

Uncertainties in passive seismic monitoring

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The use of passive seismic techniques to monitor oil field completion and production processes is on the rise. Stress changes induced by such reservoir activities as hydraulic fracturing, water injection, or fluid extraction will often result in failure of the rocks with a concurrent release of seismic energy in the form of compressional (P) and shear (S) waves. Passive seismic monitoring is based on recording these emitted waves and then using their arrival times to estimate the location of the failure events.

The distribution of event locations in time and space can then be used to deduce how the reservoir rocks are responding to the production activity. Such information, coupled with other ongoing measurements of fluid temperature and pressure, make an essential contribution to the “smart oil field.” An understanding of the uncertainties in these event locations is essential to a proper employment of the technology.

A microseismic event occurs at an unknown origin time and at an unknown location, or hypocenter. Because P- and S-waves travel at different velocities, the distance from the hypocenter to a single receiver may be estimated by observing the differential arrival times of the P- and S-wave phases at that receiver location. Given a sufficiently wide distributed array of at least three sensors, an estimate of the hypocenter location may be made through the process of trilateration. Using three-component phones such that the polarization of the event arrival, and, therefore, wavefront propagation direction may be determined, allows for an additional constraint on the location estimate. This constraint is useful and perhaps even necessary in limited-aperture situations such as when the sensor array is deployed in a monitoring borehole. However, microseisms caused by slip along an induced or pre-existing fracture plane do not radiate energy equally in all directions (Figure 1b). In fact, this type of radiation pattern includes two nodal planes along which little or no seismic energy is received. It follows that if a downhole monitoring array were located along the nodal plane of such an event, the event would not be detected.

In this study, we investigate uncertainties in the estimated locations of microseismic events given various receiver array geometries. We illustrate how these errors are affected by the location of the receiver array, focusing on two that are commonly applied in practice: A 2D grid of receivers on the Earth's surface and a linear array of receivers in a single vertical borehole. We also present a limited analysis of location errors due to an incorrect velocity in a homogeneous medium. However, we recognize that velocity heterogeneity may have an equally profound effect on location accuracy as receiver distribution.

How are event locations determined?

Figure 1 illustrates the geometry of the experiment assuming a simple isotropic, homogeneous medium. A microseismic

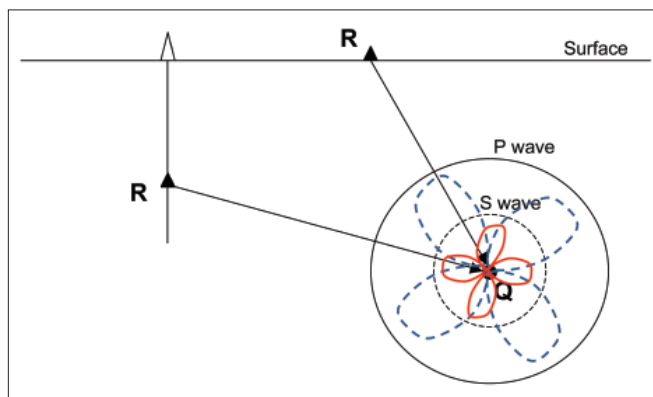


Figure 1. A microseismic event at Q generates P- and S-waves that travel through the medium, and, after some time, arrive at sensors located at R. This sensor is typically on the Earth's surface or on a downhole wireline tool. Red and blue curves illustrate an example of possible amplitude radiation patterns from P- and S-waves, respectively (i.e., S-to-P-wave amplitude is proportional to the cube of P-to-S-wave velocity ratio).

event occurs with an origin time (t_0) with a hypocenter location (Q). At arrival times t_p and t_s , the P- and S-waves are recorded at the receiver R. The P-wave arrives first at time:

$$t_p = t_0 + \Delta t_p \quad (1)$$

The S-wave arrives at a later time:

$$t_s = t_0 + \Delta t_s \quad (2)$$

Δt_p and Δt_s denote traveltimes of P- and S-waves. Noting that the distance QR is equal to traveltime multiplied by velocity, the above equations can be solved for distance:

$$\overline{QR} = (t_p - t_0)V_p = (t_s - t_0)V_s \quad (3)$$

At this point, surface and downhole methodologies diverge. Because of the noisy conditions in which surface microseismic data are recorded, a large, redundant array of thousands of geophones is deployed, and only P-wave arrival times are consistently imaged. P-wave arrival times are imaged across the array with a grid search through all possible subsurface event locations and origin times until the observed arrival time distribution is matched with synthetic traveltimes. This process is then repeated for subsequent events.

