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Seismic moment tensors of acoustic emissions recorded during laboratory rock deformation experiments: sensitivity to attenuation and anisotropy

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SUMMARY

Seismic moment tensors can provide information on the size and orientation of fractures producing acoustic emissions (AEs) and on the stress conditions in the sample. The moment tensor inversion of AEs is, however, a demanding procedure requiring carefully calibrated sensors and accurate knowledge of the velocity model. In field observations, the velocity model is usually isotropic and time independent. In laboratory experiments, the velocity is often anisotropic and time dependent and attenuation might be significant due to opening or closure of microcracks in the sample during loading. In this paper, we study the sensitivity of the moment tensor inversion to anisotropy of P-wave velocities and attenuation. We show that retrieved moment tensors critically depend on anisotropy and attenuation and their neglect can lead to misinterpretations of the source mechanisms. The accuracy of the inversion also depends on the fracturing mode of AEs: tensile events are more sensitive to P-wave anisotropy and attenuation than shear events. We show that geometry of faulting in anisotropic rocks should be studied using the source tensors, since the P- and T-axes of the moment tensors are affected by velocity anisotropy and deviate from the true orientation of faulting. The stronger the anisotropy is, the larger the deviations are. Finally, we prove that the moment tensor inversion applied to a large dataset of AEs can be utilized to provide information on the attenuation parameters of the rock sample. The method is capable of measuring anisotropic attenuation in the sample and allows for detection of dilatant cracking according to the stress regime.

Key words: Earthquake source observation; Seismic anisotropy; Seismic attenuation; Wave propagation; Acoustic properties.

1 INTRODUCTION

During rock deformation experiments, thousands of acoustic emissions (AEs), are usually observed being caused by microfracturing inside the rock. They display source mechanisms similar to natural earthquakes (Ohtsu 1991; Lockner 1993; Graham et al. 2010; Kwiatek et al. 2011; Aker et al. 2014) but their size is different. AEs are much smaller and radiate much higher frequencies (e.g. Bohnhoff et al. 2009, their table 1). Since the rock deformation experiments are conducted under controlled conditions, the AEs are an ideal tool for studying spatio-temporal generation and evolution of fractures and can substantially help in understanding earthquake nucleation and propagation (Lockner 1993; Thompson et al. 2006, 2009; Stanchits et al. 2011). The processing of AE data is similar to that of earthquake observations. Aside from accurate location of AE hypocentres it is possible to determine fault-plane solutions (Zang et al. 2000; Charalampidou et al. 2015), to construct and investigate the magnitude–frequency relation and to evaluate the b-value (Zang et al. 1998), or to perform spatial and temporal analysis of waveforms (Kwiatek et al. 2014a). The source processes of AEs can also be studied by moment tensors widely used in earthquake seismology. The moment tensors provide information on the size and orientation of microfractures producing AEs, the slip direction, fracturing mode and ultimately the stress conditions in the sample.

First attempts to apply the moment tensor inversion to AE data were made in hydrofracture tests (Ohtsu 1991) and in studies of
concrete fracturing (Shigeishi & Ohtsu 2001; Finck et al. 2003). Graham et al. (2010) further compared the moment tensor inversion with the polarity methods developed by Zang et al. (1998) and found a concurrent set of results from both methods, similar to what was recently observed by Charalampidou et al. (2015). However, moment tensor inversion provides more detailed information about the fracture process in the source. The non-double-couple (non-DC) components of the moment tensors inform us about fracturing mode and physical properties of the rocks (Ohtsu 1991; Julian et al. 1998; Vavryčuk 2004, 2005; Aker et al. 2014).

The moment tensor inversion is a powerful tool but its application requires high-quality and well-calibrated data. Laboratory experiments should be well designed and amplifications of AE sensors and the coupling effects between the sensors and the rock specimen should be accurately determined. Recently, two new approaches for the sensor calibration were proposed by Davi & Vavryčuk (2012) and Kwiatek et al. (2014b). The method by Davi & Vavryčuk (2012) is based on a joint inversion of a set of seismic events for their moment tensors and for sensor amplifications. Kwiatek et al. (2014b) used ultrasonic transmission data for assessing the coupling and the sensitivity of the AE sensors as a function of the incidence angle of each ray. Both methods have proven to be efficient in determining or correcting for the sensor amplifications.

Progressive deformation in rock samples results in changes in P-wave velocities and attenuation (Stanchits et al. 2006; Hamiel et al. 2009). Stress-induced attenuation and velocity anisotropy is caused by the formation of microfractures and increases with differential stress. If anisotropy is neglected, the moment tensors are less accurate and can be misinterpreted (Sílený & Vavryčuk 2000, 2002). For example, shear faulting on planar faults produces DC moment tensors in isotropic media, but non-DC moment tensors in anisotropic media (Vavryčuk 2015a). The amount of the non-DC components depends on strength and symmetry of anisotropy and on the orientation of faulting. Since complexity of moment tensors in anisotropic media prevents from their direct interpretation, the analysis of moment tensors must be supplemented by determining source tensors. The source tensors are directly related to geometry of faulting and their interpretation is not biased by anisotropy (Vavryčuk 2005, 2015a).

