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1 **Small aperture array as a tool to monitor fluid**
2 **injection- and extraction-induced microseismicity:**
3 **applications and recommendations**

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9 **Abstract** The monitoring of microseismicity during temporary, human activ-
10 ities such as fluid injections for hydrofracturing, hydrothermal stimulations or
11 waste water disposal is a difficult task. The seismic stations often cannot be in-
12 stalled on hard rock and at quiet places, noise is strongly increased during the
13 operation itself and the installation of sensors in deep wells is costly and often

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not feasible. The combination of small aperture seismic arrays with shallow borehole sensors offers a solution. We tested this monitoring approach at two different sites, (1) accompanying a fracking experiment in sedimentary shale at 4 km depth, and (2) above a gas field under depletion. The small aperture arrays were planned according to theoretical wavenumber studies combined with simulations considering the local noise conditions. We compared arrays recordings with recordings available from shallow borehole sensors and give examples of detection and location performance. Although the high frequency noise on the 50 m deep borehole sensors was smaller compared to the surface noise before the injection experiment, the signals were highly contaminated during injection by the pumping activities. Therefore, a set of three small aperture arrays at different azimuths was more suited to detect small events, since noise recorded on these arrays is uncorrelated with each other. Further, we developed recommendations for the adaptation of the monitoring concept to other sites experiencing induced seismicity.

Keywords Microseismic monitoring · Induced seismicity · Array seismology · Shallow borehole sensors

1 Introduction

Fluid injection and extraction operations, including those related to hydraulic fracturing, can trigger and induce seismicity through different physical processes, favouring shear failure along pre-existing faults or creating new fractures (Grigoli et al., 2017). Since the first documented cases of earthquakes triggered by fluid injections in the 1970ies (Healy et al., 1968), the number and types of industrial crustal fluid injections or extractions have steadily increased. In recent years, such types of operations were discussed in relation with the occurrence of significant earthquakes, which may lead to damage or change the seismic hazard with a possible feedback to the planning and development of injection projects. Examples include the geothermal stimulation activities in deep hot dry rock environments (Grigoli et al., 2018; Deichmann

43 and Giardini, 2009; Brodsky and Lajoie, 2013), the development of gas stor-
44 age facilities (Cesca et al., 2014), waste water injections (Ellsworth, 2018; Ta-
45 dokoro et al., 2000; Horton, 2012; Rubinstein et al., 2014; Hincks et al., 2018),
46 or hydraulic fracturing operation in shale gas (Kim, 2013; Sasaki, 1998).

47 As a reaction, authorities in different countries have started to define reg-
48 ulations, which often specify criteria for the performance of a monitoring net-
49 work and the magnitude of completeness. The aim is to be able to detect and
50 locate micro-earthquakes before, during and after injection operations, in or-
51 der to better understand changes in the seismic hazard and to develop traffic
52 light systems for mitigating the consequences of induced seismicity (e.g. Green
53 et al., 2012).

54 Monitoring of injection-induced micro-earthquakes in sedimentary basins
55 is challenging due to high background noise level. Detections and locations
56 of such microseismic events are key to judge the effectiveness of geomechan-
57 ical operations, track the migration of the fracturing processes and ensure
58 the preservation of reservoirs and the integrity of wells. A monitoring system
59 should allow to detect, locate and characterize (1) microseismicity ($Mw < 0.5$)
60 taking place in the vicinity (max 500 m distance) of the operational well, and
61 (2) weak to moderate seismicity ($Mw > 0.5$) taking place at least up to 10 km
62 distance from the operational well. The Mw 0.5 magnitude threshold, as the
63 distance threshold, is indicative and chosen upon our current experience and
64 guidelines of several European states. Specific accuracy in the detection and
65 location of weak events down to a specific minimum magnitude threshold may
66 be needed to track the migration of the fracturing processes, e.g. to ensure the
67 preservation of local underground water reservoirs and the integrity of wells.
68 Similarly, the monitoring should be tuned to allow the prompt detection and
69 characterization of moderate events at further distances, if specific seismogenic
70 faults are recognized in the local surrounding of the operation site.

71 Often the signal to noise ratios (SNR) are poor, the urban and industrial
72 activities are ongoing during the operations, and the sites may be subject to
73 logistical and environmental restrictions. A seismic monitoring network there-

74 fore needs to be not only sufficiently sensitive to detect smallest earthquakes
75 at depth, but also flexible in order to adapt to changing conditions and ac-
76 tivities at the surface. Borehole seismometers located in deep monitoring wells
77 reaching basement rocks are usually of high sensitivity and improved SNR.
78 However, they are expensive and cannot be adapted to changing conditions.
79 Seismic monitoring approaches employing a network of shallow boreholes may
80 be an alternative, although the SNR improvement from shallow borehole sta-
81 tions is potentially not very large if the sensors are placed in unconsolidated
82 quaternary layers. A combined network of shallow borehole sensors and small
83 aperture arrays of surface sensors can be interesting, since such installations
84 improve the SNR by stacking and at the same time allow to apply beamform-
85 ing filter techniques to detect waves with specific slowness.

86 Small aperture arrays have been used in seismology for a variety of applica-
87 tions, ranging from pure detection arrays for regional seismicity and the study
88 of earthquake swarms associated with natural fluid migration (Hiemer et al.,
89 2012) to studies of induced seismicity in relation to fracking experiments (e.g.,
90 López-Comino et al., 2017).

91 In the present paper, we show and discuss examples of small aperture high
92 frequency arrays combined with shallow borehole sensors to monitor induced
93 seismicity during industrial operations. The array characteristics and transfer
94 functions are discussed in the context of micro-earthquake detection at depth.
95 Field tests have been performed above a gas field under production in the
96 Netherlands and during hydraulic fracturing operations at a depth of about
97 4 km in Poland. We evaluate the fidelity and SNR of the arrays in comparison
98 to shallow borehole sensors under field conditions. A waveform attribute
99 stacking and beamforming method is applied to detect and partially locate
100 events. We test the arrays' event detection capability by beamforming and
101 compare instances of noise levels between array and shallow borehole stations
102 at different depth levels. In addition, we compare the location ability of one
103 array to network based locations and discussed the benefit of using multiple
104 arrays for event location. Concluding, we provide recommendations on the

105 design of microseismic monitoring networks involving seismological surface
106 arrays.

107 **2 Data**

108 We employ data recorded at a hydraulic fracturing operation in Wysin (Poland),
109 where a seismic monitoring system was installed consisting of surface broad-
110 band stations, small-scale arrays and shallow borehole stations. Additionally,
111 we analyse data recorded on a small-aperture seismic array deployed tem-
112 porarily in Wittewierum above the Groningen gas field (The Netherlands).
113 Both installations were part of the SHEER project (SHale gas Exploration
114 and Exploitation induced Risks, www.sheerproject.eu). In the following, we
115 describe the instrumentation at both sites in more detail.

116 2.1 The Wysin seismic monitoring system

117 A dedicated seismic network was installed at a shale gas play close to the village
118 of Wysin in the central-western part of the Peribaltic syncline at Pomerania
119 (Poland). In this area, a Polish oil and gas company drilled two horizontal
120 boreholes designed for fracturing for prospecting and exploration of oil and
121 natural gas. Hydrofracking operations were performed along two horizontal
122 wells at 3955 m and 3865 m depth with an approximate horizontal length of
123 1.7 km each, in the time periods 9-18 June and 20-29 July, 2016 (López-Comino
124 et al., 2017, 2018).