In the downhole case, the receiver array is constrained by physical and operational limitations associated with downhole wireline tools. As such, the downhole receiver array has a limited aperture with a small number of three-component geophones. However, the quiet downhole environment allows accurate P- and S-wave arrival times to be picked. With the differential traveltime between the P- and S-wave associated with a given event, the QR distance becomes independent of

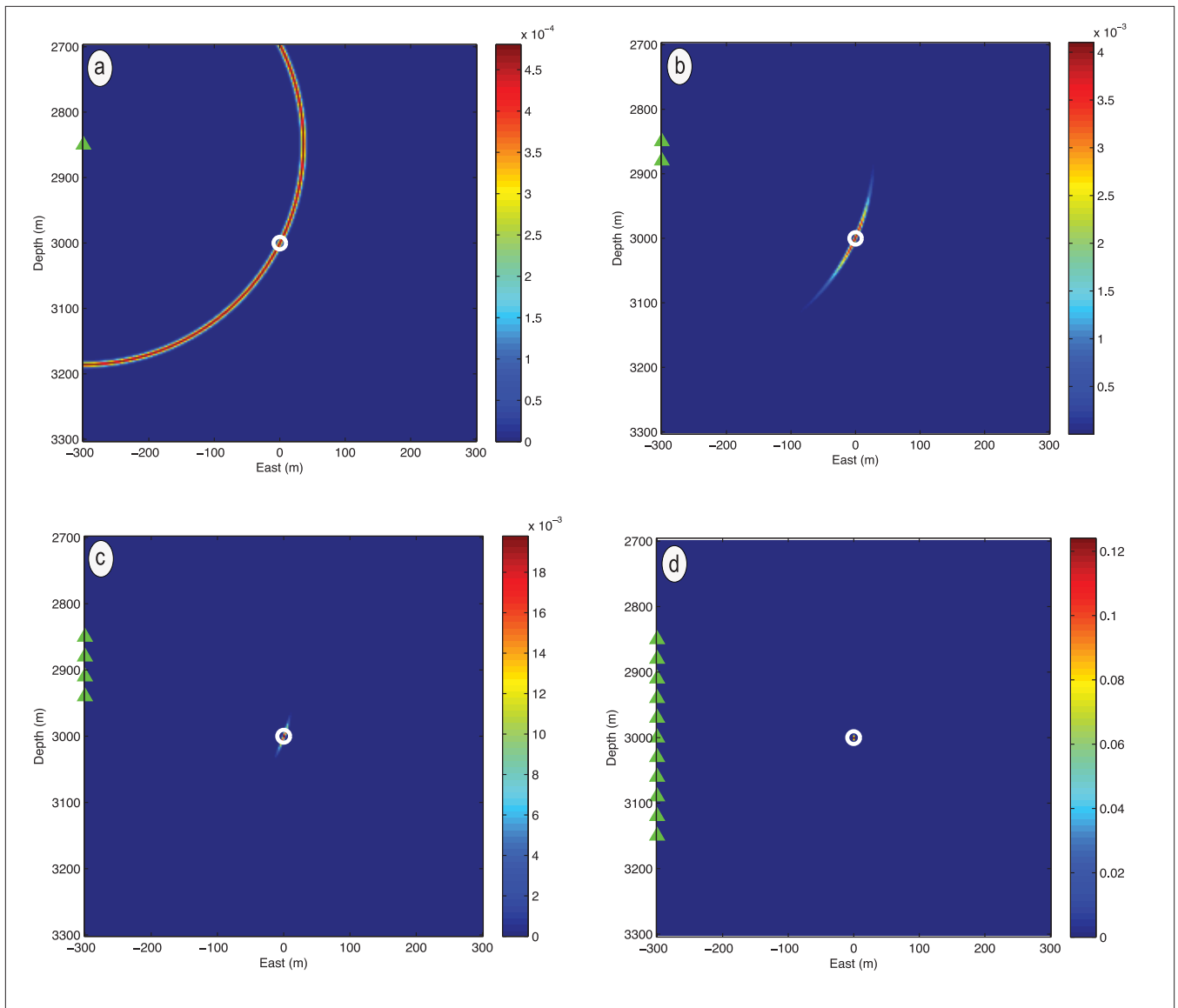


Figure 2. Vertical cross sections through probability density functions (PDF) from 1 (a), 2 (b), 4 (c), and 11 (d) receivers in a single borehole and a microseismic event hypocenter at the center of each plot (white). Hot colors show the most likely position of the located hypocenter. Decay from the hot-to-cold colors represents resolution and is determined by the acquisition geometry and the accuracy of the arrival times (assumed to be 1 ms). Each plot is normalized so that the probability density function sums to 1. The receivers are represented by green triangles on the left side of each plot. Receiver spacing is 24 m, and the maximum array spans 220 m vertically. P-wave and S-wave velocities are 5000 m/s and 3000 m/s, respectively.

