Inverting for dynamic stress evolution on earthquake faults directly from seismic recordings

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December 7, 2022

Abstract

Dynamic stress evolution during earthquake rupture contains information of fault frictional behavior that governs dynamic rupture propagation. Most of earthquake stress drop and evolution studies are based on kinematic slip inversions. Several dynamic inversion methods in the literature require dynamic rupture modeling that makes them cumbersome with limited applicability. In this study, we develop a fault-stress model of earthquake sources in the framework of the representation theorem. We then propose a dynamic stress inversion method based on the fault-stress model to directly invert for dynamic stress evolution process on the fault plane by fitting seismic data. In this inversion method, we calculate numerical Green's function once only, using an explicit finite element method EQdyna with a unit change of shear or normal stress on each subfault patch. A linear least-squares procedure is used to invert for stress evolution history on the fault. To stabilize the inversion process, we apply several constraints including zero normal slip (no separation or penetration of the fault), non-negative shear slip, and moment constraint. The method performs well and reliably on a synthetic model, a checkerboard model and the 2016 $M_w 5.0$ Cushing (Oklahoma) earthquake. The proposed fault-stress model of earthquake sources with inversion techniques such as one presented in this study provides a new paradigm for earthquake source studies using seismic data, with a potential of deciphering more physics from seismic recordings of earthquakes.

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12	Key points
13	• We develop a fault-stress model of earthquake sources that provides a new paradigm
14	comparing with the kinematic slip model.
15	• We present an inversion method based on the fault-stress model to invert for dynamic
16	stress evolution directly from seismic data.
17	• Tests on a synthetic model, a checkerboard model and the 2016 Cushing earthquake
18	show the dynamic stress inversion method works well.

19 Abstract

Dynamic stress evolution during earthquake rupture contains information of fault frictional 20 21 behavior that governs dynamic rupture propagation. Most of earthquake stress drop and evolution studies are based on kinematic slip inversions. Several dynamic inversion 22 methods in the literature require dynamic rupture modeling that makes them cumbersome 23 24 with limited applicability. In this study, we develop a fault-stress model of earthquake 25 sources in the framework of the representation theorem. We then propose a dynamic stress inversion method based on the fault-stress model to directly invert for dynamic stress 26 evolution process on the fault plane by fitting seismic data. In this inversion method, we 27 calculate numerical Green's function once only, using an explicit finite element method 28 EQdyna with a unit change of shear or normal stress on each subfault patch. A linear least-29 squares procedure is used to invert for stress evolution history on the fault. To stabilize the 30 inversion process, we apply several constraints including zero normal slip (no separation 31 32 or penetration of the fault), non-negative shear slip, and moment constraint. The method performs well and reliably on a synthetic model, a checkerboard model and the 2016 M_w 33 34 5.0 Cushing (Oklahoma) earthquake. The proposed fault-stress model of earthquake 35 sources with inversion techniques such as one presented in this study provides a new paradigm for earthquake source studies using seismic data, with a potential of deciphering 36 37 more physics from seismic recordings of earthquakes.

38

39 Plain Language Summary

Scientists have been fitting seismic recordings to obtain slip (relative motion between two
sides of a geology fault that causes earthquakes) and slip evolution to understand what

happen during an earthquake. This is the fault-slip (or kinematic) model of earthquake 42 sources that have been in dominance in the literature and scientific community. To 43 understand why earthquakes happen in ways observed in past earthquakes, scientists 44 further calculate stress changes and stress evolution, which control earthquake rupture 45 processes, from the above slip distribution and slip evolution with some assumptions. In 46 47 this study, we propose a fault-stress model of earthquake sources and present an inversion method based on this model to directly obtain stress change and evolution during an 48 earthquake from seismic recordings. Tests on a couple of hypothetical models and the 2016 49 Mw 5.0 Cushing (Oklahoma) earthquake show the fault-stress model and the inversion 50 method perform well. The proposed fault-stress model with inversion techniques such as 51 one presented in this study provides a new paradigm for scientists to study earthquake 52 sources from seismic recordings, potentially advancing our understanding of earthquake 53 physics and improving our ability for seismic hazard analysis and reduction greatly. 54

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56 **Index terms:** 7209, 7215, 7260, 7290

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58 Keywords: dynamic inversion, fault-stress model, least-squares method, Green's function,
59 earthquake source, seismic recordings

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61 **1. Introduction**

Kinematic slip inversions have been the primary approach for the scientific community to
understand sources of earthquakes, such as the 1979 Mw 6.5 Imperial Valley (California)
(Olson and Apsel, 1982; Hartzell and Heaton, 1983), 1984 Mw 6.2 Morgan Hill (California)

(Hartzell and Heaton, 1986; Beroza and Spudich, 1988), 1992 Mw 7.3 Landers (California) 65 (Wald and Heaton, 1994; Wang et al., 2022), 1999 Mw 7.6 Chi-Chi (Taiwan) (Ma et al., 66 67 2000; Ji et al., 2003), 2004 Mw 9.1 Sumatra (Indonesia) (Ammon et al., 2005; Yoshimoto and Yamanaka, 2014), 2011 Mw 9.0 Tohoku (Japan) (Yue and Lay, 2011; Yamazaki et al., 68 2011), and 2016 Mw 7.8 Kaikoura (New Zealand) (Zhang et al., 2017; Wang et al., 2018) 69 70 earthquakes, among many others. By inverting seismic and/or geodetic data, one can obtain slip distribution and/or spatiotemporal slip evolution on the causal fault of an earthquake. 71 Slip distribution shows where and how much slip occurs on the fault in an earthquake. 72 Spatiotemporal slip evolution reveals how rupture propagates along the fault, such as 73 rupture velocity, direction, and slip rise time. These results from slip inversions have 74 provided majority of understanding of past earthquakes from a kinematic point of view. 75

76 To gain further knowledge of physics of earthquake sources from earthquakes, several lines of efforts have been made in the literature to obtain dynamic parameters and/or 77 78 models of past earthquakes. One line of efforts is to obtain static stress changes from slip 79 distributions. Andrews (1980) developed a formulation that relates the slip-parallel shear 80 stress change to the slip distribution in the wavenumber domain. Ripperger and Mai (2004) 81 extended Andrews' formation for fast computation of the shear stress drop distribution on a fault from the slip distribution of a kinematic inversion. This method has been used in 82 83 other studies. For example, Luttrel et al. (2011) estimated the coseismic stress drop from the slip distribution of the 2010 Mw 8.8 Maule (Chile) earthquake using the method. Okada 84 85 (1992)'s analytical expressions allow one to calculate static stress (tensor) changes in an elastic homogeneous half space from a given final fault slip distribution. The analytical 86 solutions have been adopted in widely used Coulomb stress change calculations (King et 87

al., 1994; Lin and Stein, 2004). One limitation of these methods in calculating either static
shear stress drops or static stress tensor changes from slip distributions is that the fault is
assumed to be embedded in a homogeneous medium. In addition, Ripperger and Mai's
method and Andrews's formulation further assumes the fault is embedded in a full space.
In addition, the accuracy of these static stress calculations is strongly dependent on the
quality of kinematic slip inversion results.

The second line of efforts is to compute dynamic stress changes (i.e., stress evolution 94 during the coseismic dynamic rupture process) of an earthquake from its kinematically-95 determined spatiotemporal slip evolution. Quin (1990) used a trial-and-error method to 96 obtain a dynamic rupture model to fit the kinematic inversion results of the 1979 Imperial 97 Valley earthquake. Miyatake (1992) proposed a similar method to reconstruct dynamic 98 rupture process of an earthquake from kinematic constraints. In both studies, the frictional 99 coefficient is assumed to drop from the static level to the dynamic level instantaneously at 100 101 failure, which results in nonphysical stress and slip-rate singularities at the crack tip. In addition, they did not calculate the theoretical waveforms based on their dynamic rupture 102 103 parameters, which makes it difficult to evaluate the degree of fit of these dynamic models 104 to the recorded seismograms. Fukuyama and Mikumo (1993) developed an iterative method of a kinematic slip inversion and a crack inversion to estimate dynamic rupture 105 106 properties of an earthquake, including dynamic stress drop and shear strength excess, by 107 fitting near-field seismograms. Bouchon (1997) developed an approach to directly derive 108 the spatiotemporal stress evolution on the fault from the kinematic slip evolution of an earthquake, by using the expressions linking the P-wave scalar potential and S-wave vector 109 potential in the medium with the seismic moments of the fault points. The method was used 110