125 A hybrid installation, including a distributed network of six broadband
126 stations, three borehole geophones and three small-scale arrays (Fig. 1a) to
127 account for both triggered and induced seismicity in the vicinity of the opera-
128 tional wells, was installed in summer 2015 and fully operational from Novem-
129 ber 2015 until January 2017. All stations operated in continuous mode. The
130 six broadband stations surround the drilling site at distances between 2.1 and
131 4.3 km with a good azimuthal coverage (maximal gap 90°). Broadband stations

132 were equipped with GÜRALP CMG-3ESP sensors recording with a sampling
133 rate of 200 Hz. In addition, short-period stations were arranged in three small-
134 scale arrays with apertures between 450 and 950 m. Short period stations were
135 equipped with MARK L-4C-3D sensors (GLOD array) and GeoSIG VE-53-BB
136 sensors (CHRW and PLAC arrays) with sampling rates of 500 Hz. The shallow
137 underground installation is composed of three seismometers installed at 50 m
138 depth (initially Geotech Instruments KS-2000). Seismometers at two borehole
139 stations (GW3 and GW4) were replaced by Nanometrics Trillium Compact
140 Posthole 120s sensors at the end of April 2016 due to technical problems. The
141 sampling rate of all downhole instruments was 500 Hz.

142 2.2 The Wittewierum array

143 The objective of the temporary array deployed above the Groningen gas field
144 was to test the usage of a conventional array layout for detection of micro-
145 seismicity. The region of the Groningen gas field is an excellent test ground,
146 since the operating company NAM (Nederlandse Aardolie Maatschappij) in-
147 stalled a multitude of shallow borehole stations from 2014 to 2017, of which
148 65, in addition to the already existing shallow borehole stations installed by
149 KNMI (Koninklijk Nederlands Meteorologisch Instituut), were already online
150 during the time of measurement, thus ensuring an earthquake catalogue that
151 is complete down to $M_L = 0.5$ during the time of array installation (Dost et al.,
152 2017).

153 The site for the installation was agreed on with local parties involved in
154 the seismicity monitoring, i.e. KNMI and NAM. Stations were installed from
155 July 12 to August 29, 2016 for a period of almost 50 days. Fig. 1b displays the
156 location of the Groningen gas field with the placement of the array stations
157 shown as blue triangles, and the locations of borehole stations in the vicinity
158 of the array displayed as red circles.

159 IMS (International Monitoring System) modern small aperture arrays usu-
160 ally consist of a central station plus further stations placed on concentric rings,

161 each with an odd number of sites, spaced at log-periodic intervals (Schweitzer
162 et al., 2012). We based the geometry of the Wittewierum array on this con-
163 struction, but were not entirely free in choosing the ring diameters and station
164 sites. The array was composed of 9 seismometers and constructed as three con-
165 centric rings of 75 m, 150 m and 225 m radius including a central station. Each
166 station consisted of a broadband sensor (Trillium 120 s), an acquisition system
167 (CUBE datalogger), a battery and a GPS antenna. Sensors were installed at
168 about 1 m depth. All array stations recorded continuously with little outages
169 (Cesca et al., 2016).

170 During the installation time, KNMI registered 18 events, which are listed
171 in Table 1. (https://data.knmi.nl/datasets/aardbevingen_catalogus/
172 1), the largest of which had a local magnitude of 1.7 and occurred on July
173 18, 2016, at a distance of about 11 km to the array. The event closest to the
174 array occurred at a distance of about 5.5 km on July 26, 2016, and had a local
175 magnitude of 0.9.

176 **3 Methodology**

177 **3.1 Array assessment**

178 Arrays have a special ability to distinguish between signals with different
179 wavenumbers (slownesses) crossing the array simultaneously. Array signal pro-
180 cessing methods are based on improving the SNR by highlighting the arriv-
181 ing seismic waves with a specific wavenumber (slowness) and suppressing the
182 background signals travelling with different wavenumbers (slownesses). The
183 theoretical value of SNR improvement by an array with n stations, is \sqrt{n}
184 (Schweitzer et al., 2012, Eq. 9.7). While the number of array stations controls
185 the SNR gain achievable by the array, the array geometry defines the limits for
186 the resolvable wavenumbers. For instance, small aperture arrays can not dis-
187 tinguish between waves with small wavenumber differences, and for crossing
188 waves with long horizontal wavelengths (λ) compared to the array aperture

(a), such arrays act like a single station. So theoretically, the upper limit for the longest horizontal wavelength that can meaningfully be analysed by array techniques is about the aperture of the array: $\lambda_{max} \simeq a$, so the lower band of resolvable wavenumber, K_{min} , or array resolution is equal to $\frac{2\pi}{a}$. In addition, a wave crossing the array should be sampled by at least two stations, i.e. the smallest recordable wavelength is $\lambda_{min} = 2d_{min}$ assuming d_{min} is the minimum interstation distance, and thus, the maximum resolvable wavenumber is $K_{max} = \frac{\pi}{d_{min}}$.

The array transfer function (ATF) is a standard tool to quantitatively analyse the array performance and to study the capability of the array as seismic monitoring system. The ATF depends on the relative position of array stations and the frequency content of the signals of interest and, for a specific frequency ω , is defined as:

$$\left| \frac{1}{n} \sum_{j=1}^n e^{i(\mathbf{K}-\mathbf{K}_0) \cdot \mathbf{r}_j} \right|^2, \quad (1)$$

where $\mathbf{K} = [k_x, k_y] = \omega[s_x, s_y]$ is the horizontal wavenumber vector, $\mathbf{r}_j = (\delta x_j, \delta y_j)$ is the horizontal location vector of the j th station relative to the array reference point and n is the number of stations (Rost and Thomas, 2002).

The characteristics of the array transfer function such as the presence of side lobes and the shape and sharpness of the main lobe are related to the array layout. For instance, a circular shape of the main lobe implies a symmetric distribution of the array stations ensuring a similar resolution of signals arriving from different backazimuth angles. The width of the main lobe depends on the aperture of the array and defines the array resolution, K_{min} . The larger the aperture of the array, the sharper the main lobe and higher the resolution of the array.

The presence and distribution of side lobes depends mainly on the interstation distances and the frequency of the incoming signals. The larger the interstation distances, the closer the side lobes are to the main lobe, which threatens the accurate slowness (wavenumber) determination by increasing the danger of

218 slowness (wavenumber) aliasing depending on the relative beampower ratio
 219 between main and side lobes.

220 The estimation of K_{min} and K_{max} are theoretically valid if the array geometry
 221 is regular with uniform interstation distances. Nevertheless, given a potential
 222 irregular geometry in the two spatial directions, the true resolution is azimuth
 223 dependent (Zywicki, 1999). Experience from ambient vibration studies with
 224 synthetic and ground truth data show that the resolution capability of an
 225 array lies approximately between $K_{min}/2$ and K_{max} (Wathelet et al., 2008).
 226 Additionally, considering the energy content of the signal, even under the best
 227 experimental conditions and inside the resolution limits, if the wave energy is
 228 too low, identifying the correct wavenumber is difficult and maxima are hardly
 229 visible in the slowness-azimuth plane. In practice, the level of incoherent noise
 230 rather than the array geometry is the main factor controlling this lower bound
 231 (Poggi and Fäh, 2010).

232

233 3.2 Array beamforming and event detection

234 The array beam trace is calculated as the sum of all recorded, time shifted
 235 traces:

$$B(t) = \frac{1}{n} \sum_j^n Y_j(t + dT_j) \quad \text{with} \quad dT_j = s_x \delta x_j + s_y \delta y_j. \quad (2)$$

236 where, Y_j is the trace recorded at the array station j , and n is the number of
 237 stations. Assuming the plane wave approximation is valid, the time shift, dT_j ,
 238 for station j depends on the horizontal slowness components of the incoming
 239 wavefront, s_x and s_y , and the relative distance to the array reference point, δx_j
 240 and δy_j . The common strategies to find horizontal slowness vector components
 241 by estimating the correct values of time shifts and computing the array beam
 242 are described in e.g. Schweitzer et al. (2012) and Rost and Thomas (2002).
 243 In the present study, we apply *Lassie*, a recently developed automated full
 244 waveform event detection algorithm based on systematic shifting and stacking

of smooth characteristic functions and subsequent identification of instances of high coherence in signals recorded at different stations (Lassie, <https://gitext.gfz-potsdam.de/heimann/lassie>; Matos et al., 2018, Heimann et al., in preparation). *Lassie* was initially developed to be applied to data recorded on monitoring networks. We extended *Lassie* using a standard delay-and-sum beamforming approach to shift characteristic functions on a predefined slowness and backazimuth grid. The characteristic functions of traces implement bandpass filtering, taking the absolute, Hanning window convolution, downsampling and final continuous normalization (in that order) to produce a smooth representation of energy contained in the signal. Thanks to efficient implementation and parallelization, the algorithm applies a dense grid search to full waveforms and produces event detections at occurrences of coherent energy crossing the array along with estimates of backazimuth and apparent horizontal slownesses. These information can be employed for signal classification and subsequent event location (Schweitzer et al., 2012).