the origin time.

$$\overline{QR} = (t_s - t_p) \left(\frac{1}{V_s} - \frac{1}{V_p} \right)^{-1} = (\Delta t_s - \Delta t_p) \left(\frac{1}{V_s} - \frac{1}{V_p} \right)^{-1} \quad (4)$$

With typical downhole geophone array apertures, simple trilateration of event locations is not suitably accurate. As a result of this geometrical limitation, the azimuth of the arriving wavefronts must be used as an additional constraint to determine accurate microseismic event locations. The event azimuth may be determined directly from the P-wave because the particle polarization is parallel to the raypath direction for P-waves in an isotropic medium. For the accuracy of such measurement as well as S-wave backazimuth determination, see “suggested reading” at the end of this article.

Sources of microseismic event uncertainty

The surface and downhole location techniques as described above work flawlessly in a homogeneous isotropic medium that is free of noise. In the real world, the wavefield propagating out from a microseismic event is complex; raypaths are bent by velocity heterogeneities, and the particle polarization used to estimate azimuth may not be linear. In addition, varying levels of background noise may complicate the accurate picking of P- and S-wave arrival times, a factor that is especially significant for surface microseismic monitoring. For most surface and downhole projects, velocities for P- and S-waves are derived from sonic logs recorded in a nearby well. Among other things, sonic log measurements are hampered by near-borehole effects, anisotropy, and bandwidth limitations (sonic-log bandwidth is usually an order of

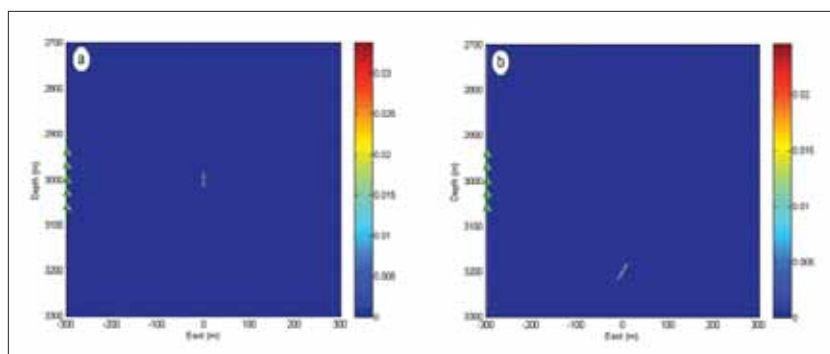


Figure 3. Vertical cross sections through probability density functions (PDF) for events at various depths relative to the downhole receiver array. (a) The PDF for a hypocenter at the depth of the central receiver of the monitoring array. (b) The PDF for a hypocenter below the borehole array (coordinates 0 and 3200 m). This is a very common scenario because wells are frequently plugged above the interval to be stimulated, and receivers can't be lowered to minimize the location uncertainty.