In this study, we present a moment tensor inversion that accounts for anisotropy in the P-wave velocity and attenuation. We develop a joint inversion for the moment tensors of a set of seismic events (or AEs) and for the P-wave anisotropic attenuation. The methods are tested on synthetic data and applied to AEs observed during a triaxial compression experiment on a granite sample (Stanchits et al. 2006). The derived anisotropic attenuation is compared with that measured using the ultrasonic data. Finally, the moment tensors are used for calculating the source tensors, and the DC and non-DC components of the source tensors are interpreted.

2 THEORY

2.1 Moment tensor inversion

Displacement $u$ generated by a seismic point source is calculated using the representation theorem

$$u_i = M_{li} \ast G_{ikl},$$

where $M_{li} = M_{li}(t)$ denotes the seismic moment tensor, $G_{ikl}$ the spatial derivative of the Green’s tensor amplitudes, and symbol ‘$\ast$’ represents time convolution. Since we invert amplitudes, the convolution in eq. (1) is reduced to multiplication and the moment tensor is obtained as (e.g. Lay & Wallace 1995):

$$m = G^{-\varepsilon} u$$

with $G^{-\varepsilon} = [G^{-\varepsilon} J]^{-1} G^{T},$

$$G = \begin{bmatrix} G_{11}^{(1)} & G_{12}^{(1)} & G_{13}^{(1)} & G_{21}^{(1)} & G_{22}^{(1)} & G_{23}^{(1)} \\ G_{11}^{(2)} & G_{12}^{(2)} & G_{13}^{(2)} & G_{21}^{(2)} & G_{22}^{(2)} & G_{23}^{(2)} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ G_{11}^{(N)} & G_{12}^{(N)} & G_{13}^{(N)} & G_{21}^{(N)} & G_{22}^{(N)} & G_{23}^{(N)} \end{bmatrix},$$

$m$ is the moment vector composed of the six components of the moment tensor $M$,

$$m = \begin{bmatrix} M_{11} & M_{12} & M_{13} & M_{12} & M_{13} & M_{13} \end{bmatrix}^T,$$

and $u$ is the vector of displacement amplitudes observed at $N$ sensors,

$$u = \begin{bmatrix} u^{(1)} & u^{(2)} & \ldots & u^{(N)} \end{bmatrix}^T.$$

The spatial derivatives of the Green’s function $G_{il}^{(i)}$ are calculated for the $l$th sensor by:

$$G_{i1}^{(1)} = g_{i1}^{(1)},$$

$$G_{i2}^{(1)} = g_{i2}^{(1)},$$

$$G_{i3}^{(1)} = g_{i3}^{(1)},$$

$$G_{i4}^{(1)} = g_{i4}^{(1)} + g_{i5}^{(1)},$$

$$G_{i5}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

$$G_{i6}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

$$G_{i7}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

$$G_{i8}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

and $g_{ik}^{(1)}$ is the amplitude at the $k$th sensor produced by the point force directed along the $x_k$-axis. The amplitude is calculated for the direction along the sensor axis.

2.2 Green’s function in homogeneous anisotropic attenuating media

To determine moment tensor $M$ using eq. (2), we have to calculate the Green’s function and particularly its spatial derivative $G_{ikl}$. For anisotropic attenuating media, the Green’s function can be calculated using a model of viscoelastic anisotropy. This model describes joint velocity anisotropy and attenuation by introducing complex-valued, frequency-dependent, viscoelastic parameters (Auld 1973; Carcione 2007; Vavryčuk 2007a,b, 2015b). The real part of the parameters controls the propagation velocity and their imaginary part controls the wave attenuation.

The asymptotic Green’s function and its spatial derivative in homogeneous, anisotropic, viscoelastic media reads (Vavryčuk 2007a, his eqs. 18 and 19):

$$G_{kl}(x, \omega) = \frac{1}{4\pi \rho v \sqrt{|K|}} \frac{g_k g_l}{r} \exp (i\sigma_0 + i\omega \mathbf{p}_0 \cdot \mathbf{x}),$$

$$\frac{\partial}{\partial x_n} G_{kl}(x, \omega) = \frac{i\omega}{4\pi \rho v \sqrt{|K|}} \frac{g_k g_l P_{0n}}{r} \exp (i\sigma_0 + i\omega \mathbf{p}_0 \cdot \mathbf{x}),$$