4 Application

We investigate the theoretical capabilities of the three installed arrays at the Wysin site in Poland (PLAC, GLOD, and CHRW) and at the Wittewierum site above the Groningen gas field in the Netherlands (WARN) with respect to their ability to detect expected target events.

The transfer functions of the arrays are plotted in Fig. 2. In this figure, white arrows displayed in (a)-(c) indicate the direction to expected target events, considering the location of the array and the fracturing experiment (Fig. 1). Red circles show the array resolution (K_{min}). Due to the irregular shape of the arrays at the Wysin site, the array resolutions are not uniform for all backazimuth directions. In contrast, the WARN array's stations are regularly spaced and thus, it is expected to have uniform azimuthal resolution.

Theoretical frequency-wavenumber curves of P- and S-phases resulting from target events are depicted in Fig. 3 providing information on the ca-

274 pabilities of the arrays in terms of resolution and expected aliasing features.
275 The depths of events are assumed to be 4 km and 3 km for the Wysin and
276 Wittewierum area, respectively. The distance dependent wavenumber lines are
277 estimated using the theoretical slowness values depicted in Fig. 4. The distance
278 range in each case is selected according to the expected event distances. The
279 velocity models for two the sites are shown in Fig. 3. In practice, waves may
280 travel with higher slowness values. Especially for the Groningen field, the seis-
281 mic velocities in the uppermost layers derived recently (Hofman et al., 2017;
282 Kruiver et al., 2017) are much lower than defined in the velocity model de-
283 picted in Fig. 3, which was derived from the average velocity model employed
284 by KNMI for event location in the Northern parts of the Netherlands includ-
285 ing, but not being limited to the Groningen field (Spetzler and Dost, 2017).
286 For the computation of slownesses, it was combined with the CRUST2.0 model
287 (Bassin, 2000) for depths larger than reservoir depth, since the velocity struc-
288 ture of the deeper part of the Carboniferous layer is not well known (Dost et al.,
289 2017). In addition, S-wave velocities for the sediments down to 3000 m depth
290 were estimated from P-wave velocities using Castagna’s relation (Castagna
291 et al., 1985).

292 In Fig. 3, the value of K_{min} for individual arrays is indicated by the horizontal
293 lines in order to ease discussion and comparison of the expected performance
294 of the three arrays for different frequency content of P- and S- phases for
295 events at different locations in the fracturing zone. The value of the K_{max} for
296 the WARN array is also depicted. For the other arrays, K_{max} is larger than
297 wavenumber range plotted in the figures and therefore is stated only in the
298 figure caption.

299 4.1 Assessment of the arrays installed at Wysin

300 In the following, the assessment of the theoretical capability of individual ar-
301 rays is described in detail:

302 **PLAC:** The PLAC array is expected to record events from a distance range

303 of about 2 - 5 km, from the direction shown in Fig. 2a. The ATF of this array
 304 shows relatively strong side lobes at about 25 rad/km distance from the main
 305 lobe, with relative power as high as 50% of the main lobe. However, these side
 306 lobes are not oriented in the expected direction of incoming events and thus,
 307 may not cause a problem in estimation of the slowness vector.

308 Due to the small aperture of this array, the array is not expected to be sensi-
 309 tive to wavenumbers below $K_{min} = 14$ rad/km. According to the Fig. 3, this
 310 limiting value of the wavenumber is related to P- and S-phases with certain
 311 frequencies and slownesses. Since the slowness in the distance range of 2 - 5 km
 312 is increasing with distance (see Fig. 4), the minimum wavenumber is related
 313 to the higher frequencies at closer distances and shifts towards the lower fre-
 314 quencies by increasing the epicentral distances. In other words, events at closer
 315 distances ($\leq 2 - 3$ km) with frequency content of P-phases of less than 15 -
 316 20 Hz are not detectable by the array, while for the S-phases, the frequency
 317 limits shift towards the lower frequencies (since the slowness of S-phases is
 318 higher than that of P-phases), so the related lower frequency bands shift from
 319 7 to 12 Hz for distances 5 to 2 km.

320 Considering this frequency limitation, P-phases will be difficult to detect in
 321 array beams and more likely, events at all distances will be detected once the
 322 S-phase energy is exceeding the noise level. The difference in wavenumbers
 323 from waves arriving from the edges of the fracturing zone, i.e., at 2 km to
 324 5 km distance, is a fraction of the resolution limit at lower frequencies and is
 325 the same as at higher frequencies, which implies that distinguishing events
 326 that arrive simultaneously at the array will probably not be possible. The
 327 value of K_{max} is about to 62 rad/km, and frequencies up to about 30 Hz are
 328 expected to be resolved safely by this array.

329 **GL0D:** The GL0D array is situated at a distance of 2 - 3.5 km of the hy-
 330 drofracturing experiment. According to the ATF shown in Fig. 2b, a secondary
 331 lobe is situated in direction of the backazimuth of interest, which is about
 332 20 rad/km away from the main lobe, with the relative power as high as 50%
 333 of the main lobe. The wavenumber limit K_{min} for this array is 11.3 rad/km.

334 So the frequency limit for this array is shifted to lower frequencies compared
335 to the PLAC array. This means that P-phases originating from events at dis-
336 tances of 2 km to 3.5 km with frequencies less than 14 to 16 Hz cannot be
337 detected by the array, while for S-phases, the frequency limit is 6 to 9 Hz.

338 The side lobes at 20 rad/km imposes another limitation on the resolvable sig-
339 nals, since they are situated in the backazimuth range of expected signals. If
340 they lead to spatial aliasing depends on the relative power between main lobe
341 and side lobes. Accordingly, the highest frequency for arriving phases should
342 be considered above which such spatial aliasing would occur, which is 20 Hz
343 and 10 Hz, respectively, for P- and S-phases emanating at distances of 3.5 km.

344 **CHRW:** The fracturing operation occurs about 3 to 4 km away from the
345 CHRW array. The ATF of this array is depicted in the Fig. 2c. Although a
346 number of side lobes are present, the expected azimuth direction does not con-
347 tain any high amplitude secondary lobe. However, some small amplitude side
348 lobes (30% of main lobe amplitude) are visible in those directions. The width
349 of the main lobe is smaller compared to the other arrays as the aperture of the
350 array is larger, allowing this array to be sensitive to lower wavenumbers. The
351 resolution is not uniform in all backazimuth directions, as the array itself is
352 elongated in approximately SW-NE direction. Thus, in this direction, K_{min} is
353 lowest corresponding to the best resolution for small wavenumber differences.
354 Contrary, the resolution is poorest in the SE-NW direction. Therefore, events
355 from the western edge of the hydrofrack will be easier to observe than from
356 the eastern edge. According to Fig. 3, P- and S-phases will be detectable at
357 frequencies above 7 Hz and 2.5 Hz, respectively, at about 4 km epicentral
358 distance. Compared to the other arrays, CHRW array has a better chance
359 to detect P- and S-phase arrivals, however, similar to the other arrays, the
360 resolution of the array to separate between simultaneously arriving waves is
361 insufficient.