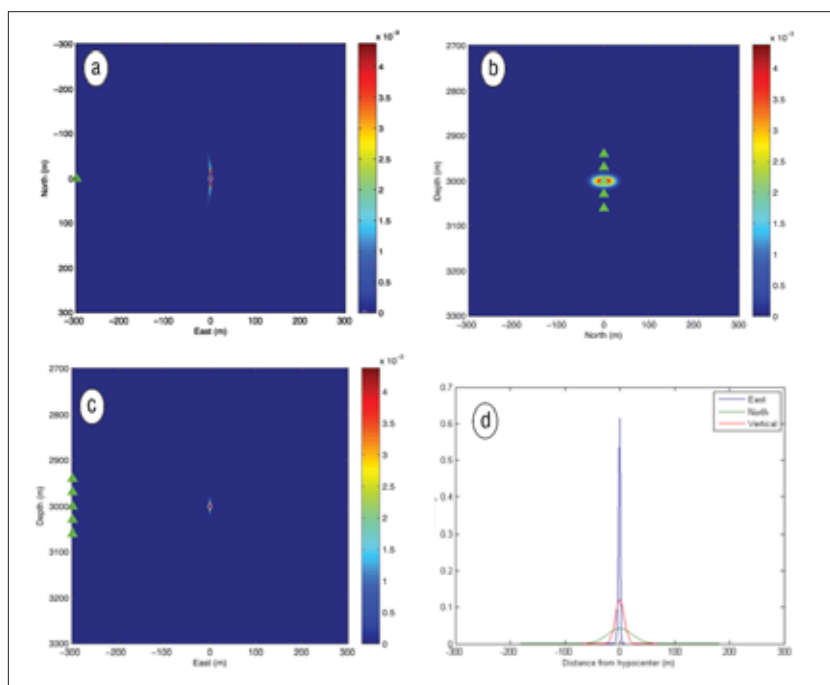


Figure 4. Three cross sections through probability density functions of a hypocenter represented by the white circle at east 0 m, north 0 m, and depth 3000 m. (a) Map view. (b) NS vertical cross section. (c) EW vertical cross section. (d) Integrated 1D marginal PDFs. The receivers are represented by green triangles. For more details, see Figure 1.

magnitude higher than seismic bandwidth). Downhole microseismic also requires the accurate measurement of event azimuth, which in turn requires the accurate determination of the position and orientation of each receiver. Receiver position is calculated using a deviation survey, and receiver orientation is calculated with the use of calibration shots that are recorded when the borehole casing is perforated. Calibration to perforation shots is done under the assumption that the medium is laterally homogeneous and isotropic (or media with vertical axis of symmetry), and this assumption may also be a source of significant systematic error (see suggested readings).

All these factors contribute to uncertainty in the esti-

mated event location, but it is difficult to quantify exactly how each of them affects the final location. In this study, we focus on how acquisition geometry, picking error in varying noise environments, and velocity model error may affect the accuracy of microseismic event locations. These are three important sources of error that are common to every microseismic experiment and thus should be understood by any geologist, geophysicist, or engineer who regularly uses and interprets microseismic data.

Graphical description of event location uncertainties

To highlight these sources of error for both surface and downhole measurements, we calculate probability density functions of event locations that are derived from relevant arrival times and azimuthal measurements assuming Gaussian distributions of errors. When plotted in color, these probability density functions are a useful way to graphically illustrate the event location uncertainty and how it can be described in 3D space. The goal of this study is to graphically highlight certain patterns of systematic event location error so that the reader might identify and understand the cause of similar patterns in real-world data sets.

Downhole microseismic monitoring

As discussed previously, a single receiver at which both arrival times of P- and S-waves are measured constrains only the distance, QR, from this receiver (assuming particle polarization P- or S-waves are not used). Figure 2 illustrates how an array of geophones constrains depth and distance from a vertical well and was calculated with estimated pick uncertainty of 1 ms for arrival times of both P- and S-waves. We see this as a reasonable lower bound on pick uncertainty based on the results of Rutledge and Phillips (2003).

In Figure 2c, note that short arrays (with geophones spanning 90 m) do not constrain the location very well. The location uncertainty is significantly reduced when receivers are both above and below the event. Note that the resulting uncertainty in Figure 2a–c is largest in the vertical direction. This result is contrary to the common perception that depth is the best resolved coordinate from a vertical downhole array.

The shape of the event location uncertainty also depends on relative depth between the borehole array and the hypocenter. Figure 3 illustrates the shape of the uncertainty for two locations, one with a hypocenter depth directly in the center of the downhole receiver array (i.e., the same depth as in Figure 2d) and one that is 140 m lower than the lowest receiver

in the borehole array. This is a very common scenario because wells are frequently plugged above the interval to be stimulated, and receivers can't be lowered to minimize the location uncertainty. Note that the probability density function of the deeper hypocenter is approximately twice as large and is tilted relative to the center of the array. Figure 3 shows uncertainty due to five receivers spanning 120 m. The vertical uncertainty increases with shorter monitoring arrays as can be seen from comparison of Figures 3a and 2d. The tilted axis of the probability density function may cause systematic errors in event distributions for events that are deeper than the downhole array. For example, a series of repeated deep events with similar hypocenters but various noise-dependent arrival times would be found along the shape of the PDF and could be interpreted as a dipping fault.