where

$$\sigma_0 = -\frac{1}{2}(\varphi_1 + \varphi_2),$$

$$-\frac{3}{2} \pi \leq \varphi_1 \leq -\frac{1}{2} \pi,$$

$$-\frac{3}{2} \pi \leq \varphi_2 \leq -\frac{1}{2} \pi,$$

and $\mathbf{p}_0$ is the stationary slowness vector (see Vavryčuk 2007a,b). Quantity $K = K_1 K_2$ is the Gaussian curvature of the slowness surface, $K_1$ and $K_2$ are the principal curvatures, and $\varphi_1$ and $\varphi_2$ are the spatial derivative of the Green’s function amplitudes, $M_{kl}$ is the moment vector composed of the six components of the moment tensor $M$, $M = \begin{bmatrix} M_{11} & M_{12} & M_{13} & M_{12} & M_{13} & M_{13} \end{bmatrix}^T$, and $u$ is the vector of displacement amplitudes observed at $N$ sensors, $u = \begin{bmatrix} u^{(1)} & u^{(2)} & \ldots & u^{(N)} \end{bmatrix}^T$. The spatial derivatives of the Green’s function $G_{il}^{(i)}$ are calculated for the $l$th sensor by:

$$G_{i1}^{(1)} = g_{i1}^{(1)},$$

$$G_{i2}^{(1)} = g_{i2}^{(1)},$$

$$G_{i3}^{(1)} = g_{i3}^{(1)},$$

$$G_{i4}^{(1)} = g_{i4}^{(1)} + g_{i5}^{(1)},$$

$$G_{i5}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

$$G_{i6}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

$$G_{i7}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

$$G_{i8}^{(1)} = g_{i1}^{(1)} + g_{i5}^{(1)},$$

and $g_{ik}^{(1)}$ is the amplitude at the $k$th sensor produced by the point force directed along the $x_k$-axis. The amplitude is calculated for the direction along the sensor axis.
\( \varphi_2 \) are their phase angles. All quantities dependent on slowness vector \( \mathbf{p} \) are evaluated at stationary point \( \mathbf{p}_0 \). Position vector \( \mathbf{r} \), ray vector \( \mathbf{N} \), frequency \( \omega \), phase angles \( \varphi_i \), and \( \varphi_2 \), and density \( \rho \) are real-valued; but polarization vector \( \mathbf{g} \), Gaussian curvature \( K \), principal curvatures \( K_1 \) and \( K_2 \), energy velocity \( v \) and slowness vector \( \mathbf{p}_0 \) are complex-valued. The meaning of the complex-valued quantities is discussed in detail in Vavryčuk (2007a).

### 2.3 Elliptic viscoelastic anisotropy

The wave quantities in eqs (7) and (8) depend on 21 complex-valued viscoelastic parameters. The problem is simplified if we assume elliptic, viscoelastic, anisotropic media, when the slowness surface is spheroidal (Helbig 1994) and the medium is described by two viscoelastic parameters \( a_{11} \) and \( a_{33} \). The stationary slowness vector \( \mathbf{p}_0 \), energy velocity vector \( \mathbf{v} \), and the Gaussian curvature of the slowness surface \( K \) can be expressed as follows (Vavryčuk & Yomogida 1996):

\[
\mathbf{p}_0 = \frac{1}{\sqrt{a_{11} N_1^2 + a_{33} N_2^2 + a_{11} N_3^2}} \left[ N_1 a_{33}, N_2 a_{33}, N_3 a_{11} \right]^T,
\]

\[
\mathbf{v} = [a_{11} p_{01}, a_{11} p_{02}, a_{33} p_{03}]^T,
\]

\[
K = \frac{a_{11}^2 a_{11}}{v^2} [a_{11} p_{01}, a_{11} p_{02}, a_{33} p_{03}]^T,
\]

where \( N \) is the real ray direction vector, and \( v \) is the complex energy velocity calculated as

\[
v = \sqrt{v_1 v_2}.
\]

For simplicity, the polarization vector of direct \( P \) waves in eqs (7) and (8) are identified with the ray direction. The information on phase \( \varphi_0 \) is not important, because we do not analyse phase shifts but only amplitudes.

The quantities in eqs (9)–(12) are expressed using real ray direction \( \mathbf{N} \) and two complex parameters \( a_{11} \) and \( a_{33} \) describing the elliptic anisotropy. Parameters \( a_{11} \) and \( a_{33} \) can be determined in a laboratory experiment by measuring velocities and \( Q \)-factors (or attenuations) in the horizontal and vertical directions in the sample. Since the ray and phase quantities (velocities and \( Q \)-factors) coincide in the horizontal direction as well as in the vertical direction, the parameters \( a_{11} \) and \( a_{33} \) can be calculated from real ray velocities \( V_H \) and \( V_H \), and ray \( Q \)-factors \( Q_V \) and \( Q_H \) as follows (see Vavryčuk 2015b, his eq. 21):

\[
a_{11} = V_H^2 \left( 1 - \frac{l}{Q_H} \right), \quad \text{and} \quad a_{33} = V_H^2 \left( 1 - \frac{l}{Q_V} \right).
\]

The vertical and horizontal \( Q \)-factors can be determined from the horizontal and vertical attenuations \( A_H \) and \( A_V \), which control amplitude decay of waves along the vertical and horizontal rays (Vavryčuk 2008, his eqs 51 and 59):

\[
Q_H = \frac{1}{2 A_H V_H}, \quad \text{and} \quad Q_V = \frac{1}{2 A_V V_V}.
\]