to compute stress drop (both static and dynamic) and strength excess distributions on the 111 faults for the 1979 Imperial Valley, 1984 Morgan Hill, 1989 Loma Prieta, and 1994 112 113 Northridge earthquakes (all in California) (Bouchon, 1997), to gain insights into the state of stress before the earthquakes and heterogeneous distributions of stress drop and strength 114 excess. The method was also used to study the complex rupture in the 1992 Landers 115 116 (California) earthquake, revealing the important role of large dynamic stress perturbations in the earthquake (Bouchon et al., 1998). Ide and Takeo (1997) proposed to solve 117 elastodynamic equations with a finite difference method to determine fault stress evolution 118 using fault slip evolution from a kinematic waveform inversion as a boundary condition. 119 They applied the method to the 1995 Ms 6.8 Kobe (Japan) earthquake and examined 120 constitutive relations of fault slip, such as slip and/or slip-rate dependence of fault friction. 121 They found clear slip-weakening relations on the fault while no clear slip-rate dependence. 122 They analyzed the slip-weakening behavior and found a depth dependence of the critical 123 124 slip distance D₀ in the widely used slip-weakening law (Ida, 1972; Andrews, 1976; Day, 1982; Okubo and Dieterich, 1984; Ohnaka et al., 1987). Seismologically determined D₀ 125 126 from this study is about 1 m or more in the shallow depth, while the upper limit is about 127 0.5 m or smaller in the deeper part of the fault. This method has also been used in later studies, such as Piatanesi et al. (2004) and Ma (2021) for the 1999 Chi-Chi earthquake. In 128 129 this method, the absolute displacement of each wall of the fault interface, rather than the slip (the relative displacement between the two walls), should be assigned as the boundary 130 131 conditions to calculate stresses. Ide and Takeo (1997) assume symmetry in displacement between two walls and thus assign half of the slip to each wall. This assumption may be 132 largely valid for a vertical strike-slip fault. But it does not hold for dip-slip faults, in 133

particular shallow-dipping thrust faults, as the displacement of the hanging wall can be
significantly larger than that of the footwall because of broken symmetry (Oglesby et al.,
1998; Oglesby et al., 2000).

The third line of efforts is so called "fully dynamic inversions". Peyrat and Olsen (2004) 137 used dynamic rupture simulations and neighborhood algorithm (NA) to invert for stress 138 139 drops for the 2000 Western Tottori earthquake (Mw6.6). In the dynamic inversion, stress drops are inverted on a number of rectangular patches over the fault plane, while assuming 140 constant yield stress Tu and slip weakening distance D₀ over the fault plane. Di Carli et al. 141 (2010) used low frequency strong motion data to do a nonlinear kinematic and dynamic 142 inversion using NA for the 2000 Tottori earthquake. Both inversions are based on the 143 elliptical subfault approximation to reduce model parameters. The kinematic inversion is 144 used to establish a prior information to reduce parameters and define the parameter range 145 for dynamic inversion. In the dynamic inversion, a strong prior constraint is applied by 146 147 fixing the peak stress level Tu, initial stress field Te and slip weakening distance D₀. The inverted parameters are the geometries of two elliptical rupture patches. Ruiz and 148 149 Madariaga (2011) proposed a dynamic inversion method for a moderate size of earthquake 150 (Mw 6.7) in Chile. They assume a simple elliptical shape rupture patch and uniform stress and friction within the patch, and invert for eleven parameters in total, including five 151 152 parameters for geometry, location, and orientation of the elliptical patch, two parameters 153 for rupture initiation radius and (shear) stress level, four parameters for D₀, static strength 154 Tu in the slip-weakening law, and initial (shear) stress levels inside and outside the patch. They perform forward dynamic rupture simulations by a finite different method and use a 155 NA and Monte Carlo (MC) technique for the inversion. The method was used in later 156

studies for other intermediate sizes of earthquakes (Ruiz and Madariaga, 2013; Ruiz et al.,
2017; Herrera et al., 2017). Overall, they need dynamic rupture simulations in their
inversions with NA, and the number of dynamic rupture simulations are not fixed
depending on the convergence speed in NA.

More recently, Xie and Cai (2018) proposed an earthquake stress model and applied it 161 to invert for coseismic static stress changes on the shallow-dipping fault plane (including 162 both fault shear and normal stresses) of the 2011 Mw 9.0 Tohoku (Japan) earthquake. They 163 obtained the fault shear and normal stresses changes due to the earthquake directly from 164 GPS data of the coseismic deformation, without the need of slip inversion as in Okada's 165 method or Rapperger and Mai's method. In addition, they can obtain fault normal stress 166 changes, which are absent in the Rapperger and Mai's method but can be significant in dip-167 slip faulting earthquakes such as the Tohoku earthquake. They further applied the method 168 to invert for fault stress accumulations (both shear and normal stresses) directly from GPS 169 170 data before the Tohoku earthquake, revealing large shear stress accumulations and normal stress variations in the Tohoku coseismic rupture areas (Xie et al., 2019). 171

In this study, we extend Xie and Cai's earthquake stress model to the dynamic process 172 173 and present a fault-stress model of earthquake sources in the framework of the representation theorem, in comparison with the kinematic slip model of earthquake sources 174 175 (i.e., the fault-slip model) that has been dominantly used in the community. We then 176 develop a dynamic stress inversion method based on the fault-stress model to directly invert 177 seismic waveform recordings for the coseismic fault stress evolution (both shear and normal stresses). Compared with the second line of efforts reviewed above, the method 178 179 eliminates the need of the slip evolution inversion and avoids problematic assumptions

such as symmetric displacements between the two walls of a fault interface. Compared 180 with the third line of efforts discussed above, the method does not need to perform 181 spontaneously dynamic rupture modeling. Involvement of dynamic rupture modeling in 182 these previous dynamic inversion methods makes them cumbersome and/or mainly 183 applicable for intermedium sizes of earthquakes. In contrast, dynamic stress inversion 184 185 methods based on the fault-stress model such as one proposed in this study can be standardized in a way similar to kinematic slip inversions that have been developed for 186 many decades. The method can be used for small earthquakes to megathrust earthquakes. 187 We test the method on a synthetic model and perform a resolution analysis with a 188 checkerboard test. Finally, we apply it to the 2016 Mw 5.0 Cushing (Oklahoma) earthquake 189 to show its validity. The fault-stress model and associated inversion methods such as one 190 191 presented in this study open a door to decipher fault friction behavior and parameters such 192 as D₀ directly from seismic recordings.

193

194 **2.** The fault-stress model of earthquake sources

195 **2.1** The faulting theory of earthquakes and the fault-slip model

The faulting theory of earthquakes was established from observations of the extensive
rupturing of the San Andreas fault during the 1906 San Francisco earthquake (Reid, 1910).
In this theory, earthquakes are the results of dynamic faulting. This theory was proven to
be valid for most shallow tectonic earthquakes by seismological and geodetic observations.
The theory gained widespread acceptance since the early 1960s with the installation of the
Worldwide Standardized Seismic Network (Scholz, 2002).

A faulting source of earthquakes has classically been characterized as slip across a fault 202 plane, i.e., a discontinuity in tangential displacement. This is termed as the fault-slip model 203 204 of earthquake sources in this study, in comparison with the fault-stress model to be developed. The fault-slip model has been the basis for kinematic slip inversions of seismic 205 206 data in the literature. As shown in Figure 1, an internal interface (a fault plane) Σ with unit normal vector **n** (pointing from the Σ^{-} side to the Σ^{+} side) is embedded in a volume V 207 enclosed by surface S. The representation theorem gives the displacement $\mathbf{u}(\mathbf{x}, t)$ at a 208 general point x in the volume V at time t due to the sum of the contributions from slip 209 history $[u(\xi,\tau)]$ of points on the fault plane Σ in the Cartesian component form as (Aki 210 211 and Richards, 1980, Eq. 3.2)

212
$$u_m(\mathbf{x},t) = \int_{-\infty}^{\infty} d\tau \, \iint_{\Sigma} \, [u_i(\boldsymbol{\xi},\tau)] c_{ijpq} n_j \partial G_{mp}(\mathbf{x},t-\tau;\boldsymbol{\xi},0) / \partial \boldsymbol{\xi}_q d\Sigma \qquad (1).$$

Here, $\boldsymbol{\xi}$ is the general position on the fault plane Σ , c_{ijpq} are elastic constants, n_j is the jth component of the unit normal vector \mathbf{n} of Σ , G_{mp} is Green's function, and the Einstein's summation convention applies in the equation. Green's function $G_{mp}(\boldsymbol{x}, t; \boldsymbol{\xi}, \tau)$ gives the *m*th component of displacement at a general point \mathbf{x} within V and time t due to unit slip in the *p*-direction at $\mathbf{x} = \boldsymbol{\xi}$ on the fault Σ and $t = \tau$.

Using the delta function derivative $\partial \delta(\eta - \xi) / \partial \eta_q$ to localize points of Σ within V, Eq (1) may be written as

220
$$u_m(\boldsymbol{x},t) = \int_{-\infty}^{\infty} d\tau \iiint_V \left\{ -\iint_{\Sigma} \left[u_i(\boldsymbol{\xi},\tau) \right] c_{ijpq} n_j \partial \delta(\boldsymbol{\eta}-\boldsymbol{\xi}) / \partial \eta_q d\Sigma \right\} G_{mp}(\boldsymbol{x},t-\boldsymbol{\xi})$$

221
$$\tau; \eta, 0) dV$$
 (2).

