

by adopting the reference seismicity rates and green curves shows those performed by using the background seismicity rate.

Figure 4. Reference r(x,y) (a) and background  $\mu(x,y)$  (b) seismicity rates computed for the 1997 Kagoshima prefecture (Japan) earthquake. The red dots show the epicenter of the two strike slip earthquakes (M  $\sim$  6) occurred 48 days apart from each other. The background seismicity rate is computed by applying the ETAS approach to the seismic catalog provided by JMA, while the reference seismicity rate by smoothing the seismicity in the 10 years preceding the first Kagoshima main shock (see text for the details of these calcualtions). The black dots in this figure indicate the epicenters of earthquakes occurred before the first main shock, while the gray dots depicts the aftershock locations.

Figure 5. Cumulative number of events calculated through the Dieterch (1994) model assuming a spatially non-uniform reference and background seismicity rates (solid curves) and a constant reference and background seismicity rates corresponding to their average values (dashed curves) for the 1997 Kagoshima earthquake. For all these calculations the stressing rate is constant  $\dot{\tau} = 3.0 \cdot 10^{-6}$  MPa/day and  $A\sigma = 0.04$  MPa (Toda and Stein, 2003). Blue curves identify the calculations performed by adopting the reference seismicity rates and green curves shows those performed by using the background seismicity rate.

Figure 6. Static Coulomb stress changes computed at 7.5 km depth immediately after the 1992 Landers main shock (left panel) and after the Big Bear aftershock (right panel; thus including both the main shock and the aftershock) using the constant apparent friction model (equation 2,  $\mu' = 0.4$ ) and resolving stress changes onto prescribed vertical strike slip faults striking  $N330^{\circ}$  (rake angle 180°). The slip distribution and the fault geometry for the 1992 Landers earthquake are taken by Wald and Heaton (1994), while for the Big Bear aftershock from Jones and Hough (1995).

Figure 7. Rate of aftershock production in a log-log scale caused by a positive (left panel) and a negative (right panel) stress perturbations. These simulations have been performed using a stress step of 0.3 MPa. Colors indicate different combinations of the aftershock duration  $t_a$ , background rate r and  $A\sigma$  parameter. The same rate decay in the first days after the stress perturbation is obtained by different combinations of input parameters. This figure suggests an inverse correlation between background seismicity rate and aftershock duration  $r \sim \frac{1}{t_a}$ .

Figure 8. Spatial distribution of predicted seismicity rate changes computed immediately after the 1992 Landers earthquake (panels a, b) and 30 days after the main shock (panels c, d). Panels on the left (a and c) displays the calculations performed for prescribed receivers oriented as those used for Figure 4, while panels on the right (b and d) shows those performed for OOPs associated with a horizontal  $\sigma_1$  oriented  $N7^{\circ}$ , a vertical  $\sigma_2$  and a horizontal  $\sigma_3$ . The parameters adopted for computing Coulomb stress perturbations are those used for Figure 4. Coulomb stress perturbations are computed by

- averaging stress changes estimated at 7.0 km and 11 km depth. Seismicity rate
  changes shown in panels (b) and (d) are caused by both the Landers main shock and the
  Big Bear aftershock.
- Figure 9. Spatial distribution of the difference between the seismicity rate changes computed from prescribed receivers and OOPs. The left and the right panels show the seismicity rate difference from stress changes calculated immediately after the 1992 Landers earthquake and 30 days after the main shock, respectively.
- Figure 10. Temporal decay of the normalized seismicity rate changes  $\frac{R}{r}$  computed for OOPs (red curves) and for prescribed receivers (blue curves). Dashed lines indicate the aftershock rate decay in areas that experienced stress changes less than 0.5 MPa, while solid curves illustrate the decay rate for unrestricted stress perturbations. Input parameters for these calculations are those used for Figure 8. Seismicity rate changes are computed from mean Coulomb stress changes averaged from stress perturbations estimated at 7 and 11 km depth.