362

363 4.2 Assessment of the arrays installed at Wittewierum (WARN)

364 The source-array distance is expected to be about 5 to 20 km and the array
365 is supposed to detect seismic waves originating from all directions.

366 According to Fig. 2d, the width of main lobe is circular, so the resolution is
367 uniform for all directions. In addition, some relatively strong secondary lobes
368 exist, but only at 40 rad/km from the main lobe. So the array is capable to
369 resolve larger wavenumber ranges.

370 The array aperture is 0.4 km, which means that K_{min} is about 16 rad/km. Ac-
371 cording to Fig. 4, for the distance range of 5 to 20 km, P- and S-waves possess
372 constant slowness values of 0.2 and 0.35 s/km for the velocity model assumed
373 for this region, so the frequency limits are not distance-dependent. According
374 to Fig. 3b, the lower frequency limits for P- and S-phases are about 12 Hz
375 and 7 Hz, respectively. In contrast to the arrays installed in Wysin, WARN
376 exhibits an upper frequency limit for P-waves for the epicentral distances of
377 interest at about 22 Hz.

378 5 Results

379 5.1 Event detection on the Wysin arrays

380 We applied the modified version of *Lassie* using a frequency pass band be-
381 tween 9 and 20 Hz. Backazimuths were scanned between -30° to $+30^\circ$ in 0.5°
382 steps and slownesses between 0.05 s/km and 0.3 s/km in 0.01 s/km steps.
383 After manual revision of the detections, we could verify that none of them
384 were of seismic origin from the nearby fracturing site. Most of the detections
385 correspond to local noise sources (López-Comino et al., 2018). An example of
386 waveforms and a detection at array GLOD is depicted in Fig. 5.

387 5.2 Event detection on the Wittewierum array

388 In order to process data recorded on the Wittewierum array, we applied a
389 bandpass filter between 9 and 30 Hz following a spectrogram analysis and
390 employed a full backazimuth grid search (from 0° to 360° with a grid step of
391 5°). Slownesses were scanned between 0 s/km and 0.5 s/km (corresponding to
392 horizontal apparent velocities from 2 km/s to infinity). At first, the detection
393 algorithm was tested on eleven events from the KNMI catalogue that were
394 visible by eye (See column 8 in Table 1) in the data in order to evaluate the
395 detection threshold. Subsequently, the complete data set was processed. An
396 example detection is shown in Fig. 6 for an event that occurred on July 18,
397 2016 (08:58:11h). The waveforms of this event recorded on the WARN array
398 as well as the KNMI shallow borehole station G28 are depicted in Fig. 7.

399 The application to the complete data set results in more than 65 000 de-
400 tections, albeit half of which with a detector strength lower than 16.5. When
401 plotting backazimuth estimates versus slowness for different detector strengths
402 (Fig. 8), there is neither a preferred slowness range nor orientation recogniz-
403 able. Since seismic events at Groningen are supposed to originate at reservoir
404 depth (Dost et al., 2017), differences in slowness mainly imply changes in the
405 distance to the events. However, with the exception of some events detected
406 with zero slowness, the backazimuth-slowness pattern is similar for all detector
407 strengths, which strengthens the assumption that at least a part of the detec-
408 tions constitutes real events. Detection performance is stable over time, but
409 decreases in the period from the August 20 to August 22, when two stations
410 were malfunctioning.

411 In addition, *Lassie* detects all events which served for parameter tuning, as
412 well as two additional events catalogued by KNMI that are less obvious in the
413 single seismic traces (See column 9 in Table 1). However, two of those thirteen
414 events exhibit a large difference in backazimuth compared to the KNMI event
415 location (Events number 8 and 15 in Table 1 which are marked by grey stars in
416 Fig. 8). Five other events listed by KNMI were not detected. In general, for

417 the KNMI catalogue events, detection levels correlate with event magnitude
418 and anti-correlate with distance.

419 The apparent velocities vary between 2 and 6.6 km/s and thus are slightly
420 more variable than what is expected from 1-D raytracing (2.8 km/s to 5 km/s,
421 Fig. 4). In fact, the average velocity model for the Northern Netherlands used
422 to derive slownesses is not describing the complex structure of the Gronin-
423 gen gas field very well. The Rotliegend gas reservoir (average P-wave ve-
424 locity $v_P=3.8$ km/s) is overlain by anhydrite with a much higher velocity
425 of $v_P=5.9$ km/s and underlain by the Carboniferous with $v_P=4.25$ km/s
426 (Willacy et al., 2018). These high-impedance contrasts channel earthquake en-
427 ergy within the reservoir and result in significant mode conversions (Willacy
428 et al., 2018). In addition, there are strong impedance contrasts between the
429 Zechstein reservoir seal and the overburden as well as within the overbur-
430 den itself, further complicating the propagation of seismic waves, such that
431 seismograms recorded at the surface contain considerable P-to-S and S-to-P
432 conversions (Willacy et al., 2018). Including single and multiple reflections seis-
433 mograms are difficult to interpret (Willacy et al., 2018) and beamforming may
434 stack converted instead of direct arrivals due to a wrong phase association. In
435 addition, as mentioned above, seismic velocities, especially S-wave velocities,
436 in the uppermost layers derived recently (Hofman et al., 2017; Kruiver et al.,
437 2017) are much lower than defined in the average velocity model.

438

439 It is difficult to distinguish automatically between noise and earthquake sig-
440 nals. One indication is the distribution of events with time of day (Fig. 9).
441 Clearly, the detection distribution with time of day is not even. Additionally,
442 the temporal behaviour varies for different detector strengths; events with a de-
443 tector strength below 16 occur more often between 21:00 (9:00 P.M.) and 4:00
444 A.M., whereas events with a detector strength above 18 have a pronounced
445 peak between 21:00 (9:00 P.M.) and 10:30 P.M. and a second between 13:30
446 and 14:30 (1:30 P.M. and 2:30 P.M.). Most of the detections occur during night
447 time, indicating that the day time noise from superficial sources increases the

448 magnitude of completeness.

449 Surprisingly, the distribution of events with time seems to be relatively in-
450 dependent of apparent velocity, although the absolute number of detections
451 with apparent velocity lower than 5 km/s is ten times higher than the number
452 of events with apparent velocity between 5 and 10 km/s. That means that a
453 low apparent velocity cannot be used to distinguish between shallow artificial
454 sources close to the array and natural sources at larger distances and depths.

455 5.3 Event location capability of a single array

456 In order to locate events using a single array, it would be necessary to form
457 separate beams for P- and S-wave onsets searching different slowness ranges
458 and being filtered in different frequency bands, ensure that direct arrivals are
459 detected and associate phases belonging to the same event prior to locating it
460 based on S-P travel time differences and backazimuth estimate (Mykkeltveit
461 and Bungum, 1984). However, the event location precision of single small aper-
462 ture arrays is limited due to scatter in the backazimuth and uncertainties in
463 automatically measuring the travel time differences (Schweitzer et al., 2012),
464 such that at seismological observatories, observations from several small aper-
465 ture arrays as installed at the Wysin site are usually interpreted jointly, em-
466 ploying for example the generalized beamforming location algorithm (Ringdal
467 and Kværna, 1989). Recently, techniques have been developed to integrate ar-
468 ray recordings with network recordings for event location (Sick and Joswig,
469 2016; López-Comino et al., 2017). In addition, the use of multiple use for event
470 location has been picked up (Stipčević et al., 2017).