### 2.4 Moment and source tensors

Moment and source tensors are basic quantities defining seismic point sources. The source tensor \( \mathbf{D} \) describes geometry of faulting, and the moment tensor \( \mathbf{M} \) describes body dipole forces acting at the source. The source tensor \( \mathbf{D} \) is expressed as (Ben-Zion 2003; Vavryčuk 2005):

\[
D_{ij} = \frac{u S}{2} (s_k n_i + s_i n_k) ,
\]

where unit vectors \( \mathbf{n} \) and \( s \) denote the crack normal and the direction of the slip vector, \( u \) is the slip magnitude, and \( S \) is the crack area. If vectors \( \mathbf{n} \) and \( s \) are perpendicular (the slip vector is along the crack), the source tensor is double couple and describes shear faulting.

The moment tensor \( \mathbf{M} \) is calculated from the source tensor \( \mathbf{D} \) and elastic stiffness parameters \( c_{ijkl} \) using the generalized Hooke’s law

\[
M_{ij} = c_{ijkl} D_{kl} .
\]

In anisotropic media, the source and moment tensors diagonalize in different systems of eigenvectors, called the \( P \), \( N \) and \( T \)-axes (pressure, neutral and tension axes).

If moment tensor \( \mathbf{M} \) is known, the source tensor \( \mathbf{D} \) is calculated by inverting eq. (16):

\[
D_{ij} = S_{ijkl} M_{kl} ,
\]

where \( S_{ijkl} \) are the elastic compliance parameters determined from elastic stiffness parameters \( c_{ijkl} \) as described, for example, in Auld (1973).

Eq. (17) indicates that a straightforward interpretation of moment tensors in terms of faulting geometry is possible in isotropic media only. For example, shear faulting in isotropic media is represented by the standard DC moment and source tensors. In anisotropic media, the source tensor of shear faulting is still double couple (see eq. 15). However, the moment tensor becomes more complicated being affected not only by geometry of faulting but also by material properties in the focal zone (see eq. 16). The moment tensors can take a general form with non-zero isotropic (ISO), DC and compensated linear vector dipole (CLVD) components even for simple shear faulting on a planar fault (Vavryčuk 2004, 2015a). Therefore, geometry of faulting of AEs in anisotropic media should be determined from the DC and non-DC components of the source tensors.

### 3 SETUP OF THE EXPERIMENT

We analyse AE data collected by Stanchits et al. (2006) during triaxial compression experiments on a granite sample. The cylindrical sample (diameter 50 mm, length 100 mm) was subjected to three different stress cycles at successively decreasing confining pressure of 60, 40 and 20 MPa, respectively. During the two first stress cycles, the sample was loaded by axial vertical compression up to a maximum axial load of 500 MPa. During the lowest confining pressure cycle, the sample was loaded up to macroscopic failure. AE activity
measured. $P_H$ and $P_V$ are the piezoelectric sensors measuring the $P$-wave velocity in the horizontal and vertical directions. $S_{HH}$ are the shear sensors polarized in the horizontal direction, $S_{HV}$ are the shear sensors polarized in the vertical direction.

![Figure 1](image1.png)

Figure 1. Projected sample surface with positions of 20 ultrasonic sensors as a function of azimuth (in the horizontal plane) and vertical coordinate $z$. $P_H$ and $P_V$ are the piezoelectric sensors measuring the $P$-wave velocity in the horizontal and vertical directions. $S_{HH}$ are the shear sensors polarized in the horizontal direction, $S_{HV}$ are the shear sensors polarized in the vertical direction.

and velocity changes were monitored by twelve $P$-wave and eight $S$-wave piezoelectric sensors (Fig. 1) with a sampling frequency of 10 MHz. We analysed the $P$-wave data only, since the $S$-wave data were contaminated by strong coda waves (Fig. 2). The axial loading rate was servo-controlled using the AE control. For repeated $P$-wave velocity measurements, six $P$ sensors and four $S$ sensors were used as emitters by applying 100 V pulses every 30–40 s during loading and the remaining sensors were recording the transmitted signals. Two pairs of strain gages were glued directly onto the sample surface for calculating the volumetric strain (global measurement). The ultrasonic measurements of the $P$-wave velocity revealed that the originally isotropic sample became anisotropic under axial loading.

The $P$-wave velocity markedly decreased in the horizontal direction and slightly increased in the vertical direction while the axial loading was increasing (Fig. 3). After unloading, the sample became again almost isotropic. Stanchits et al. (2006) analysed AEs and distinguished between the $T$- (tensile), $C$- (compaction) and $S$-type (shear) events according to the observed polarities of the $P$ waves. With increasing axial stress, the $T$-type events were dominant. Close to failure, the $S$-type events became increasingly important.