Figure 4 shows the 3D uncertainty of a recorded microseismic event that includes lateral uncertainty resulting from particle polarization measurement. A Gaussian perturbation of azimuths with zero mean and a standard deviation of 10° was used in this calculation. This standard deviation was selected based on a recently published study by Eisner et al. (2009), which showed that a standard deviation of 29° and 10° is reasonable for P- and S-wave derived backazimuths, respectively (see Figure 10 of Eisner et al.). While backazimuths derived from S-wave polarization may appear to be more precise and accurate, they are more indirect measurements than P-wave backazimuths and were never successfully benchmarked against P-wave backazimuths with a scatter less than 10° . Note that a more precise measurement of backazimuth may be possible for strong events recorded on a single receiver. However, the consistency of these azimuthal measurements across the borehole array is rather poor, and significant discrepancies exist between P-wave and S-wave derived backazimuths. In general, backazimuth measurements from particle polarization are more unstable than distance measurements derived from arrival time picks. This instability exists because particle polarization is sensitive to local velocity heterogeneity while traveltime measurements are the result of a cumulative integration along the entire raypath trajectory. As shown in Figure 4, the event location is most tightly constrained in the radial direction away from the borehole location. Depth and azimuth are much more poorly constrained. The relative values of the radial, azimuthal, and depth uncertainties may be best viewed in the 1D histogram in Figure 4d. We calculated uncertainties in Cartesian coordinates of 2 m in the east (ra-

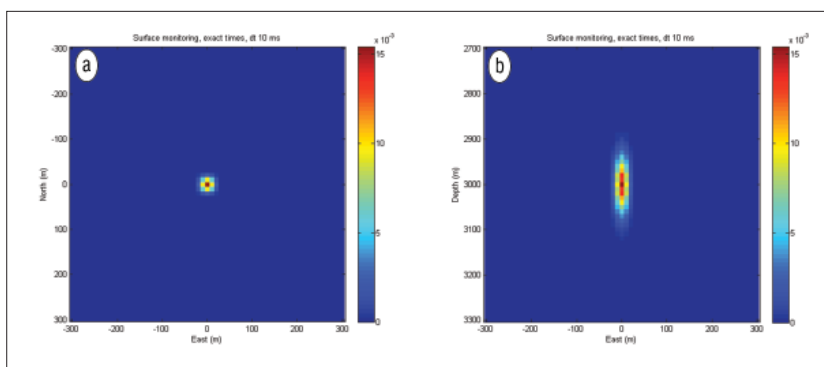


Figure 5. Two cross sections through the 3D probability density function of an event at east and north 0 m and at a depth of 3000 m. The receiver array is an 11×11 square grid with 121 receivers. Event was located using only P-wave arrival times.

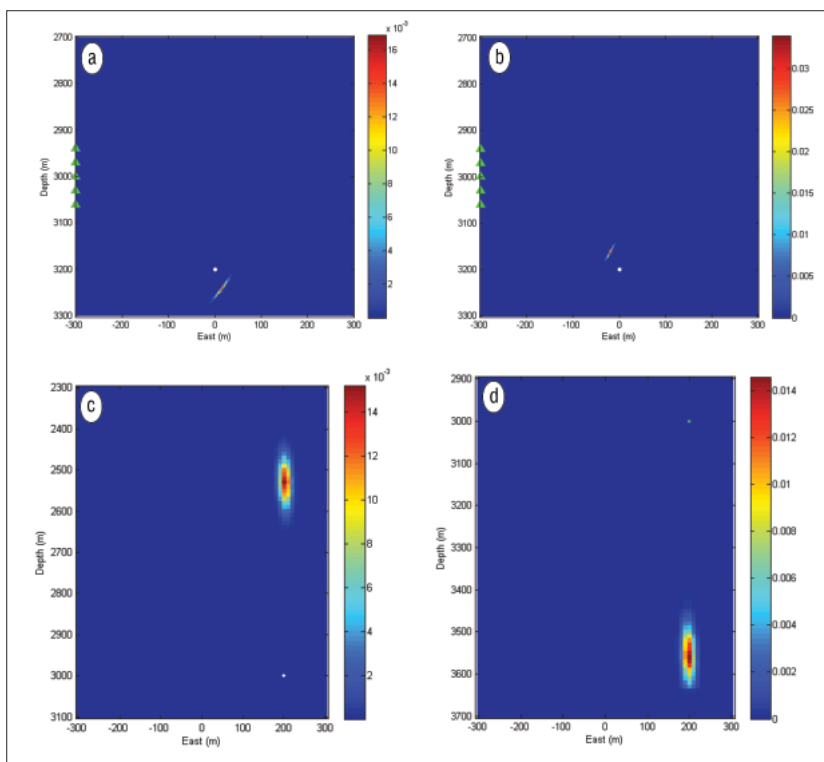


Figure 6. Four vertical cross sections show velocity-related location uncertainties for downhole monitoring (a and b) and surface monitoring (c and d). Both (a) and (c) show a velocity model that is 10% faster; (b) and (d) show a velocity model that is 10% slower than the true velocity. The true event location is represented with the white circle.