471 In the following, we evaluate the location capability of the WARN array. We
472 use a phase detection module developed in-house, which will be integrated
473 into *Lassie* in near future. This module performs a semblance analysis in
474 short moving time windows to measure backazimuths and slowness of arrivals
475 with higher precision than feasible during the *Lassie* automatic beamforming.
476 While events are detected automatically applying a Short Time Average over

477 Long Time Average (STA/LTA) detector on the semblance traces, accurate
478 P - and S - phases are picked manually based on slowness values. We analyzed
479 time segments of data containing the KNMI reported events. In case of event
480 detection (See the last column in Table 1), the event location is estimated using
481 the S-P arrival time difference as well as the estimated backazimuth employing
482 the velocity model presented in Fig. 3b. The obtained twelve event locations
483 are compared to the KNMI catalogue event locations in Fig. 10. For almost all
484 events, backazimuth estimates agree very well with the KNMI catalogue event
485 locations. The mean deviation is 3° , while the largest is only 11° , whereas the
486 average backazimuth deviation for the detected events using *Lassie* automatic
487 beamforming is 38° , excluding two very large values. The mean value of epi-
488 central mislocation is 2.1 km, whereas its maximum is 5.3 km. However, the
489 error is largest for events closest to the array. Therefore, we suspect that this
490 deviation does not originate from errors in arrival time measurements of P-
491 and S-phases, which would presumably be more randomly distributed, but is
492 caused more likely by an erroneous V_p/V_s ratio. Hofman et al. (2017) demon-
493 strate that especially the shallow S-wave velocities vary significantly, which
494 leads to a laterally fluctuating V_p/V_s ratio. There is no reason to assume that
495 such lateral variations cannot be present in the deeper sedimentary layers as
496 well, which could explain the systematic distribution of error in distance. Such
497 errors in event location can be avoided by employing multiple arrays. Never-
498 theless, we think that this comparison shows the inherent capability of arrays
499 to measure slowness vectors of incoming waves with high precision.

500 6 Discussion

501 In this section, we discuss the special ability of a surface array to reduce the
502 background noise level during fluid injection and extraction experiments. Since
503 at both sites, arrays were operating as a complementary element to surface
504 or borehole sensor installations, we can compare noise levels of surface arrays
505 with nearby borehole instruments.

506 At the Wysin site, the noise levels at the borehole GW4 and the nearest array,
507 GLOD, both of them in about 2 km distance to the injection well (see Fig. 1),
508 are compared using spectral analysis. Fig. 11 shows the variation of the noise
509 spectral content measured on the starting day of the injection (June 9, 2016)
510 at the array (Fig. 11a) and the borehole (Fig. 11b). The spectral content of
511 the recorded signal at the borehole shows an increase in the two-hour interval
512 between 17:10h and 19:10h (indicated by a blue line on each panel), which is
513 in the agreement with the injection time, whereas at the surface array, such
514 a correlation is not visible. The source of the noise was most likely related to
515 the pumping activity at the surface close to the injection well (López-Comino
516 et al., 2018). More information about the timing of the injection activity is
517 given by (López-Comino et al., 2017).

518 Fig. 12 shows the noise power spectral density (PSD) during three periods
519 before, during and after fluid injection for the surface array and the borehole
520 station. Ten-minute time windows were analysed and the start time of each
521 period is indicated by white stars on Fig. 11. For the array stations, the PSD
522 is calculated from the array beam, which is formed to detect P-waves gen-
523 erated at the location of the injection at a depth of 4 km. According to the
524 graphs, while the borehole station shows an increase of noise level during the
525 fluid injection for frequencies above 4 Hz, after the injection, the noise level
526 falls to almost the same level as before the experiment, with 10 db fluctua-
527 tion. However, for frequencies above 60 Hz, the noise is still slightly increased.
528 On the contrary, the noise levels of the array beam before and during the ex-
529 periment are almost identical, except for the narrow frequency band between
530 10 Hz to 18 Hz, where the noise level increases about 5 db during the injec-
531 tion. Furthermore, comparing the surface array and borehole analysis, it is
532 concluded that below 6 Hz, the noise level at the surface array is lower than at
533 the borehole station and this pattern is visible for all three periods. However,
534 for frequencies above 6 Hz before the injection, the noise at the array is larger
535 than in the borehole. During the injection experiment, the noise level for fre-
536 quencies above 60 Hz in the borehole reaches the noise level of the surface

537 array. Seismic noise at the surface array shows a strong variation before and
538 after hydraulic fracturing, in contrast to borehole stations, where the variation
539 is not significant. This observation can be explained with the higher sensitivity
540 of surface installations to daily variation of human activity producing higher
541 seismic noise during daytime and lower seismic noise during night hours.

542 Fig. 12b shows the noise level comparison between the WARN surface array at
543 Wittewierum and at different depth levels of the close-by KNMI station G28.
544 This station consists of an accelerometer placed at the surface and 4.5 Hz geo-
545 phones placed at depths of 50, 100, 150 and 200 m. The horizontal distance
546 between both locations is about 1 km (Fig. 1). The time segments employed
547 for this comparison are 10 minutes long and are extracted before the detection
548 of the largest event with magnitude M_l 1.7 on July 18, 2016. According to the
549 figure, the noise level of the array beam is in general smaller than the noise at
550 a single surface station (see blue dotted and dashed curves). The noise level
551 reduction from a surface measurement (accelerometer) to the 50 m deep in-
552 strument (velocity meter) can reach 10 to 15 db in the 3-20 Hz frequency band.
553 By means of array beam forming we can achieve a 5 to 10 db reduction in the
554 noise level for all frequency bands. At frequencies below 3 Hz, the noise level of
555 the array is similar to the noise level on the borehole stations at 200 m depth.
556 For the frequency range of 6-20 Hz, the array beam shows a lower noise level
557 than achieved at 50 m depth in the borehole and the same level as reached
558 at 100 m depth in the borehole. As expected, the high frequency noise on the
559 borehole sensors decreases the deeper the sensors are placed. Below 50 Hz,
560 the incremental decrease with depth is larger the higher the frequencies are.
561 However, the borehole sensor at 100 m depth is an exception, since it shows
562 high noise at frequencies above 30 Hz, increasing even to the noise level of
563 the surface stations (measured on the accelerometer of G28 and the central
564 station of the WARN array). The reason is unclear, but may be related to the
565 local geology and potentially, waveguides at depth.

566 In general, the noise level at the Wysin site is lower than at the Wit-
567 tewierum site. Especially, an instrument placed at 50 m depth at Wysin ex-

568 periences lower noise levels than an instrument placed at 200 m depth above
569 the Groningen field. This is a result of a higher level of cultural noise in the
570 Netherlands compared to Poland (Kraft, 2016) and represents another aspect
571 that should be included when planning a monitoring network. Unfortunately,
572 so far the only source of information are up-front test measurements, since
573 no general database for a comparison of noise levels at different locations is
574 available yet.

575 **7 Conclusions**

576 In this paper, we evaluated the performance of small aperture arrays with
577 respect to their ability to detect target events. For the purpose of planning
578 array measurements before injection experiments, we recommend:

- 579 1. In order to design a small aperture array for the specific target to moni-
580 tor weak induced seismicity at shallow depths, the array transfer function
581 should be analysed and different array geometries should be evaluated and
582 compared, specifying the expected source-receiver distances and expected
583 slowness range of incoming P and S waves, the anticipated magnitudes to
584 be monitored and the estimated frequency range and expected horizontal
585 wavenumber ranges. Figs. 1 and 2 give examples for two real case studies.
- 586 2. Plots as shown in Fig. 3 and Fig. 4 are helpful to support the planning of
587 the array design. The velocity models and targeted event depths are used
588 to derive slowness ranges, and from the expected frequencies the range
589 of horizontal wavenumbers. The theoretical wavenumber analysis showed
590 that increasing the aperture of the array leads to a decrease in K_{min} and
591 thus, the crossing point with the wavenumber-distance lines is shifted to
592 lower frequencies. This means that a lower frequency band can be included
593 in the beamforming analysis. Especially for monitoring of nearby micro-
594 seismicity, increasing the aperture has a limitation, though, since the plane
595 wave approximation may be violated if the aperture of the array is in the
596 same order as the source-array distance.