The term within {} in Eq (2) is the body-force equivalent of fault slip on Σ . Therefore, the seismic waves within V excited by fault slip are the same as those excited by a distribution on the fault of certain body forces canceling moment, among which a surface distribution
of double couples can always be chosen in an isotropic medium (Aki and Richards, 1980,
Sec 3.2).

227

228 2.2 The fault-stress model of earthquake sources

229 Reid's (1910) seminal work led to the elastic rebound theory of tectonic earthquakes, in which stress accumulation before an earthquake and stress drop (release) during an 230 earthquake are the key features of earthquake cycles. When shear stress increases to the 231 frictional strength level of a fault due to tectonic movement, the fault ruptures, releasing 232 the accumulated shear stress and generating fault slip and seismic waves. Therefore, in 233 principle a faulting source of earthquakes can also be characterized by shear stress drop, 234 235 more generally stress change, on the ruptured fault, in addition to slip across the fault plane. But this concept had not been utilized until the recent study by Xie and Cai (2018), in 236 237 which they propose an earthquake stress model to study static stress changes of earthquakes. Here, we extend their static earthquake stress model to the dynamic evolution of fault stress 238 during earthquakes. We term the model as the fault-stress model of earthquake sources, in 239 240 comparison with the fault-slip model reviewed above. Furthermore, we place this model in 241 the context of the representation theorem in seismology.

As shown in Figure 1, we consider the traction change ΔT on the ruptured fault, instead of fault slip, as the source of seismic waves. Here, we may consider two adjacent internal surfaces, labeled Σ^- and Σ^+ , which are opposite faces of the fault plane Σ . The traction change ΔT can be defined as the change in the traction T, which is applied on Σ^- by the material on the Σ^+ side. Then $-\Delta T$, which is same in magnitude but opposite in direction with ΔT , is the change in the traction -T that is applied on Σ^+ by the material on the Σ^- side. With this characterization of earthquake sources, we may write the representation of displacement at a general point **x** in volume *V* at time *t* due to the traction change on the ruptured fault as (i.e., the representation theorem for the new model)

251
$$u_m(\boldsymbol{x},t) = \int_{-\infty}^{\infty} d\tau \, \iint_{\Sigma} \, \Delta T_p(\boldsymbol{\xi},\tau) G_{mp}(\boldsymbol{x},t-\tau;\boldsymbol{\xi},0) d\Sigma \quad (3)$$

Here, Green's function $G_{mp}(\mathbf{x}, t; \boldsymbol{\xi}, \tau)$ gives the *m*th component of displacement at a 252 general point x within V and time t due to unit traction change in the p-direction at $\mathbf{x} = \boldsymbol{\xi}$ 253 254 on the fault Σ and $t = \tau$. With this representation, we can invert for traction changes on the ruptured fault directly from seismic recordings, after Green's functions are calculated. As 255 256 discussed above, this model is termed as the fault-stress model of earthquake sources in this study, which is the basis for a dynamic stress inversion method we develop below. 257 Notice that ΔT is a vector that generally does not lie within the fault plane Σ , i.e., non-zero 258 259 values in both shear and normal components. Therefore, dynamic stress inversions based on this model can invert for both fault shear and normal stress changes of earthquakes from 260 seismic recordings. 261

We remark that this new model, the fault-stress model of earthquake sources, is different 262 263 from both double couples of earthquake sources and dynamic rupture models. Double couples are essentially a body-force equivalent of the fault-slip model, and fault slip is 264 represented by a surface distribution of double couples. In the fault-stress model, the 265 traction is surface force applied on the fault plane, not body force. Dynamic rupture models 266 require friction laws, and rupture propagation is governed by these laws and stress and 267 strength evolutions on the fault. Therefore, dynamic inversion procedures based on 268 dynamic rupture models in the literature as reviewed above are cumbersome as they need 269

to handle rupture propagation and are limited in rupture geometry and earthquake sizes. In contrast, the fault-stress model developed here does not consider spontaneous rupture propagation. Instead, it only considers traction changes (i.e., fault shear and normal stress changes). Therefore, standard inversion procedures for dynamic stress evolutions can be developed relatively easily. For example, most techniques used in kinematic slip inversions over many decades can be readily adopted in dynamic stress inversion methods based on the fault-stress model, such as the one developed in the next section.

277

278 **3.** A dynamic stress inversion method

Based on the fault-stress model of earthquake sources, we develop a dynamic stress 279 inversion method, which includes two major parts. The first part is to calculate the Green's 280 functions at seismic stations due to unit stress changes over a finite time interval on 281 individual fault patches (i.e., subfaults). We use an explicit finite element method (FEM) 282 283 EQdyna (Duan and Oglesby, 2006; Duan and Day, 2008; Duan, 2010, 2012; Luo and Duan, 2018; Liu et al., 2018) to numerically calculate the Green's functions. The second part is 284 to invert seismic waveforms directly for stress evolutions on all subfaults. We use a least-285 286 squares method with multiple physical constraints to perform the inversion.

287

288 **3.1. Numerical Green's Function Calculations**

To calculate numerical Green's functions at seismic stations, we divide the fault interface into many subfaults and apply unit stress changes (1MPa) on subfaults over a time interval along the fault strike, dip and normal directions, shown in Figure 2a. The model top boundary is set as free surface and other boundaries fixed. Perfectly matched layers (PML) are used to absorb seismic wave reflection from truncated model boundaries (Liu and Duan,
2018). The initial-boundary value problem for such a numerical Green's function is
governed by the following equations

296
$$\rho \Delta \ddot{u}_i = \Delta \sigma_{ij,j}, \tag{4}$$

297
$$\Delta \sigma_{ij} = \lambda \Delta \varepsilon_{kk} \delta_{ij} + 2\mu \Delta \varepsilon_{ij}, \qquad (5)$$

298
$$\Delta \varepsilon_{ij} = (\Delta u_{i,j} + \Delta u_{j,i})/2, \qquad (6)$$

299
$$\Delta \sigma_{ij} n_j | \Gamma_{subfault} = \Delta T_i, \tag{7}$$

$$\Delta \sigma_{ij} n_j | \Gamma_{free_surface} = 0, \qquad (8)$$

301 $\Delta u_i n_i | \Gamma_{other_{boundary}} = 0, \qquad (9)$

302
$$\Delta u_i = 0$$
, $(t = 0)$ (10)

303
$$\Delta \dot{u}_i = 0, (t = 0) \ (i, j = x, y, z).$$
(11)

where Δu_i , $\Delta \dot{u}_i$, $\Delta \ddot{u}_i$, $\Delta \sigma_{ij}$ and $\Delta \varepsilon_{ij}$ are changes in displacement, velocity, acceleration, stress and strain in the medium induced by a unit stress change applied to a subfault, respectively. λ and μ are Lame constants. n_i is the unit normal vector to the fault surface or a model boundary. ΔT_i is the applied unit stress change along *i* direction on a subfault. $\Gamma_{subfault}$ stands for the subfault interface and $\Gamma_{free_surface}$ stands for the free surface of the model. δ_{ij} is the Kronecker delta and the Einstein's summation convection implies in the equations.

We solve the boundary value problem using *EQdyna*. The fault interface is modeled by the traction-at-split-nodes technique (Day et al., 2005; Duan, 2010). At each fault node location, the technique splits a fault node into two halves that share the same spatial location but can move relative to each other. The two halves of a split node interact only through a traction acting on the interface between them. Figure 2a schematically shows an

example that applies an along-strike unit stress change (ΔT_x) on a subfault of a strike-slip 316 fault interface with two walls (Fault Wall A and B). The same concept applies to Green's 317 functions for other subfault patches, arbitrary fault geometries, and unit stress changes 318 along fault dip or fault normal directions. Notice that a subfault comprises two adjacent 319 surfaces, on which stress changes are opposite in sign but same in magnitude. The unit 320 stress change is applied over the first time-step in the dynamic simulation in Green's 321 function calculations. The element size of a model is limited by the Courant-Friedrich-322 323 Lewy (CFL) condition (Courant et al., 1967) for the explicit time integration rule and by the need of frequency contents generated in the model. As a result, the dimension of a 324 subfault is typically much larger than the element size to make model parameters in the 325 326 inversion problem at a reasonable number relative to the number of available seismic recordings. Each subfault may contains tens of element facets, shown in Figure 2b. We 327 328 apply a unit stress change uniformly on all the element facets within the subfault over the 329 first time step. Then the resultant slip on all subfaults (three directions) and synthetic Green's functions on all available seismic stations (three directions) are stored for use in 330 331 the inversion stage. This kind of computations is performed once before inversion for each 332 subfault and for each stress change direction (strike, dip and normal), with the total number 333 of calculations equal to the number of subfaults multiplied by three. The calculated Green's functions of seismic waves on available stations are used for dynamic stress inversion. The 334 Green's functions of resultant slip on subfaults are used to apply constraints during the 335 inversion and to recover the stress versus slip relation on each subfault after the inversion. 336 337

338 3.2 The Least-Squares Inversion with Constraints

We utilize the observed seismograms recorded by local stations to invert for the coseismic 339 dynamic stress change history on each subfault and in each direction. For the inversion, the 340 fault plane is divided into multiple subfaults (Figure 2b). On each subfault, the source time 341 function (STF) is parameterized by several narrow stress change rectangles of the same 342 duration and each rectangle offset by its duration, and the amplitudes of these stress change 343 344 rectangles should be inverted (Figure 2c). On each subfault, we define a new local coordinate system to invert stress changes in three directions: D_1 , D_2 and D_n , shown in 345 Figure 2b. The D_1 and D_2 are within the fault plane, with D_1 as 45 degrees counterclockwise 346 from the rake angle (rake-45) and D_2 as 45 degrees clockwise from the rake angle (rake+45), 347 while the $\mathbf{D}_{\mathbf{n}}$ is perpendicular to the fault plane. In this way, the inverted stress changes of 348 349 ΔT_1 and ΔT_2 (along **D**₁ and **D**₂ directions) are comparable in magnitude, which makes the inversion results more stable. The inverted ΔT_1 and ΔT_2 may be different, so that the rake 350 angle of the resultant stress change vector (parallel with the fault plane) on each specific 351 352 subfault may vary from the average rake angle (within 45 degrees).