dial) direction, 23 m in the north (azimuthal) direction, and 8 m in the vertical direction. It is important to note that the length of the downhole array is one of the major factors that controls depth resolution. The density of receivers within the array does not reduce location uncertainty except in the case of nearby receivers that are stacked to improve the signal-to-noise ratio for azimuth determination.

Surface microseismic monitoring

Microseismic events are typically recorded at the surface on large arrays of vertical component geophones distributed on the surface in a 2D grid. For our calculations, we assume a surface array of 121 receivers organized in an 11×11 square

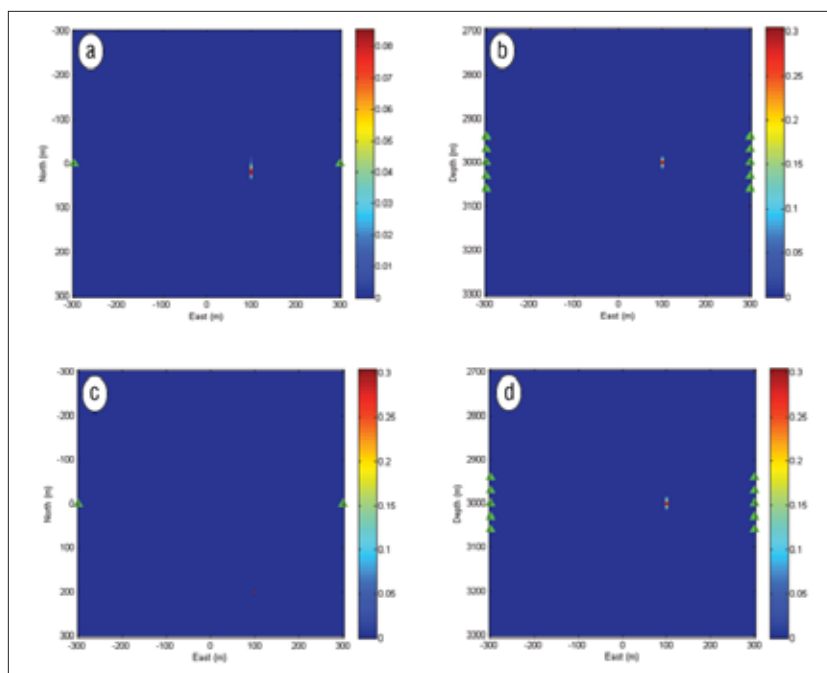


Figure 7. Dual borehole monitoring with incorrect (high) velocity model. (a) and (c) show two map views at true hypocenter depths for locations derived from two monitoring vertical boreholes with five receivers each represented by the green triangles. (b) and (d) show two vertical cross sections (EW) through the true hypocenter (projected receiver positions are again represented by the green triangles). Arrival times and backazimuths are assumed to have Gaussian distribution of zero mean and standard deviation of 1 ms of both P- and S-waves and 10°, respectively.

grid with 600-m receiver spacing. As with downhole acquisition, receiver density does not influence the probability density function of the located hypocenters, assuming a reasonable density of receivers. However, stacking of seismograms is essential for overcoming low signal-to-noise ratios. The probability density function is primarily constrained by the aperture of the array relative to the event depth. For our calculations, we locate 3000-m deep events monitored from a 6000 × 6000-m array.

Figure 5 shows the probability density function of an event located using only P-wave arrival times recorded on the surface array. These arrival times were perturbed with Gaussian distribution of zero mean and standard deviation of 10 ms. The 10-ms uncertainty is considered an upper bound and was derived from observed visible arrival times and their rms on multiple surface measurements. Some data sets with multiple visible events have arrival times fitted with an average rms of 3.4 ms for a microseismic event in a velocity model with receiver statics derived from a string shot. Surface monitoring has the added benefit of a more stable velocity model relative to downhole. Only the P-wave velocity model is required, and it can be constrained by sonic logs, a checkshot/VSP, or a 3D velocity model derived from surface 3D seismic acquisition. Receiver statics are an added source of uncertainty that have not been accounted for in this calculation, but they are typically very stable and do not vary with event hypocenter location. Note that the horizontal uncertainty is relatively well constrained, with standard deviations of 10 m east and north, respectively. On the other hand, vertical uncertainty is

relatively poorly constrained with a standard deviation of 42 m. However, if we use 4-ms uncertainty in traveltime uncertainty corresponding to the measured rms residuals, as we did for downhole measurement, the vertical error is reduced to 17 m and 3 m horizontally.