597 3. Planning a microseismic monitoring array often is subject to restrictions
598 such as land use, accessibility of the stations, and other logistics. The lo-
599 cal noise level at individual stations poses constraints as well, since high
600 noise sites should be definitely avoided. Additionally, the source mecha-
601 nisms of the individual earthquake events can influence the performance of
602 the array. We suggest to apply synthetic simulations and design the array
603 geometry based on an optimization approach considering all seismological
604 and logistical information about the targeted site and sources. An example
605 is provided in the study by Karamzadeh et al. (2018).

606 From the specific experience we gained by analysing data recorded by small
607 scale arrays at Wysin and Wittewierum, we conclude:

- 608 1. Borehole installations should be combined with surface arrays during hy-
609 drofracturing operations. Although no injection-induced event occurred at
610 Wysin above the magnitude of completeness of M_w 0.5, we could demon-
611 strate how hydrofracturing operations impact the SNR at shallow bore-
612 holes, while small aperture surface arrays, located at larger distances to
613 the injection well, are less affected. For instance, the shallow borehole in-
614 stallations suffered from very high noise related to the pumping activities
615 during the injection itself. Therefore, combining boreholes close to the in-
616 jection site with small aperture arrays at larger distances is beneficial to
617 ensure a constant magnitude of completeness over the full period of the
618 experiment.
- 619 2. It is preferable to employ multiple surface array installations as an alter-
620 native to a dense network of borehole sensors, especially in areas experi-
621 encing high levels of noise. In case of the Groningen gas field, we could
622 detect a multitude of potential events below the magnitude of complete-
623 ness of the KNMI catalogue and locate events comprised in the catalogue
624 with $M_l > 0.2$. According to the comparison between KNMI network and
625 single array event locations, the WARN array was capable to determine the
626 backazimuth and arrival time differences of P- and S-phases with high pre-

Table 1 KNMI catalogue. See Fig 10 to compare the locations with the locations obtained from single array beamforming (BF).

No	Date	Time	Lat	Lon	Depth	MI	Vis. by eye	Event BF	Phase BF
1	2016/07/17	12:01:18.89	53.182	6.887	3	0.5			
2	2016/07/18	08:58:11.50	53.378	6.709	3	1.7	x	x	x
3	2016/07/22	10:55:15.30	53.280	6.855	3	0.3			
4	2016/07/23	17:59:45.00	53.219	6.898	3	0.1			
5	2016/07/26	14:02:10.40	53.277	6.907	3	0.9			
6	2016/07/28	05:32:13.09	53.281	6.860	3	0.2		x	x
7	2016/07/28	15:57:28.10	53.250	6.824	3	0.8	x	x	x
8	2016/08/07	20:40:22.00	53.374	6.644	3	1.3	x	x	x
9	2016/08/08	00:03:39.39	53.170	6.892	3	0.4		x	
10	2016/08/10	18:16:25.30	53.312	6.669	3	0.5	x	x	x
11	2016/08/14	01:50:44.89	53.234	7.019	3	0.7	x	x	x
12	2016/08/14	04:07:50.70	53.220	6.678	3	0.2	x	x	x
13	2016/08/23	02:11:16.10	53.224	7.027	3	0.6			
14	2016/08/23	03:53:30.30	53.223	7.036	3	1.0	x	x	x
15	2016/08/24	13:09:08.40	53.305	6.903	3	0.8	x	x	x
16	2016/08/24	18:44:23.19	53.372	6.724	3	0.6	x	x	x
17	2016/08/24	23:44:03.00	53.354	6.950	3	1.1	x	x	x
18	2016/08/28	03:27:53.10	53.401	6.636	3	1.3	x	x	x

627 cision. Using more than one array, will decrease the location errors caused
628 by an improper velocity model (Stipčević et al., 2017).

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634 and obtaining the permissions for installation.

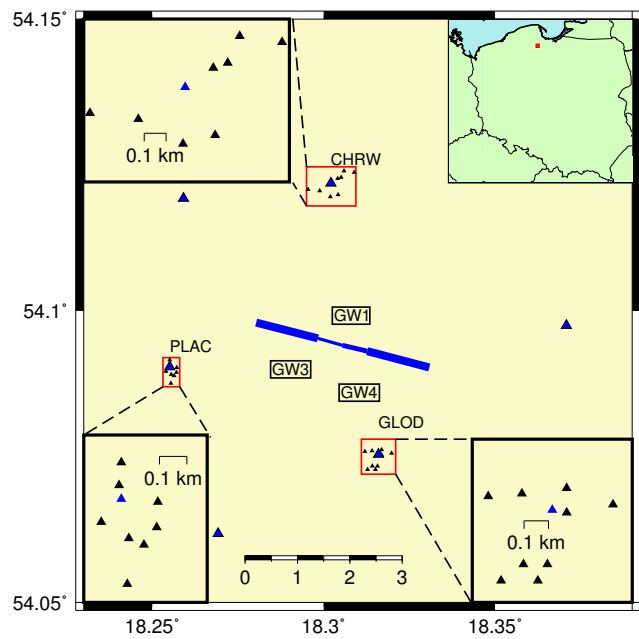
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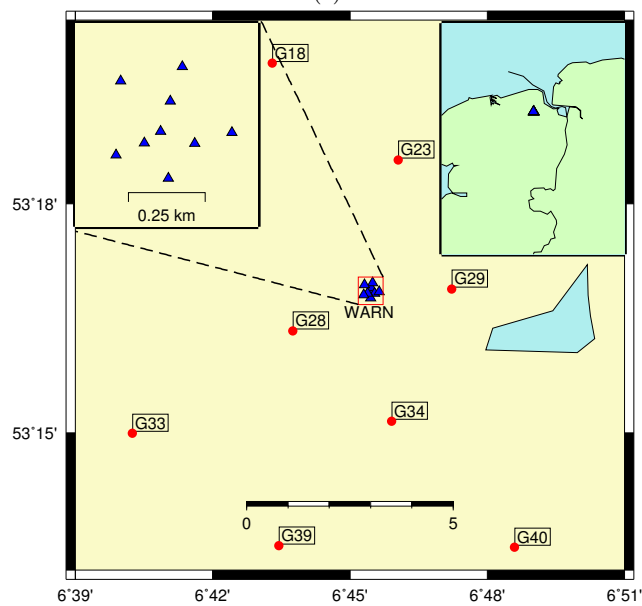
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(a)



(b)

Fig. 1 a) Overview of the Wysin hydrofracturing experiment site in Poland and the locations of the installed seismic stations to monitor related induced seismicity. b) Wittewierum site above the Groningen gas field, the Netherlands. Blue line in (a) shows the location of the fluid injection at the depth of 4 km. In (a) and (b): red dots show the location of borehole stations. Blue triangles represent broadband stations and black triangles mark short-period stations. Red rectangles show location of inset maps.