The loading cycles at 60, 40 and 20 MPa produced a different level of damage of the sample and different anisotropy strength during loading. The most extreme changes were observed for the loading cycle at 20 MPa. The rock sample was loaded until macroscopic failure and therefore highly damaged and inhomogeneous. Strength of the $P$-wave anisotropy increased up to 50 per cent before the failure. The complex structure with extensive fracture systems produced a complicated scattered wave field difficult to interpret and invert for moment tensors. Therefore, we focused on the loading cycle at 40 MPa where the rock sample remained homogeneous and was weakly damaged. The strength of anisotropy developed during the loading cycle was high enough ($P$-wave anisotropy strength increased up to 24 per cent, see Fig. 3a) to produce detectable effects in the wave field and the waveforms of AEs. The waveforms of AE were interpreted with no major problems and the moment tensor inversion worked safely.

We applied a method of Stanchits et al. (2003, their eq. 3) to calculating vertical and horizontal attenuations in the sample from ultrasonic transmission data. We selected sensors PV11 and PV12 for estimating the vertical attenuation and sensors PH9 and PH10 for estimating the horizontal attenuation (Fig. 1). The measurements do not allow estimating absolute values of attenuation. However, we were able to determine the temporal evolution of the relative values of attenuation from repeating measurements. The vertical attenuation (parallel to axial stress) was decreasing due to the closure of the horizontal microcracks and the compacted pore space, while the horizontal attenuation was increasing due to the opening of vertically oriented, dilatant microcracks (Fig. 3d).

4 SYNTHETIC TESTS

Prior to analysis of observations of AEs, we performed synthetic tests to assess the accuracy of the moment and source tensor inversions for a given experimental setup. We focused on studying the sensitivity of the retrieved moment and source tensors to anisotropy and attenuation of a rock sample and evaluated errors produced by the inversion when anisotropy or attenuation are neglected.

4.1 Sensor configuration and model of the medium

The sensor configuration and the locations of events were taken from the laboratory experiment (Figs 1 and 4). We selected a subset of 429 events located in the centre of the sample to ensure good azimuthal coverage of sensors on the focal sphere (Fig. 4b) needed for a stable moment tensor inversion.

In forward and inverse modelling of moment tensors we employed the Green’s function for elliptic, anisotropic, attenuating media (see Sections 2.2 and 2.3). To evaluate the sensitivity of source and moment tensors to velocity anisotropy and attenuation we assumed three alternative medium models:

1. Anisotropic attenuating model: defined by time-dependent velocity and attenuation anisotropy consistent with ultrasonic measurements in the experiment. The horizontal and vertical velocities...
Figure 3. (a) Vertical (measured by sensors 11–12) and horizontal (measured by sensors 9–10) P-wave velocities, (b) applied axial stress and acoustic emission rate and (c) volumetric strain measured by Stanchits et al. (2006). Plot (d) shows the relative horizontal attenuation measured by sensors 9–10 (blue line) and vertical attenuation measured by sensors 11–12 (red line) derived from ultrasonic transmission data after Stanchits et al. (2003, their eq. 3). The confining pressure was 40 MPa during the loading cycle.

are shown in Fig. 3(a). The horizontal and vertical attenuations $A_{\text{H}}$ and $A_{\text{V}}$ follow the time dependence of the relative attenuation measurements shown in Fig. 3(d). The relative attenuation was scaled to start at the value of $3.4 \times 10^{-3}$ s km$^{-1}$. During loading, the horizontal attenuation increased up to $5.6 \times 10^{-3}$ s km$^{-1}$ but the vertical attenuation decreased down to $3.2 \times 10^{-3}$ s km$^{-1}$. Since the velocity and attenuation anisotropy was time dependent during the loading cycle, the model was specified for individual AEs according to their origin time.

(2) Isotropic attenuating model: obtained from the anisotropic attenuating model by neglecting the velocity anisotropy. Instead, a constant directionally independent P-wave velocity of 5.2 km s$^{-1}$ was assumed.

(3) Anisotropic elastic model: obtained from the anisotropic attenuating model by neglecting attenuation. The parameters of the velocity anisotropy remained unchanged.

The anisotropic attenuating model is the true model used for calculating synthetic amplitudes imitating observations of AEs. The anisotropic elastic and isotropic attenuating models are used in the moment tensor inversions for assessing the sensitivity of moment tensors to velocity anisotropy and attenuation of the medium.

4.2 Source model of AEs

The sources of AEs were calculated using the tensile-source model (see Fig. 5). The crack normal $\mathbf{n}$ and the slip direction $\mathbf{s}$ in this model are defined by strike $\phi$, dip $\delta$, rake $\lambda$ and slope $\alpha$ as follows (Vavryčuk 2011):

$$n_1 = -\sin \delta \sin \phi,$$
$$n_2 = \sin \delta \cos \phi,$$
$$n_3 = -\cos \delta,$$  \hspace{1cm} (19)
Figure 4. Locations of AEs plotted in the x–z projection for: (a) all 1278 events and (b) the selected subset of 429 events, covering the inner part of the sample.