Event uncertainties resulting from velocity model errors

A significant source of location uncertainty originates from the unknown subsurface velocity structure between the source and receivers. Because of differences in geometry, velocity errors affect event locations differently for surface and downhole monitoring. Figure 6 illustrates a simple downhole case for which the P-wave and S-wave velocities have been increased by 10% (a) and decreased by 10% (b). Given the asymmetry of the borehole monitoring array relative to the hypocenter location, the location error due to the velocity model affects both the horizontal and vertical location proportionally to the velocity error, i.e., the distance from the array is increased by approximately 10%. Note that the slower velocity appears to have much smaller uncertainty, thus giving a false

indication of higher accuracy.

For surface microseismic monitoring, perturbations of the velocity model have a minimal effect on horizontal event uncertainties. However, these same perturbations have a very significant effect on depth-related event uncertainties (Figure 6c–d), again approximately proportional to the distance of the event from the monitoring array. For the fast-velocity model, the event is incorrectly located at a shallow depth. The opposite is true for the slow-velocity model. However, it is interesting to note that the horizontal position of the located event is minimally affected even though the event is not at the center of the surface-monitoring array. The vertical error is overcome through calibration of the velocity model from perforation or check shot analogous to the conventional seismic time-to-depth conversion.

Location uncertainties for dual downhole arrays

An increasing number of microseismic monitoring jobs are using multiple monitoring wells to detect and locate microseismic events. In practice, a single microseismic event is rarely detected in more than two monitoring wells, even if a field is instrumented with additional monitoring wells. This is likely due to the difficulties inherent in detecting events with such small magnitudes in combination with many of the uncertainties described previously. In this section, we investigate the uncertainty related to a single microseismic event that is detected on two vertical downhole arrays of five geophones (120-m long arrays) separated by 600 m.

Figure 7a–b shows the probability density function for an

	Vertical position	Horizontal position	Sensitivity to the velocity model
Borehole single vertical array	1–10s of meters for most common scenarios	Significantly better in radial direction, azimuthal uncertainty in 10s of meters	All coordinates are affected (poor vertical, and horizontal)
Surface 2D monitoring array 1:1 depth: offset	Several 10s (40+ m) of meters for most common scenarios	No specific bias in any direction, below 10 m for most common scenarios	Vertical position is very sensitive, horizontal position is very robust
Dual-monitoring array	Similar as single monitoring array with good velocity model	Significantly dependent on relative position to the plane of symmetry	Very sensitive and creates artifacts close to the plane of symmetry

Table 1.

event relatively close (20 m) to the plane of symmetry that connects the two monitoring wells. In this plot, the plane of symmetry is a horizontal line connecting the two wells in map view (top left plot in Figure 7). Figure 7c–d shows the uncertainty related to an event that is relatively far away (200 m) from the plane of symmetry between the two wells. Intuitively, one might think that the most accurate locations would occur between the two wells. However, Figure 7 clearly illustrates that the location close to the plane of symmetry between the wells is more poorly constrained than the event father away from the plane of symmetry; the two monitoring wells do not contribute to the vertical resolution (compare Figure 7b and Figure 4c), but the horizontal uncertainty is stretched perpendicular to the plane of symmetry. The event far away from the plane of symmetry is much better constrained in the horizontal plane than the event close to the plane of symmetry. However, as its distance from monitoring wells increases, its vertical resolution decreases. In practice, linear clusters of event locations are often observed perpendicular to the plane of symmetry between dual monitoring wells. It is important to note that linear “trends” such as these may be geometrical artifacts that have nothing to do with fracture orientations.