To further stabilize inversion results, we also apply a smoothing constraint and a normal displacement continuity constraint in Eq (12), a non-negative slip constraint in Eq (13) and a moment constraint in Eq (14), as described below. The MATLAB routine lsqlin, which is a linear least-squares solver with bounds or linear constraints, is used to solve Equations (12)-(14).

358

359
$$\begin{bmatrix} \mathbf{G} \\ \lambda \mathbf{L} \\ \beta \mathbf{W} \end{bmatrix} \Delta \mathbf{T} = \begin{bmatrix} \mathbf{d} \\ \mathbf{0} \\ \mathbf{0} \end{bmatrix}$$
(12)

360

361
$$\begin{bmatrix} \mathbf{S_1} \\ \mathbf{S_2} \end{bmatrix} \Delta T \ge \begin{bmatrix} \mathbf{0} \\ \mathbf{0} \end{bmatrix}$$
(13)

362

363
$$\begin{bmatrix} \mathbf{M_1} \\ \mathbf{M_2} \end{bmatrix} \Delta T = \begin{bmatrix} \frac{\sqrt{2}}{2} \mathbf{m_0} \\ \frac{\sqrt{2}}{2} \mathbf{m_0} \end{bmatrix}$$
(14)

364

In above equations, ΔT is the stress change vector to be inverted in the dynamic stress 365 inversion, including stress changes on each subfault, each rectangle in source time function 366 along each direction (D_1 , D_2 and D_n), as shown in Figure 2bc. In Eq (12), matrix G stores 367 the Green's functions of three component seismic waves on available stations calculated 368 by the FEM, which are generated by 1MPa stress change on each grid, each rectangle in 369 source time function along each direction. Then the Green's functions in G matrix need to 370 be convolved with a rectangle box function as designed in the STF. The vector **d** stores 371 372 observed three component seismic waveforms at stations. Matrix $\lambda \mathbf{L}$ functions to apply a Laplacian regularization (Hartzell and Heaton, 1983; Yue and Lay, 2013), which constrains 373 temporal and spatial smoothing of the inverted stress change STF. The optimal degree of 374 smoothing is determined by iterative modeling of seismic waveforms using a range of 375 smoothing factors λ . Matrix βW functions to apply the normal displacement continuity 376 constraint with factor β . βW is equal to $\beta (S_n^A - S_n^B)$ with S_n^A and S_n^B representing the 377 normal displacement on all subfaults on Fault Wall A and Fault Wall B. In Eq (13), matrix 378 $\mathbf{S_1}$ stores Green's functions of fault slip in the $\mathbf{D_1}$ direction on all subfaults, generated by 379 1 MPa stress change on each subfault, each rectangle in source time function and along 380 each direction. Matrix S_2 is similar to S_1 , representing the fault slip in the D_2 direction. 381 The non-negative slip constraint in Eq (13) regulates that final slip vector $S_1 \Delta T$ along D₁ 382

and $S_2 \Delta T$ along D_2 should be equal or larger than zero, so that the direction of final fault 383 slip on each subfault should be within 45 degrees from the earthquake rake angle, which is 384 realistic and further stabilizes the dynamic stress inversion results. In Eq (14), matrices M_1 385 and M_2 store Green's functions of cumulative moment on the whole fault in the D_1 and 386 387 **D**₂ directions, generated by 1MPa stress change on each subfault, each rectangle in source time function and along each direction. The vector on the right of Eq (14) is composed of 388 two values, each equal to $(\sqrt{2}/2)m_0$, with scalar value m_0 equal to the moment of the target 389 earthquake. The moment constraint in Eq (14) regulates that the total moment in the 390 391 direction of rake angle is approximately equal to m₀, to avoid an anomalous inverted moment. 392

393

4. A synthetic model test

395 4.1 Forward modeling of the synthetic model A

We build a synthetic strike-slip model A based on the fault geometry and 1D seismic velocity structure of the 2016 Mw 5.0 Cushing earthquake (Meng et al., 2021) to test the dynamic stress inversion method. The fault of the 2016 Cushing earthquake is a vertical NEE strike-slip fault with its surface trace shown in Figure 3, and the 1D velocity structure is given in Table 1.

The synthetic strike-slip model A, shown in Figure 4, is generated using *EQdyna*. Model A has a strike-slip source patch in size of about 4.5 km by 4.5 km as shown in Figure 4ad, with the rupture starting at x = 4.0 km and z = -3.4 km and a fixed rupture velocity of ~3 km/s. The fault is governed by the time weakening friction law (Andrews, 2004) where the static friction coefficient f_s drops linearly to the dynamic friction coefficient f_d over 0.2

s. The time step is 0.01 s in the simulation. Within the source patch, static friction is $f_s =$ 406 0.4 and dynamic friction is $f_d = 0.3$ in the center (2.5 km by 2.5 km) and linearly 407 increases to $f_d = f_s = 0.4$ over 1km to the boundaries. Outside of the source patch 408 $f_s = f_d = 0.4$. The initial normal and shear stress on the fault plane is set as -100 MPa 409 (negative compressional) and 35 MPa, respectively, thus the source patch tends to yield 410 411 stress drop (along strike) of about 6 MPa, and areas surrounding the stress drop zone have stress increase due to the termination of slip (Figure 4a). The stress increase zone is very 412 narrow with the maximum stress increase about 7 MPa (Figure 4a). For a strike-slip model, 413 the stress change amplitude is much smaller along the dip and normal directions, Figure 414 415 4bc. In addition to synthetic stress change model (Figure 4abc), the dynamic simulation generates synthetic slip distribution on fault interface (Figure 4def) and synthetic seismic 416 waveforms at selected stations. The maximum synthetic slip along strike direction is about 417 0.4 m distributing within the source patch (Figure 4d), while the slip in the dip and normal 418 directions are very small compared to the strike direction, Figure 4ef. From synthetic model 419 A, we generate synthetic seismic waveforms on eight virtual stations evenly distributed on 420 two sides of the fault trace (Figure 3a), and also on five virtual stations (Figure 3b), for the 421 synthetic test. 422

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424 **4.2** Green's function generation

To calculate the numerical Green's functions for this synthetic model test, the following checkerboard test and the Cushing earthquake source inversion, we set a finite element model in size of 60 km by 60 km by 30 km along x, y, z directions, with element size of 100 m. We utilize an 1D velocity structure from the kinematic source inversion study of

the Cushing earthquake (Meng et al., 2021) and the P-wave velocity, S-wave velocity and 429 density of different layers are presented in Table 1. Given the minimum S-wave velocity 430 431 of 1.5 km/s in the top layer and assuming that we need at least 5 elements to resolve a wavelength, the highest frequency contents in the numerical Green's functions is 2.9 Hz. 432 The total fault interface is 9 km by 6.5 km, in the x-z plane. We divide the fault interface 433 434 into 18 by 13 subfaults along x and z directions, respectively, with each subfault in size of 500 m by 500 m. Given the element size of 100 m, each subfault comprises 5×5 435 quadrilateral element facets. Time step is calculated as $dt = \alpha dx/V_p$ according to the 436 CFL condition (Courant et al., 1967). We choose dt = 0.01 s with $\alpha = 0.5$. The unit 437 stress change of 1 MPa is applied at each subfault uniformly over the first time step, along 438 fault normal, strike and dip directions, respectively. There are in total $18 \times 13 \times 3 = 702$ 439 Green's functions computed on each of eight virtual stations (Figure 3a) for the synthetic 440 model test and checkerboard test, and on each of five real stations (Figure 3b) for the 441 synthetic model test, checkerboard test and the Cushing earthquake source inversion. 442

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444 **4.3 Inversion for the synthetic model A**