Figure 5. Model of a tensile source. Σ is the plane of crack, u is the slip vector, n is the crack normal, and α is the slope angle defined as the deviation of slip vector u from the plane of crack. Angle β is β = (α − 90°)/2. The P_S- and T_S-axes are the eigenvectors of the source tensor and are mutually perpendicular. For details, see Vavryčuk (2011).

\[ s_1 = (\cos \lambda \cos \phi + \cos \delta \sin \lambda \sin \phi) \cos \alpha - \sin \delta \sin \varphi \sin \alpha, \]
\[ s_2 = (\cos \lambda \sin \phi - \cos \delta \sin \lambda \cos \phi) \cos \alpha + \sin \delta \cos \phi \sin \alpha, \]
\[ s_3 = -\sin \lambda \sin \delta \cos \alpha - \cos \delta \sin \alpha. \]

(20)

This source model allows the cracks to be opened or closed during shear failure at the source. The inclination of the slip vector from the plane of a crack is called the slope angle. The slope ranges from −90° to 90°. It is positive for tensile events (opening cracks) and negative for compressive events (closing cracks). If its absolute value is small, the source is predominantly shear. Source tensor D is calculated from vectors n and s using eq. (15). Moment tensor M is obtained from source tensor D and elastic parameters of the medium using eq. (18).

We generated two synthetic datasets: one contained pure shear events and the other tensile events. To model the source mechanisms of AEs representative for the triaxial loading experiments we chose shear events with dips from 30° to 60°, rakes from −120° to −50° and strikes from 0° to 360°, and tensile events with dips from 45° to 60°, rakes from −100° to −70° and strikes from 0° to 360°. The slope angle is 0° for shear events and between 25° and 26° for tensile events. The non-DC content (ISO + CLVD) of moment tensors of tensile events is about 60 per cent (calculated according to the standard decomposition formulas of Vavryčuk 2015a).

The synthetic P-wave amplitudes at each sensor were calculated using eq. (1) from the moment tensors of shear or tensile events and from the spatial derivatives of the Green’s function for the true anisotropic attenuating medium. The synthetic amplitudes served as the ‘observed’ data for the moment tensor inversion using eq. (2).

4.3 Analysis of shear AEs

The P-wave amplitudes of shear AEs were inverted for the moment and source tensors assuming: the anisotropic attenuating medium, the isotropic attenuating medium, and the anisotropic elastic medium (Fig. 6). The results are shown using the P- and T-axes on the focal sphere and the non-DC components in the diamond CLVD-ISO plots. To assess the quality of the retrieved moment
Figure 6. Synthetic tests of the moment and source tensor inversions of shear AE events. The $P$-axes (red circles in focal spheres) and $T$-axes (blue plus signs in focal spheres) and the non-DC components (black dots in diamond plots) are calculated for the source tensors (upper plots) and moment tensors (lower plots) of AEs in (a) anisotropic attenuating model, (b) isotropic attenuating model and (c) anisotropic elastic model.

The normalized rms error between theoretical and observed amplitudes is determined using the following formula:

$$\text{rms} = \sqrt{\frac{1}{N} \sum_{i=1}^{N} \left( A_{\text{obs}}^{i} - A_{\text{theor}}^{i} \right)^{2}}$$

where $A_{\text{theor}}^{i}$ are the theoretical amplitudes predicted by the retrieved moment tensor, and $A_{\text{obs}}^{i}$ are the synthetic amplitudes imitating observations. Subscript $i$ is the sequential number of the sensor, and $N$ is the total number of sensors at which the amplitudes were recorded for the respective event.

If the true anisotropic attenuating medium is used for calculating the Green’s function in the inversion, the retrieved moment and source tensors are correct (Fig. 6a) and the rms is zero. The $P_S$- and $T_S$-axes (i.e. the source tensors $P$- and $T$-axes) reflect the true geometry of faulting (see eq. 15). If the medium is mismodelled by using the isotropic attenuating model (Fig. 6b) or anisotropic elastic model (Fig. 6c), the $P_S$- and $T_S$-axes as well as the $P_M$- and $T_M$-axes found in the inversion are similar to the true $P_S$- and $T_S$-axes. Hence, the orientation of faulting is described adequately by the $P$- and $T$-axes of both tensors regardless of the velocity and attenuation model considered in the inversion.

The non-DC components of the source and moment tensors behave differently. They are zero for true source tensors (Fig. 6a, ...
upper CLVD-ISO plot but non-zero for true moment tensors (Fig. 6a, lower CLVD-ISO plot). The non-DC components of true moment tensors are produced by the velocity and attenuation anisotropy in the focal zone (see eq. 16). The upper CLVD-ISO plots in Figs 6(b) and (c) document that the velocity mismodelling by neglecting anisotropy or attenuation produces false non-DC components in the source tensors. In particular, the CLVD component is affected and the errors are about three times larger than those of the ISO component. Also, the retrieved non-DC components are biased and more scattered than the true ones (Fig. 6, lower CLVD-ISO plots).