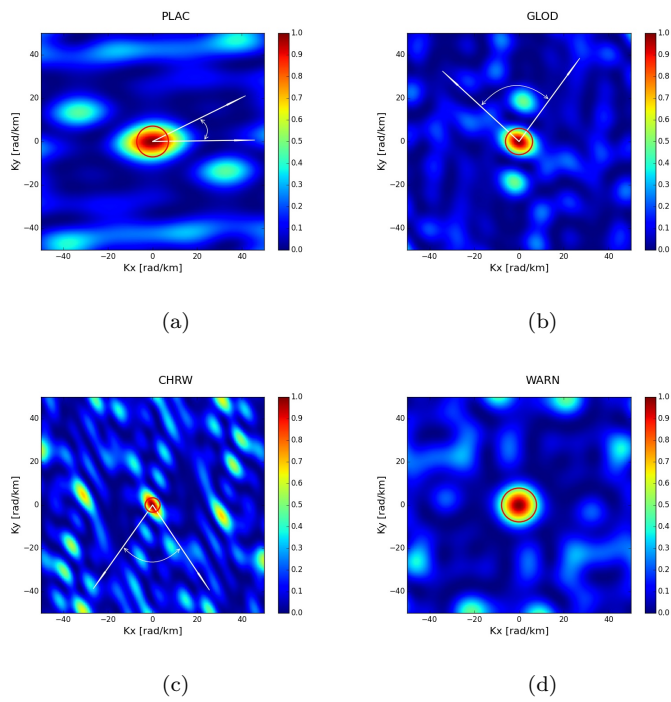
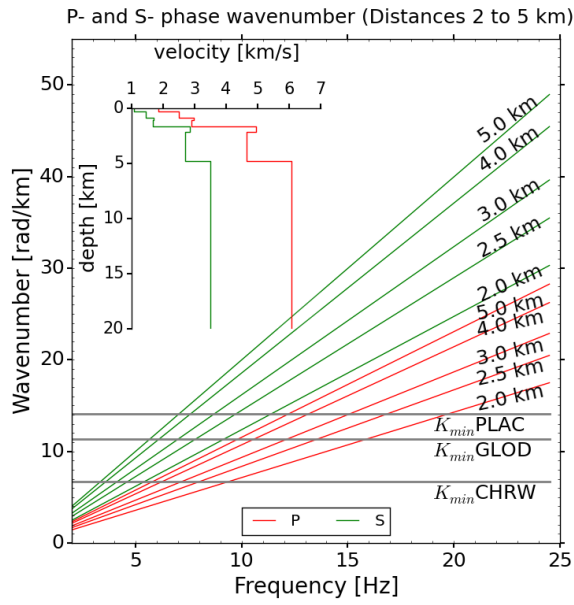
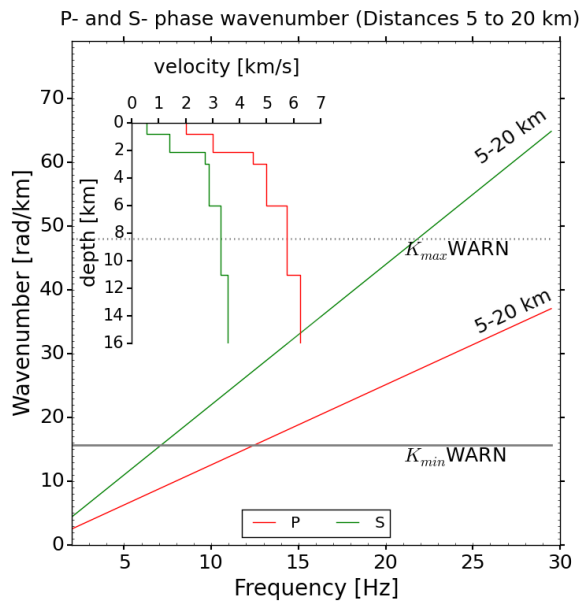


Fig. 2 Array transfer functions (ATFs) for the three arrays at Wysin (a)-(c) and Wittewierum (d). Red circles show the width of the main lobe which is equivalent to the array resolution, i.e. K_{min} . The arrows in (a)-(c) indicate the expected backazimuth range for incoming signals as inferred from Fig. 1.



(a)



(b)

Fig. 3 Theoretical wavenumbers of P- and S-phases for the frequency range of incoming waves and expected epicentral distances and depths for (a) arrays at the Wysin sites PLAC, GLOD and CHRW and (b) the array at the Wittewierum site (WARN). The velocity models that are used to estimate slownesses are shown, and depths of events are 4 km and 3 km in (a) and (b), respectively. The value of K_{min} is indicated for each array by a horizontal solid black line. The values of K_{max} for the PLAC, CHRW and GLOD arrays are 61, 45 and 52.5 rad/km, respectively. For the WARN array, it is about 48 rad/km, which is indicated in (b) by the horizontal dotted line.

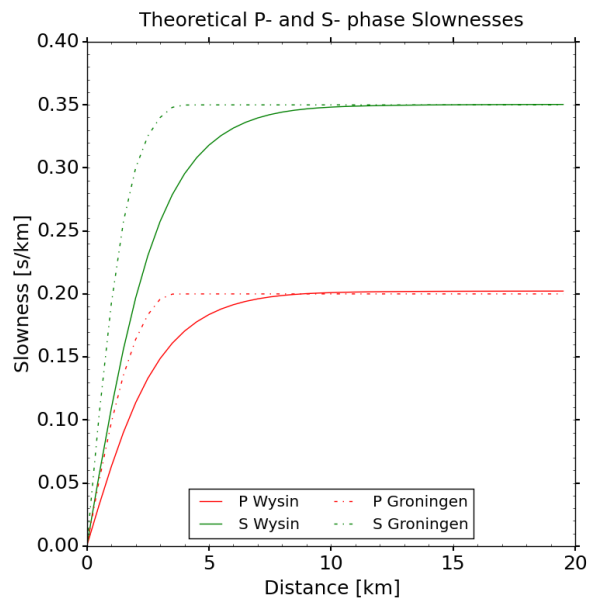


Fig. 4 Theoretical slownesses of P- and S-phases for the Wittewierum (dashed lines) and Wysin (solid lines) arrays for an assumed event at 3 km and 4 km depth respectively; the velocity models are shown in Fig. 3.

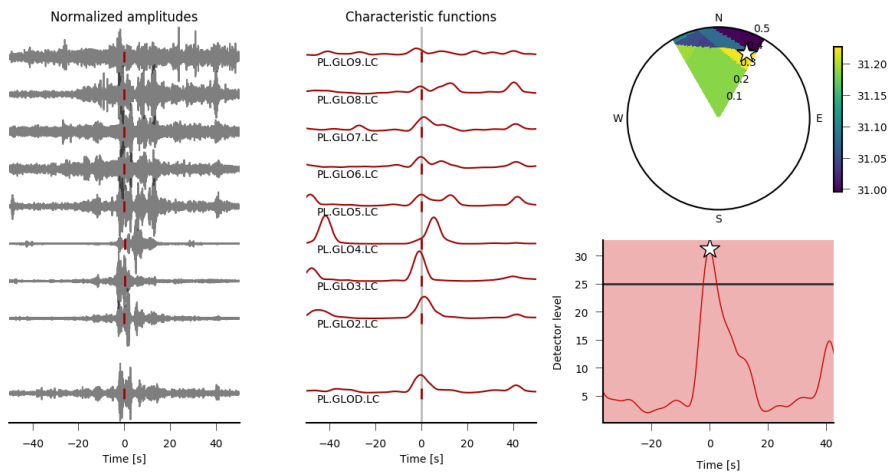


Fig. 5 A detection on the GLOD array shortly after the injection was stopped (see white star no. 1 in Fig. 11). This detection is not confirmed to be an event related to the hydrofracturing experiment. a) Left: filtered seismic traces; centre: characteristic functions, vertical dashes mark applied shifts according to the maximum in the slowness-backazimuth domain; top right: slowness-backazimuth slice coloured by amplitude of stacked characteristic functions, white star denotes the maximum coherence; bottom right: detector level, the white star represents the local maximum detected once the coherence exceeds the detector threshold indicated by the black horizontal line.