Utilizing the synthetic seismic waveforms on eight virtual stations (Figure 3a), we apply the dynamic stress inversion method to invert model A as a benchmark test, using synthetic seismic waves generated in model A as virtual observations (*d* vector in Eq. 12). In the inversion, we adopt the same hypocenter location at x = 4.0 km and z = -3.4 km and the same rupture velocity of 3 km/s as in the synthetic forward modeling in model A. The stress change source time function at each subfault is parameterized by four rectangles, each rectangle lasting for 0.2 s and offset by 0.2 s, with total duration of 0.8 s. We invert for the

amplitude of each rectangle to get the stress change history for each subfault along each 452 direction. The total moment m₀ in model A is utilized for the moment constraint during the 453 inversion (Eq. 14). Before inversion, both the Green's functions in matrix G and the virtual 454 observed seismic waves in d are band-pass filtered between 0.5 - 2 Hz. During inversion, 455 we use a range of smoothing factor λ to get the relationship between λ and the waveform 456 matching misfit, as shown in Figure 5a, where the optimal λ is around 5*e⁻⁴. The β 457 factor vs misfit is shown Figure 5b, while using $\lambda = 5^{*}e^{-4}$. Unlike the thrust fault situation 458 in Xie and Cai (2018), the β factor has very small effect on the misfit for a strike-slip fault 459 in this test, because the misfit only increases by 0.002 when β factor increases by several 460 orders. Applying the λ factor of 5*e⁻⁴ and β factor of 1.5*e⁻⁶, the inverted result INV1 461 is shown Figure 6. 462

463 The inverted stress changes and associated fault slip along the strike, dip and normal (Figure 6) are close to those of the synthetic model A (Figure 4). The inverted directions 464 result INV1 shows a maximum stress drop about -5.9 MPa and stress increase about 465 1.6MPa along strike direction (Figure 6a), compared with the maximum stress drop of -466 6MPa and stress increase about 7 MPa in the synthetic model (Figure 4a and Figure 7). 467 The maximum inverted stress increase along strike is much lower than that in the synthetic 468 model because the inverted stress change is an average value over a subfault with a size of 469 500 m, not to mention that a smoothing factor is also applied during the inversion, further 470 471 averaging a sharp stress increase. For example, we compare the original stress change in model A with those after averaging over 500m and 1000 m along strike in Figure 7. After 472 applying smoothing over 1000m, the maximum stress increase drops to about 2 MPa while 473 474 the maximum stress drop stays unchanged in the center of the slip patch. The maximum

inverted fault slip along strike is around 0.33 m (Figure 6d), close to but smaller than that 475 in the synthetic model A. In INV1, the inverted normal stress and slip are both near zero 476 477 values, consistent with those in the synthetic model A due to a proper usage of constraint factor β . In addition, we use a pair of smaller parameters of $\lambda = 1.5^{\circ}e^{-4}$ and $\beta = 1.5^{\circ}e^{-7}$ to 478 get the inverted result INV2 as a comparison with INV1, shown Figure 8. In INV2, the 479 maximum inverted stress drop and increase are -7.3 MPa and 2.2 MPa. The maximum 480 inverted slip along strike is around 0.38 m, closer to the maximum slip in synthetic model 481 482 A than INV1. For two inverted results, the inverted slip patch size is slightly larger and maximum slip is slightly smaller compared to the synthetic model A, which may relate to 483 the application of the smoothing factor. Generally, we need to utilize a smoothing factor 484 485 closer to the optimal value, in order to avoid oversmoothing or undersmoothing by using a too large or too small λ , according to Xie and Cai (2018). The smoothing factors used in 486 INV1 and INV2 are close to the optimal value, and the inverted results recover well the 487 source features in the synthetic model. In INV2, the inverted normal stress and slip is larger 488 due to a weaker normal slip continuity constraint when using a smaller β factor in INV2 489 than in INV1. 490

The two inversion cases INV1 and INV2 are both conducted under the condition of utilizing virtual seismic data on eight close stations, as shown in Figure 3a. We also conduct an inversion INV3 using virtual seismic data on five stations as shown in Figure 3b. The relative locations of five stations to the fault is set up based on the 2016 M 5 Cushing earthquake and its adjacent seismic stations, that we will present in later sections. In INV3 (Figure 9), we find that the inverted final stress change and resultant final fault slip is generally similar to those in INV1 and INV2. In addition, an artificial stress drop and slip 498 area occurs near the bottom of the fault zone, which is likely due to the lack of station 499 coverage compared to INV1 and INV2. It implies an important role of the dense 500 seismometer array for improving the resolution of dynamic stress inversions. Notice that 501 the stress change inversion involves three traction components, while kinematic slip 502 inversions only involve two slip components within the fault plane. Inversion for more 503 parameters in the stress change inversion may require more high-quality observed data to 504 get stable and reliable results.

505 **4.3.1 Deciphering D**₀

The dynamic stress inversion allows us to obtain the distribution of the critical slip 506 distance D₀ in the slip-weakening law on the fault plane directly from seismic recordings. 507 In Figure 10, we plot the stress versus slip curves from INV2 and compare them with those 508 from the synthetic model A. We remark that in the synthetic model A, D_0 (turning point of 509 the stress vs slip curve) varies on the fault plane with a smaller value (~ 0.05 m) near the 510 511 hypocenter and larger values further away from the hypocenter (>0.1 m), because a timeweakening friction law (e.g., Andrews, 2004) is used in the synthetic forward modeling. 512 513 The comparison shows that the dynamic stress inversion method can invert for D_0 values 514 well, in particular near the hypocenter. It can also recover the spatial variation of D_0 on the 515 fault plane. We notice that some subfaults further away from the hypocenter may have 516 smaller inverted final stress drop values compared with the synthetic values, which may 517 relate to the smoothing effect in the inversion. At the stress drop under-estimated points or 518 some other stress drop over-estimated points, the turning point of D_0 gets blurred to some extent, compared with the synthetic model A. 519

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521 **5. Resolution analysis: A checkerboard test**

To check the resolution of the dynamic stress inversion method, we conduct a checkerboard test with the same fault geometry and velocity structure as the above section. We first perform a dynamic rupture simulation using EQdyna to obtain the forward checkerboard source model and virtual waveforms at two sets of seismic stations (eight stations and five stations shown in Figure 3). Then we utilize the Green's functions and apply the dynamic stress inversion method to obtain the inverted source model by matching the virtual waveforms.

The forward checkerboard model has a source composed of nine $2 \text{ km} \times 2 \text{ km}$ patches as 529 shown in Figure 11ab. Similar to model A, the fault is governed by the time weakening 530 531 friction law (Andrews, 2004) where the static friction coefficient f_s drops linearly to the dynamic friction coefficient f_d over 0.2 s, with time steps of 0.01 s. Five shaded patches 532 out of nine have $f_s = 0.4$ and $f_d = 0.3$, while the other four have $f_s = f_d = 0.4$. Given a 533 uniform initial normal and shear stress of -100 MPa (negative compressional) and 35 MPa, 534 respectively, the five shaded patches yield stress drops of about 5 MPa, while outside of 535 them stress increases sharply. The rupture is set to start at x = 4.0 km and z = -3.4 km with 536 a fixed rupture velocity of 3 km/s. The shear stress change and associated slip distributions 537 538 of the checkerboard model are shown in Figure 11ab. Uniform stress drops occur on the five shaded patches with sharp stress increases in the narrow zones immediately outside of 539 the four outer patches. The associated slip distribution is heterogeneous with slip 540 541 concentrated within the five shaded patches and larger slip at shallower depths.

542 Using the Green's functions calculated earlier (section 4.2) and the virtual seismic 543 waveforms generated by the forward checkerboard model above, we invert for the stress

changes directly and calculate fault slip associated with the stress changes. The hypocenter 544 and rupture velocity are set to be the same as the checkerboard forward model. The 545 546 parameterization of the stress-change source time function and the bandpass filter applied to seismic waveforms are the same as those in the inversion of model A. When using eight 547 stations, the patches and amplitudes of the stress drop are well recovered as shown in Figure 548 549 11c. The patches of slip are well recovered (Figure 11d), though inverted slip amplitudes are smaller than the synthetic values (Figure 11b). With five stations, the stress drop and 550 slip patches are less well recovered (Figure 11ef) because of fewer stations and poor station 551 coverage. Generally, the shallower three patches are recovered while the two deeper 552 patches suffer a low resolution. 553

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555 6. Application to the 2016 Mw 5.0 Cushing (Oklahoma) earthquake

We apply the dynamic stress inversion method to the 2016 M 5 Cushing earthquake. The 556 557 M5 Cushing earthquake occurred on November 7th, 2016, near the city of Cushing in Oklahoma, which is the largest crude oil storage site in the USA, and also close to 558 559 numerous water disposal wells. There are many nearby stations for this event, but only 5 560 stations are within epicentral distance of 10 miles. We use seismic recordings at these 5 stations to perform the dynamic stress inversion with Green's functions calculated in 561 562 Section 4.2. The fault geometry (strike/dip/rake 60°/90°/0°), hypocenter location (3.4 km depth) and rupture speed (3km/s) are consistent with the previous kinematic study of this 563 564 event (Meng et al., 2021). Total fault dimension is of 6.5×6.5 km, with each subfault size 565 of 0.5×0.5 km. On each subfault, the STF is composed by four 0.2 s rectangles. The inverted final shear stress change and associated fault slip from the dynamic inversion are 566

shown in Figure 12ab. There are two separate stress drop (and slip) patches on the fault plane: one near the hypocenter and the other to the north (right) of the first patch, reflecting a complex rupture pattern even for a M 5 event. From the stress vs slip curves near the centers of two slip patches, we find the stress drop and slip weakening distance D₀ are larger near the hypocenter (Figure 12c) than in the second slip patch (Figure 12d).