If the velocity anisotropy is neglected, the rms values increase with proceeding deformation. Anisotropy becomes stronger during the loading cycle and the assumption of an isotropic medium becomes more inadequate (Fig. 7a).

4.4 Analysis of tensile AEs

A dataset of tensile AEs was analysed analogously to the shear AEs. Again, the source tensors for the anisotropic attenuating medium (Fig. 8a, upper plot) describe the true faulting geometry of the events. The distribution of the $P$- and $T$-axes shows that moment tensors of tensile events (Fig. 8a, lower plot) are more sensitive to anisotropy than those of shear events (Fig. 6a, lower plot). The $P$- and $T$-axes are remarkably different from the $PS$- and $TS$-axes and cannot easily be interpreted in terms of geometry of faulting.

When the $P$-wave amplitudes are inverted assuming the isotropic attenuating model, the clustering of the $P$- and $T$-axes is lost due to velocity mismodelling (Fig. 8b, upper plot). The uncertainties are high and the interpretation of faulting parameters from the source tensors becomes impossible. By contrast, neglecting attenuation does not influence significantly the directions of the retrieved $P$- and $T$-axes (Fig. 8c, upper plot). Their deviations from the true directions are small.

Focussing on the non-DC components, the sensitivity to neglecting anisotropy or attenuation is similar for moment and source tensors. The retrieved non-DC components are biased and more scattered than the true ones. Especially, the CLVD component is sensitive to mismodelling of the medium, because the errors are about three times larger than those of the ISO (Figs 8b and c). In general, the sensitivity of the non-DC components of tensile events is comparable to that of shear events.

4.5 Inversion for anisotropic attenuation

We examined whether observations of AEs could jointly be inverted for moment tensors and attenuation of the medium. The synthetic dataset was created analogously to the previous datasets of tensile AEs, except for the value of the slope angle. While the range of the slope was very narrow in the previous tests (between $25^\circ$ and $26^\circ$), here the slope ranged from $-10^\circ$ to $25^\circ$. These values were found in the analysis of observed AEs. The true vertical and horizontal attenuations $A_V$ and $A_H$ were $3.4 \times 10^{-3}$ and $5.6 \times 10^{-3}$, respectively. To simulate realistic observations of AEs, we contaminated synthetic amplitudes with uniformly distributed, random noise with a noise level up to 30 per cent of the amplitude at the respective sensor.

We repeatedly inverted the synthetic data of tensile AEs for their moment tensors assuming various velocity models. We fixed velocity anisotropy (taken from the experiment, see Fig 3a) and varied horizontal and vertical attenuations. In the inversion, we simplified the problem assuming attenuation to be time-independent. The optimum horizontal and vertical attenuation values have been found by minimizing the mean rms of all events in a grid with horizontal...
and vertical attenuations ranging from 0 to $9.4 \times 10^{-3}$ s km$^{-1}$ in steps of $2 \times 10^{-4}$ s km$^{-1}$.

The results of the inversion are shown in Fig. 9. The rms function is smooth ranging between 0.069 and 0.348. The minimum rms is found for vertical attenuation of $3.2 \times 10^{-3}$ and for horizontal attenuation of $5.8 \times 10^{-3}$. A good correspondence of the results with the true values indicates that the inversion is sufficiently robust and thus applicable to real observations. Similar results have also been obtained when calculating the misfit between the inverted and true amplitudes using the L1-norm instead of the standard L2-norm, and when 5 or 10 per cent of events with the highest rms (i.e. outliers) have been removed when calculating the mean rms.

5 APPLICATION TO LABORATORY DATA

5.1 Sensor calibration

Since measuring correct amplitudes is a key factor in determining accurate moment tensors, sensors of AEs must be carefully calibrated and coupling effects between the sensors and a specimen should be suppressed. We apply two methods for calibrating the AE sensors. First, the ‘ultrasonic calibration’ (Kwiatek et al. 2014b), which employs ultrasonic transmission data for evaluating sensor amplifications and coupling effects. Second, the ‘network calibration’ (Davi & Vavryčuk 2012; Davi et al. 2013), based on a
4.5 Joint inversion of many AE events for moment tensors and sensor amplifications.

Both methods yielded amplification factors ranging between 0.75 and 1.3 and detected no problems with coupling for 9 of 12 sensors (see Fig. 10). The other three sensors (sensors 3, 11 and 12) were calibrated just by the network calibration, because the ultrasonic calibration produced unstable results. The network calibration revealed that sensors 3 and 11 had slightly anomalous amplifications (1.4 and 0.5) and sensor 12 had a flipped polarity and amplification close to zero. Therefore, sensor 12 was excluded from the analysis and data recorded at the other sensors were corrected by the found amplifications.