Discussion

In this study, we have highlighted several common sources of error related to the location of microseismic events using both surface and downhole arrays (Table 1). For the downhole arrays, we characterize several unusual sources of systematic errors that arise from the experimental geometry. These errors often are not intuitively obvious because geophysicists are accustomed to acquisition geometries in which both sources and receivers are at the surface (neither of which is the case for downhole microseismic monitoring). For downhole microseismic monitoring, the most accurate event locations are obtained when the depth of the located event occurs within the depth range of the monitoring array with an aperture comparable to the event distance (Figure 2 and Figure 3). Therefore, the array should straddle the zone of interest whenever possible, and the array should span the expected depth range of recorded microseismic events. Contrary to common perception, we show that the depth of

microseismic events recorded on a downhole array is much more poorly constrained than the radial distance from the borehole (Figure 2 and Figure 4) assuming correct inversion model. In addition, we illustrated in Figure 3b–c that uncertainties for events located deeper than the downhole array are smeared along an inclined trend that may easily be misinterpreted as fault or fracture planes. Geophysicists typically think of velocity errors in terms of their effect on depth estimations.

In Figure 6a–b, we illustrate how errors in the velocity model for downhole monitoring have the potential to cause both vertical and horizontal location errors. For dual downhole monitoring arrays, we show that event locations may preferably be perpendicular to the axis of symmetry between the monitoring wells (Figure 7). Again, these roughly linear event groupings may be incorrectly interpreted as induced fracture orientations to the untrained eye.

Event uncertainties (Table 1) for surface microseismic monitoring are significant but tend to be well behaved and easily interpreted in comparison to their downhole counterparts. Because of the noisy surface environment associated with reservoir production or fracture stimulation treatments, uncertainties related to arrival time picks are a significant source of error for events recorded on a surface array. These errors are partially mitigated through the use of a large, redundant array with thousands of receivers. As shown in Figure 5, location uncertainties for microseismic events recorded on a surface array are much more poorly constrained vertically than horizontally. As a general rule, depth estimation from a surface array is not as robust as from a downhole array. This fact becomes particularly apparent when considering depth location errors due to velocity model inaccuracies (Figure 6c–d). These sizable, velocity-related depth errors illustrate the need to calibrate the velocity model carefully using perforation shots early on in the surface microseismic processing workflow. It follows that if the main purpose of a microseismic experiment is to determine the vertical growth pattern of seismicity induced by hydrocarbon production or during hydrofracture stimulation, it may be prudent to use the downhole methodology, if possible. However, a significant upside to the surface microseismic methodology is that the lateral location errors are very robust in comparison to downhole techniques. Surface microseismic event distributions are typically devoid of many of the systematic geometry-induced errors inherent with downhole measurements. If determination of fracture orientation or azimuth in map view is the main objective of a particular microseismic experiment, the surface methodology may be a superior choice. In general, fewer interpretation pitfalls exist for surface microseismic, and event distribution in map view is very stable even in light of the possibility of significant velocity and depth-related errors.

We summarize this study by specific recommendations that should reduce artifacts in microseismic event locations or at least bring these artifacts to the attention of an interpreter. The smallest uncertainty for a location obtained from a single monitoring borehole is achieved for events near the center of the monitoring array. For such an event, a short array gives event locations with larger uncertainties than a long array. For a given array length, the number of sensors has a minor impact. Therefore, for downhole monitoring the array should encompass the stimulated reservoir and span approximately the maximum expected event distance. Surface monitoring mostly suffers from the estimation of hypocenter depth. The trade-off between origin time and depth can be reduced by an accurate velocity model and a small standard deviation of arrival time picks. Therefore, a good calibration shot is essential for both velocity model calibration and reducing arrival time uncertainty.

Suggested reading. “Hydraulic stimulation of natural fractures as revealed by induced microearthquakes, Carthage Cotton

Valley gas field, east Texas” by Rutledge and Phillip (GEOPHYSICS, 2003). “Locating microearthquakes induced by hydraulic fracturing in crystalline rocks” by House (*Geophysical Resource Letters*, 1987). “Importance of borehole deviation surveys for monitoring of hydraulic fracturing treatments” by Bulant et al. (*Geophysical Prospecting*, 2007). “Determination of S-wave backazimuth from a linear array of borehole receivers” by Eisner et al. (*Geophysics Journal International*, 2009). “Surface based microseismic monitoring of a hydraulic fracture well stimulation in the Barnett shale” by Lakings et al. (SEG 2005 *Expanded Abstracts*). “Moment tensor inversion of microseisms from the B-sand propped hydrofracture, M-site, Colorado” by Nolen-Hoeksema and Ruff (*Tectonophysics*, 2001). “Seismic source mechanism inversion from a linear array of receivers reveals non-double-couple seismic events induced by hydraulic fracturing in sedimentary formation” by Jechumtálov and Eisner (*Tectonophysics*, 2008). **TLE**

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