572 For the 2016 Cushing earthquake, Meng et al. (2021) inverted a kinematic slip model. They further calculated the static stress change using the Coulomb3 software (Toda et al., 573 2011) based on the inverted slip on each subfault. Comparing results from two methods, 574 they both obtain two main slip/stress-drop patches with similar relative locations. The 575 inverted slip patches from the dynamic stress change inversion are slightly larger than those 576 from the kinematic slip inversion, and the maximum value of the stress drop and slip is 577 lower in the dynamic stress change inversion result. This difference may be related to more 578 model parameters in the dynamic stress inversion, for the given available data. In addition, 579 580 we do not capture frequency contents higher than 3 Hz in the numerical Green's function calculations in order to reduce computational costs, and the bandpass filtering applied for 581 both observation and Green's function waveforms is 0.2-2 Hz for the dynamic stress 582 583 inversion. For the kinematic slip inversion, the Green's functions, calculated based on a semi-analytical method (Zhu and Rivera, 2022), can carry very high frequency signal and 584 585 both observation and Green's function waveforms are bandpass filtered to higher frequency band (0.2-3Hz) for the Cushing earthquake (Meng et al., 2021). 586

587 **7. Discussion**

588 Compared with other fully dynamic inversions (the third line of efforts in Introduction),

589 which need to run dynamic rupture simulations many times during the inversion process,

we only need to calculate numerical Green's functions, the most time-consuming part, once through the whole inversion process. Because the forward numerical modeling is separated from the inversion part, similar to the kinematic inversion, we don't need to make priori assumptions, for example the yield strength, stress drop or friction parameters, to reduce inversion parameters or narrow down the parameter space. In addition, we invert not only for shear stress change but also for normal stress change, which could be significant in megathrust events (Xie and Cai, 2018).

Compared with the static and dynamic stress inversion methods based on kinematic 597 inversion results (the first and second lines of efforts in Introduction), we utilize physics-598 based models to calculate stress change Green's functions and directly fit the seismic data 599 instead of fitting preexisting kinematic slip models. If utilizing fault slip as input, the 600 uncertainties in slip from kinematic inversions will map into stress results. Furthermore, 601 some methods (e.g. Ide and Takeo, 1997) must split fault slip onto the two sides of the fault 602 603 to solve for the stress change, which may be very difficult (or not valid) for dip-slip faulting earthquakes such as megathrust events, in which the hanging wall has much larger 604 displacement than the footwall. In addition, our finite element models for Green's function 605 606 calculations can capture complex geometry of earthquake faults and use heterogeneous velocity structures, unlike some analytical methods that require a homogeneous medium 607 608 and/or simple fault geometry.

We remark that we need to find a balance between the computation efficiency and inversion resolution in the dynamic stress inversion. In the dynamic inversion, the source time function needs to convolve with the stress change Green's function to fit the recorded seismograms. For Green's function calculations with the FEM, finer element sizes are

needed for higher frequency contents, which could be computationally demanding. In 613 addition, we parameterize the source time function by several consecutive nonoverlapping 614 615 rectangles in this study. This represents a piecewise linear stress evolution over each rectangle duration (for example 0.2 s in this study). It would be interesting to test other 616 types of source time function in future studies, such as trapezoid for nonlinear stress 617 618 evolution. Finally, during Green's function calculations a unit stress change of 1 MPa is applied at each subfault uniformly over the first time step, under assumption that a small 619 subfault can be regarded as moving simultaneously. In the future, if we study large 620 megathrust earthquakes with much larger subfault dimension, e.g. 10 by 10 km in size, we 621 need to consider the rupture prorogation effect when calculating Green's functions on each 622 subfault. 623

One important contribution of the fault-stress model and the dynamic stress inversion 624 method developed in this study is to open a door for the scientific community to study fault 625 626 friction behaviors directly from seismic recordings, in addition to dominantly laboratory studies of fault friction in the literature. As shown in the synthetic and the real case 627 628 (Cushing) tests above, we can recover the slip-weakening process and the associate 629 parameter value (the critical slip distance D₀) well. With more studies in the future, we may be able to examine rate- and state-dependence of fault friction directly from seismic 630 631 observations, paving a way for finding parameter values of fault friction that are directly applicable to natural earthquakes, instead of extrapolating laboratory experiment results on 632 633 small rock samples to natural earthquakes, which is a challenging and classical scaling problem in geoscience. 634

The dynamic stress inversion method developed in this study shares common techniques 635 with classical kinematic slip inversion methods. In principle, techniques for kinematic slip 636 637 inversions that have been developed over many decades in the community can be readily used for a dynamic stress inversion based on the fault-stress model presented in Section 2. 638 The dynamic inversion method we develop in this study and its tests on the synthetic, 639 640 checkerboard models and the Cushing earthquake show that the fault-stress model works well. We encourage many colleagues in seismology to apply their kinematic slip inversion 641 methods and techniques they develop over years to perform dynamic stress inversions of 642 recent earthquakes, based on the fault-stress model presented in this study, to decipher 643 more physics from past earthquakes. It is our hope that this study provides a new paradigm 644 for the scientific community to perform seismic source inversions and study earthquake 645 source physics. 646

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648 **8.** Conclusions

In this study, we present a fault-stress model of earthquake sources, in comparison with the 649 fault-slip model that dominates in earthquake source studies. Based on the fault-stress 650 651 model, we develop a dynamic stress inversion method to invert for the coseismic stress evolution on the fault directly from seismic recordings. In this method, numerical Green's 652 653 functions at seismic stations are calculated by an explicit finite element method EQdyna 654 for a unit change of shear or normal stress on each sub-fault patch. Although 655 computationally demanding, they can be computed efficiently with high-performance supercomputers and require only one time calculation. We apply several constraints, 656 including zero normal slip (no separation or penetration of the fault), non-negative shear 657

slip (positive or zero shear slip), and moment constraints to invert for the dynamic stress 658 evolution with a least-squares method. Tests on a synthetic model, a checkerboard model 659 and the real dataset from the 2016 M 5 Cushing (Oklahoma) earthquake, show that the 660 method recovers well the dynamic stress changes during an earthquake with reliable 661 performance. We expect that the fault-stress model and associated dynamic stress inversion 662 663 methods such as one developed in this study will improve seismic source inversions significantly from a dynamic point of view. They provide the scientific community with a 664 new paradigm to study fault frictional behaviors, which govern dynamic rupture 665 propagation, directly from seismic recordings. In addition to recovering the critical slip 666 distance D₀ in the slip-weakening friction law as shown in this study, we may be able to 667 decipher rate- and state- dependence of fault friction and corresponding parameter values 668 that are applicable to natural earthquakes directly from seismic data in the future. 669

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671 Acknowledgements

This research is supported by NSF grants EAR-2013695 and EAR-2147340. The authors
appreciate Texas A&M High Performance Research Computing (<u>https://hprc.tamu.edu</u>) for
providing the advanced computer resources used in this study.

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677 Data Availability Statement

The data supporting the analysis and conclusions is given in figures and tables, in the main text and Supporting Information. The *EQdyna* code used in this study is available at <u>https://github.com/dunyuliu/EQdyna</u>. The waveform data for 2016 Cushing earthquake are 681 downloaded from Incorporated Research Institutions of Seismology (IRIS,
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Tables and Figures

Table 1. 1D Velocity Structure used in this study, based on the case for the 2016 M 5

851 Cushing earthquake.

Depth	Thickness	Vp	Vs	Density
(km)	(km)	(km/s)	(km/s)	(g/cm^3)
0.20	0.20	3.10	1.50	2.30
0.40	0.20	3.30	1.68	2.35
0.60	0.20	3.50	1.86	2.38
0.80	0.20	3.70	2.04	2.41
1.00	0.20	4.00	2.31	2.46
1.20	0.20	4.34	2.53	2.51
1.40	0.20	4.69	2.75	2.56
1.60	0.20	5.03	2.96	2.61
1.80	0.20	5.38	3.18	2.65
4.73	2.93	5.72	3.40	2.60
10.73	6.00	6.18	3.62	2.80
14.73	4.00	6.32	3.67	2.80
24.73	20.00	6.60	3.70	2.90
35.73	11.00	7.30	4.00	3.10
		8.20	4.70	3.40