5.2 Inversion for anisotropic attenuation

The inversion for attenuation of the rock sample was run for a set of 429 of 1277 AEs, which occurred in the centre of the sample and displayed good coverage of sensors on the focal sphere (Fig. 4b). Amplitudes of AEs were picked using an automatic picking algorithm based on the Akaike information criterion (Leonard & Kennet 1999), and inverted for moment tensors by eq. (2). The inversion of the AEs was repeated for a set of anisotropic, attenuating models with fixed time-dependent velocity anisotropy and variable attenuation. The anisotropic velocity was taken from ultrasonic measurements (Fig. 3a) and the anisotropic attenuation varied in the same grid as in the synthetic test (Section 4.5). For each combination of the vertical and horizontal attenuations, we calculated the mean rms for the analysed dataset of AEs and searched for its minimum corresponding to the optimum anisotropic attenuation.

We obtained a smooth 2-D function of rms with its minimum of 0.21 for the horizontal attenuation of $5.6 \times 10^{-3}$ s km$^{-1}$ and for the vertical attenuation of $3.4 \times 10^{-3}$ s km$^{-1}$ (Fig. 11). The sensitivity of the solution to the norm applied to calculating the misfit between observed and synthetic amplitudes (the L1- or L2-norm) and to the number of outliers was tested similarly as in the synthetic test (see Section 4.5). We found that the results are not changing and the solution remains stable.

Since attenuation in the rock sample is changing with increasing axial load, the inversion yields just a rough estimate of attenuation averaged over the loading cycle. Nevertheless, we clearly observe a higher value of attenuation in the horizontal direction compared to the vertical direction. This directional dependence is in good correspondence with ultrasonic measurements (Fig. 3d). During loading of the rock specimen, the horizontal cracks are closing and the pore space is compacted in the vertical direction. Consequently, elastic waves travelling in the vertical direction are less attenuated and the $P$-wave amplitudes as well as the $P$-wave velocities increase. By contrast, vertical cracks are opening causing a reduction of the $P$-wave amplitude and velocity and an increase in horizontal attenuation (i.e. direction parallel to the crack normal, see Hudson 1981). Also strain measurements show that dilatant cracking
becomes increasingly important in the horizontal direction (Stanchits et al. 2006).

5.3 Sensitivity of moment and source tensors to anisotropy and attenuation

Similarly as in the synthetic tests of the sensitivity of the moment and source tensors to anisotropy and attenuation (Section 4), we run the inversion of observed AEs using three medium models: anisotropic attenuating model, isotropic attenuating model and anisotropic elastic model. The parameters of velocity anisotropy of the sample are taken from ultrasonic measurements (see Fig. 3a). The attenuation parameters were time-dependent according to the measurements (see Fig. 3d) and scaled by values determined in the previous section: $5.6 \times 10^{-3}$ and $3.4 \times 10^{-3}$ s km$^{-1}$ in the horizontal and vertical directions, respectively.

The results are as follows. First, rms values tend to increase with increasing axial load up to 0.5 independently of the medium model (Fig. 12). This increase probably reflects the continuous fracturing with increasing load, which is not fully described by the adopted homogeneous medium models. Second, neglecting the velocity anisotropy has a significant impact on the retrieved focal mechanisms. The $P_T$- and $T_S$-axes are nearly horizontal. This behaviour is physically reasonable and in correspondence with the applied stress regime. Third, the non-DC components of the moment and source tensors are rather stable in all three inversions (Fig. 13). The ISO and CLVD components are predominantly positive indicating that mainly tensile (opening) cracks were activated. The scatter in the CLVD component is higher than that in the ISO component. Similar observations are reported by Stierle et al. (2014).

The errors produced by mismodelling of the medium also depend on the fracturing mode of AEs: tensile events are more sensitive to neglect of anisotropy and attenuation than shear events. This is explained by differences in the radiation pattern of shear and tensile sources. The radiation of a shear source has four lobes in isotropic media: two lobes of the positive polarity and two lobes of the negative polarity. The lobes are well-separated by nodal planes and constrain tightly the $P$- and $T$-axes. By contrast, the radiation pattern of a tensile source in isotropic media is axially symmetric and without nodes, predominantly with a single polarity. Consequently, the $P$- and $T$-axes are not well constrained being sensitive to deviations in amplitudes due to errors in the velocity model.

The presence of velocity anisotropy in a rock poses another complication. Geometry of faulting cannot simply be interpreted using the $P$- and $T$-axes of the moment tensors. These axes are affected by the velocity anisotropy and deviate from the true orientation of faulting. The stronger the anisotropy is, the higher the deviations are. This effect is eliminated by calculating and interpreting the $P$- and $T$-axes of the source tensors.

Finally, we proved that the moment tensor inversion applied to a large dataset of AEs could be utilized for determining the
P-wave attenuation of the rock sample. The resolution of the method permits distinguishing between values of attenuation in the horizontal and vertical directions. The retrieved values are consistent with constraints on attenuation from independent ultrasonic measurements. The anisotropic attenuation with high values in the horizontal direction is explained by forming tensile cracks in the sample aligned along the vertical axial load applied to the specimen.

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