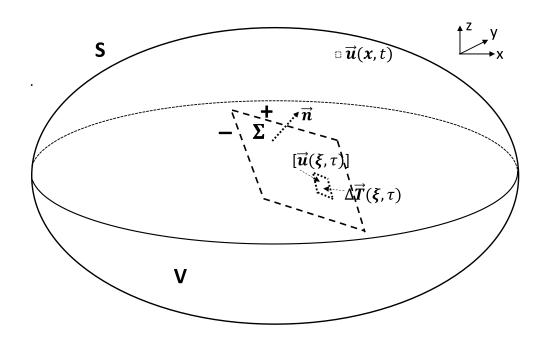
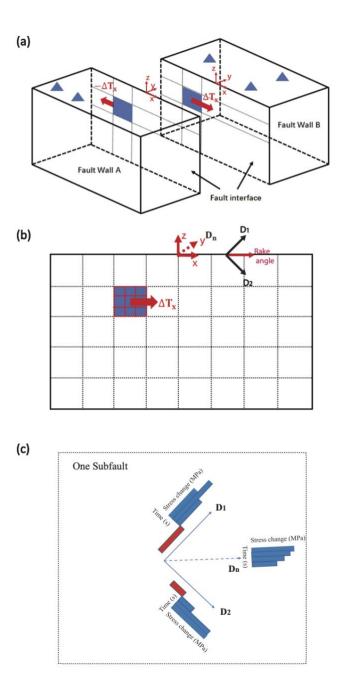




Figure 1. Schematic diagram for the fault-slip model and the fault-stress model of earthquake sources. A fault plane Σ , an internal surface with a unit normal vector **n** pointing from the – side (Σ^{-}) to the + side (Σ^{+}), is embedded within volume V that is enclosed by surface S. Dynamic faulting on Σ causes an earthquake, setting up seismic waves that propagate within V and can be recorded at a general point \mathbf{x} within V (e.g., displacement $\mathbf{u}(\mathbf{x},t)$). The fault-slip model of dynamic faulting characterizes the earthquake source as slip [**u**], i.e., the differential displacement between the two sides of the fault. The fault-stress model characterizes the earthquake source as traction change ΔT . Slip and traction change at a general point ξ on Σ are illustrated in the diagram.



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Figure 2. (a) A schematic diagram of the model for numerical Green's functions, which are calculated by applying unit stress changes on subfaults. The two fault walls, which are separated for a better visualization, are connected by tractions on the fault interface. The shaded patches show the two surfaces of a subfault with a unit of stress change ΔT_x along the x direction applied. The unit stress change of ΔT_x on fault wall B is in the opposite sign to that on the fault wall A. Triangles on the free surface indicate stations recording

seismograms. The coordinate system of the finite element model is shown. (b) A detailed 876 sketch of the fault interface on fault wall B. In the schematic case, the fault is divided into 877 5 by 8 subfaults. A unit stress change along the x direction ΔT_x is applied to the shaded 878 subfault. The shaded subfault consists of 9 elements. The coordinate system of the finite 879 element model is shown by x, y, z. A local coordinate system is defined by D_1, D_2 and D_n , 880 where D_1 is 45 degrees counterclockwise with the earthquake rake angle (rake-45), D_2 is 881 45 degrees clockwise to the earthquake rake angle (rake+45) and D_n is normal to the fault 882 plane, parallel with y direction in this diagram. (c) A schematic diagram of the stress change 883 source time functions, to be inverted, each composed of four rectangles, along three 884 directions $(D_1, D_2 \text{ and } D_n)$ on one subfualt interface on fault wall B. In this schematic case, 885 blue rectangles represent stress drops and red rectangles represent stress increases. 886 Direction $\mathbf{D}_{\mathbf{n}}$ is perpendicular to the fault plane (into the paper). 887

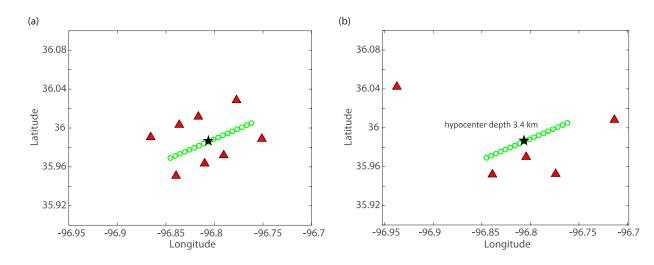


Figure 3. Surface trace of the vertical strike-slip fault (green circle chains) responsible for the 2016 M 5 Cushing (Oklahoma) earthquake with (a) eight virtual seismic stations distributed on two sides of the fault trace, and (b) five actual seismic stations that records the 2016 Cushing earthquake.

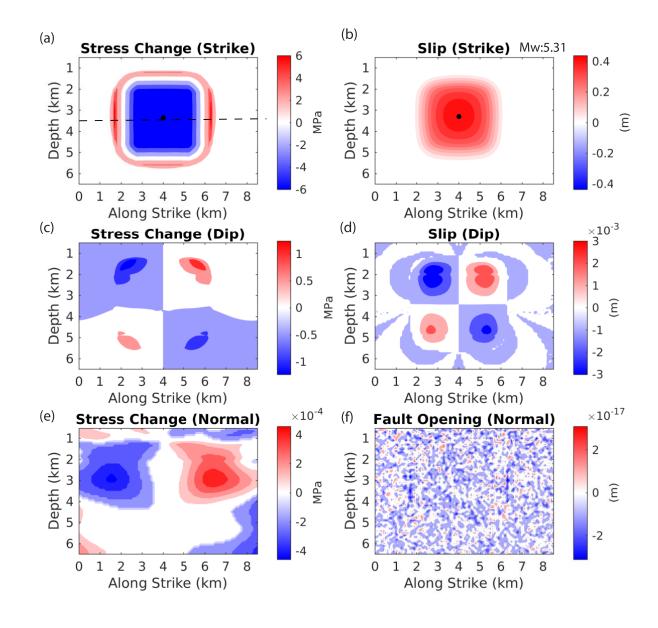
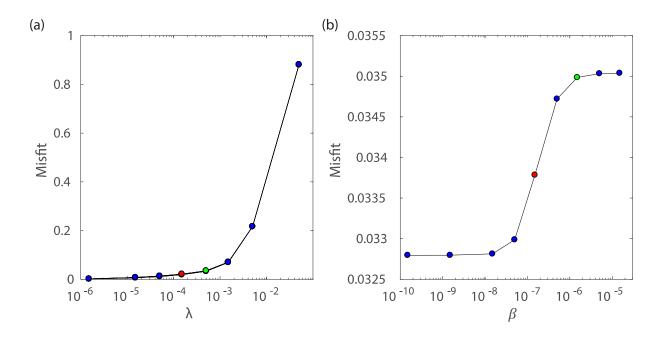




Figure 4. Final stress changes along (a) strike, (c) dip and (e) normal directions of the
synthetic rupture model A generate by FEM and associated fault slip in (b) strike, (d) dip
and (f) normal directions. The maximum slip is ~0.4 m and event magnitude is ~Mw 5.31.
The black dots shown in (a) and (d) represent the rupture initiation point in model A. The
shear stress profile shown by the dashed line in (a) is displayed in Fig. 7.



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Figure 5. (a) Relationship of smoothing factor λ vs misfit (for waveforms on eight virtual stations), while using nine different β factors shown in (b). The β factor value has a neglectable effect on misfit change, thus nine lines overlap with each other and seem like one curve. The red dot represents $\lambda = 1.5 * e^{-4}$ and the green dot represents $\lambda = 5 * e^{-4}$. (b) The relationship of β factor vs misfit, using the smoothing factor $\lambda = 1.5 e^{-4}$. The red dot represents $\beta = 1.5 * e^{-7}$ and the green dot represents $\beta = 1.5 * e^{-6}$.

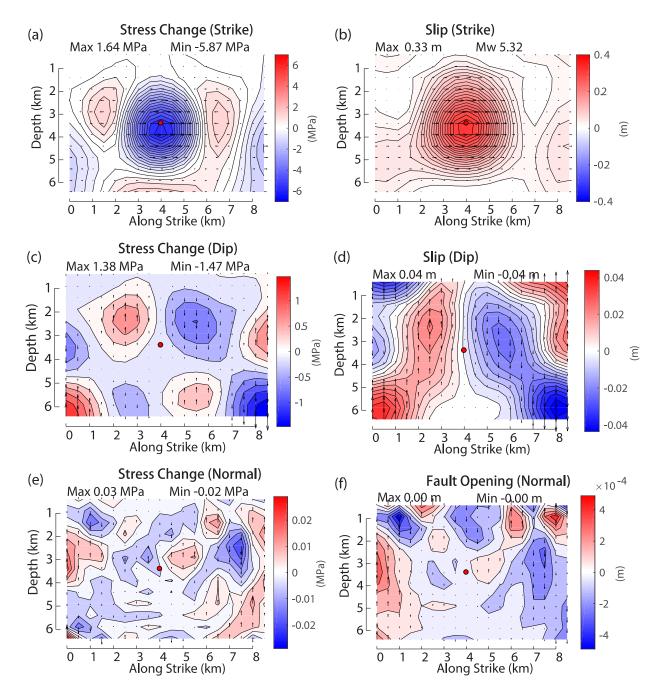


Figure 6. Inverted results INV1 for the synthetic rupture model A shown in Fig. 4, using $\lambda=5e^{-4}$ and $\beta=1.5e^{-6}$ shown with green dots in Fig. 5 and using seismic data from eight stations shown in Fig. 3a. (a)(c)(e) The inverted stress change on strike, dip and normal directions. (b)(d)(f) The inverted slip along strike, dip and normal directions. The red dots represent the hypocenter location.

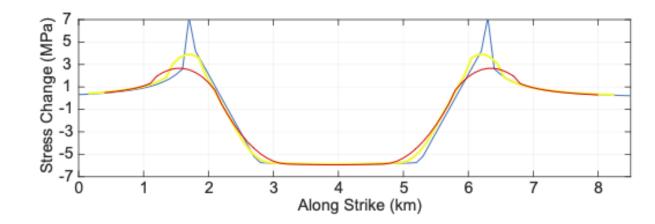
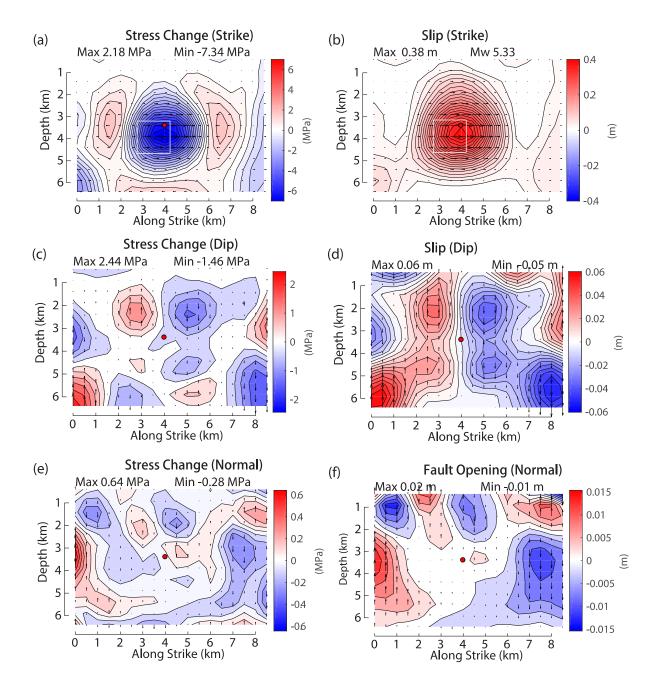


Figure 7 The stress change (blue line) along strike direction at depth of 3.5 km for the
synthetic model A, shown by dashed line in Fig. 4a. The stress change is then smoothed
over 500 m (one subfault) shown in yellow line and 1000 m (two subfault sizes) shown in
orange line.



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Figure 8. Inverted results INV2 for the synthetic rupture model A shown in Fig. 4, using $\lambda=1.5e^{-4}$ and $\beta=1.5e^{-7}$ shown with red dots in Fig. 5 and using seismic data from eight stations shown in Fig. 3a. (a)(c)(e) are inverted stress change in strike, dip and normal directions. (b)(d)(f) are associated slip along strike, dip and normal directions. The red dots represent the hypocenter location.

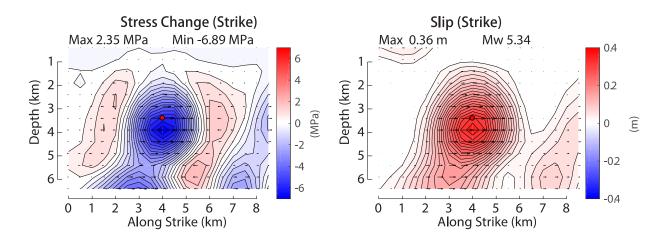




Figure 9. Inverted results INV3 for the synthetic rupture model A shown in Fig. 4, using $\lambda = 1.5e^{-4}$ and $\beta = 1.5e^{-7}$ shown with red dots in Fig. 5 and five seismic stations shown in Figure 3b. (a) is the inverted stress change in strike direction and (b) is the associated slip in strike direction.

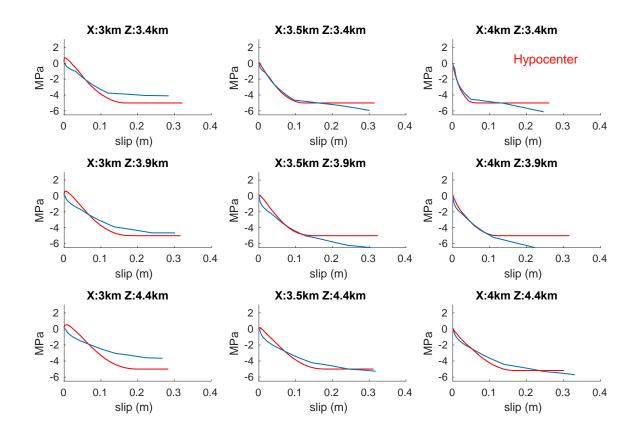


Figure 10. Slip vs stress curves for the forward model A (red lines) compared with slip vs
stress curves for the inverted result INV2 (blue lines), on grids located within the slip zone
outlined by white rectangles in Fig. 8ad. The top right panel represents slip-stress history
for near the hypocenter.

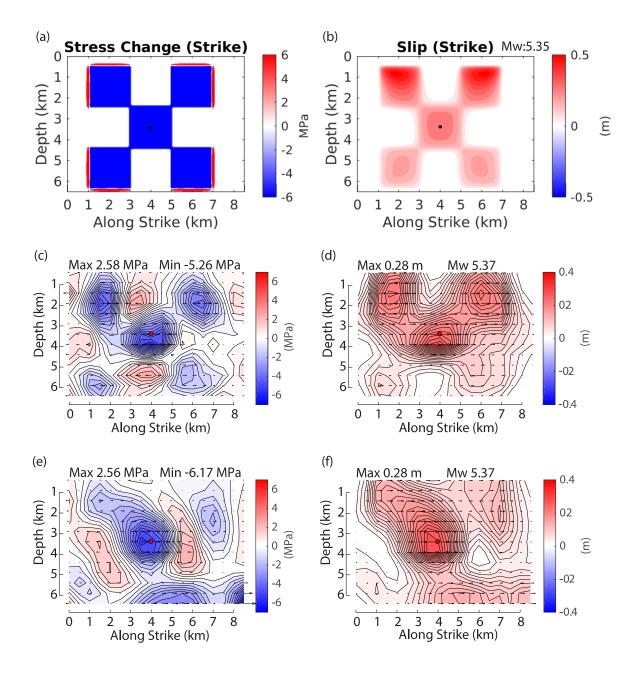




Figure 11. Checkerboard test results. (a)(b) The checkerboard model of stress changes and associated fault slip along strike direction. The black dot represents the rupture initiation point in the model. (c)(d) The inverted result for stress changes and fault slip along strike direction, using eight stations for inversion as shown in Fig. 3a. (e)(f) The inverted result for stress changes and fault slip along strike direction, using five stations for inversion as shown in Fig. 3b.

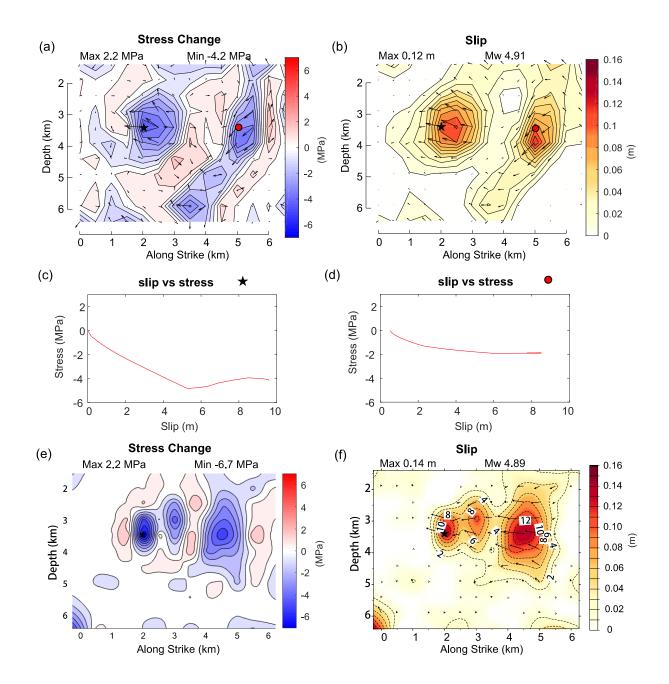


Figure 12. Comparison of the inverted stress change (a)(e) and resultant final slip (b)(f) between the dynamic stress inversion method (top) the kinematic slip inversion method (bottom). Slip-stress evolution history for the hypocenter (central point of the left slip patch in (a)) is shown in (c) and for the central point in another slip patch in (a) is shown in (d).