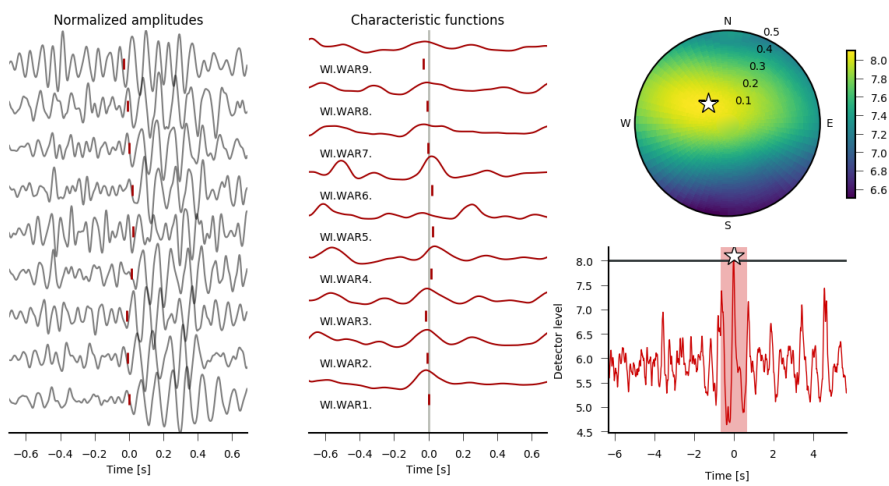


Fig. 6 Example of event detected by *Lassie* on the WARN array on July 18, 2016. For a description of the plot see caption of Fig. 5.

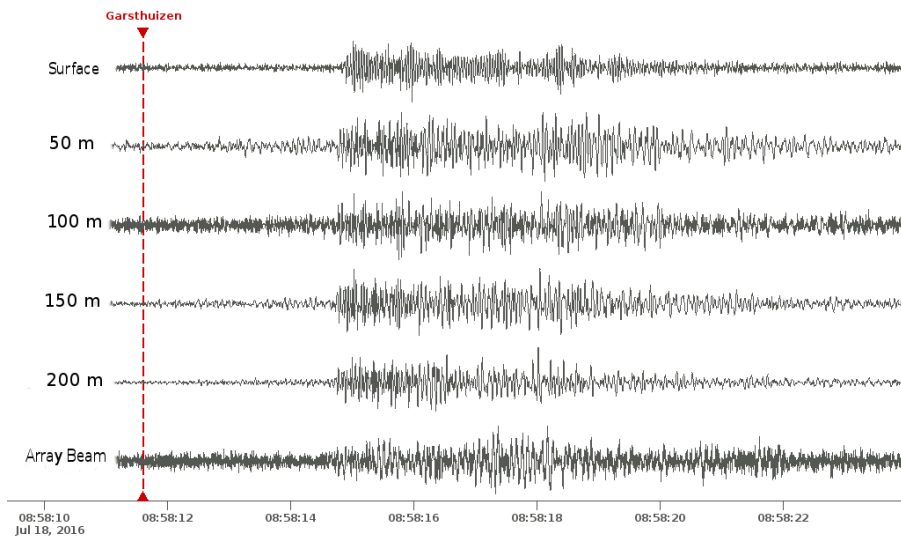


Fig. 7 Waveforms of the event on July 18, 2016 (08:58:11). The five top traces are recorded at the G28 shallow borehole station. The top trace stems from the surface accelerometer, the following four traces from different levels within the borehole. The last trace shows the WARN array's beam (according to the P-phase horizontal slowness vector).

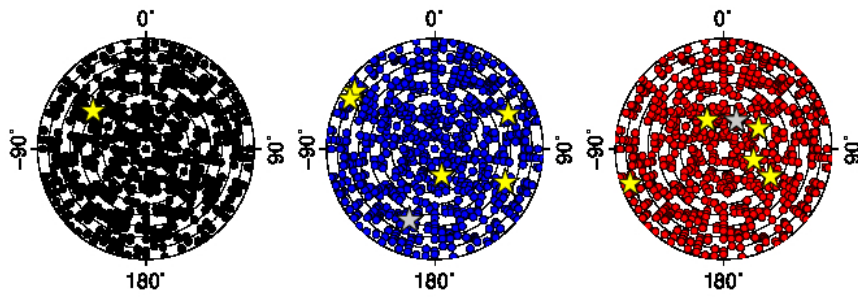


Fig. 8 Polar plots showing the distribution of measured backazimuths and slownesses for different detector strengths (slowness varies from 0 s/km in the centre to 0.5 s/km at the outer rim, intergrid line distances correspond to 0.05 s/km). Left: detector strength < 16.5, middle: detector strength between 16.5 and 18, right: detector strength > 18. Stars indicate events registered in the KNMI catalogue.

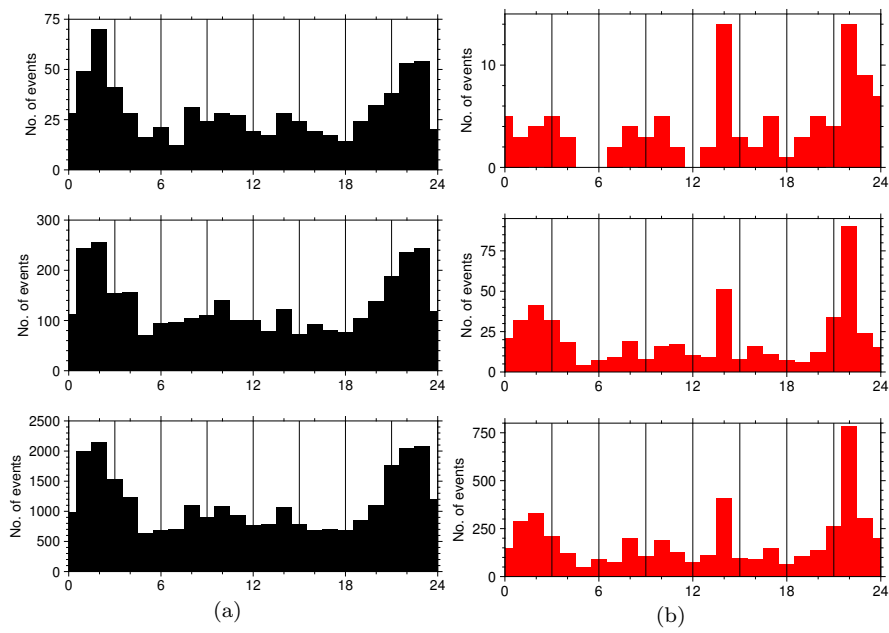


Fig. 9 Distribution of the number of events with time of day for three different ranges of apparent velocity (top: apparent velocity > 10 km/s, middle: apparent velocity between 5 and 10 km/s, bottom: apparent velocity < 5 km/s); left: detector strength < 16 , right: detector strength > 18 .

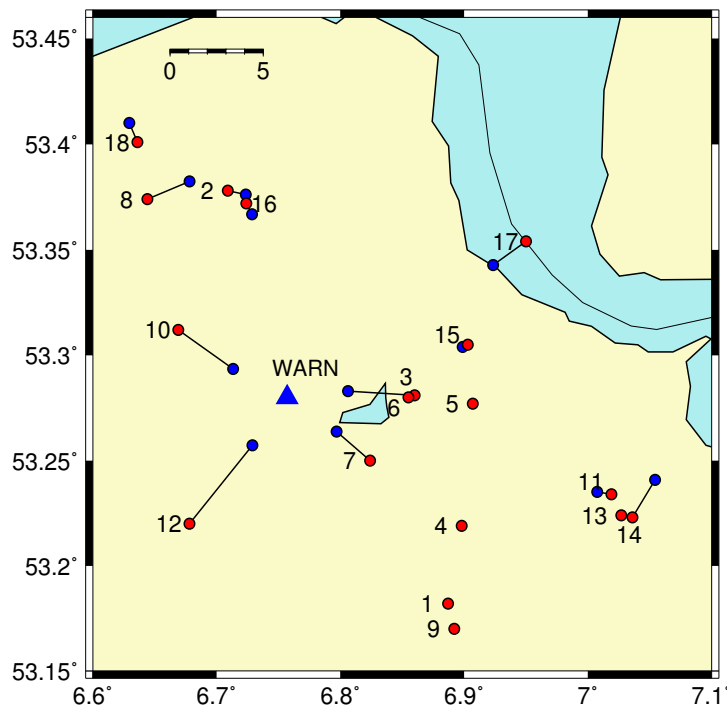
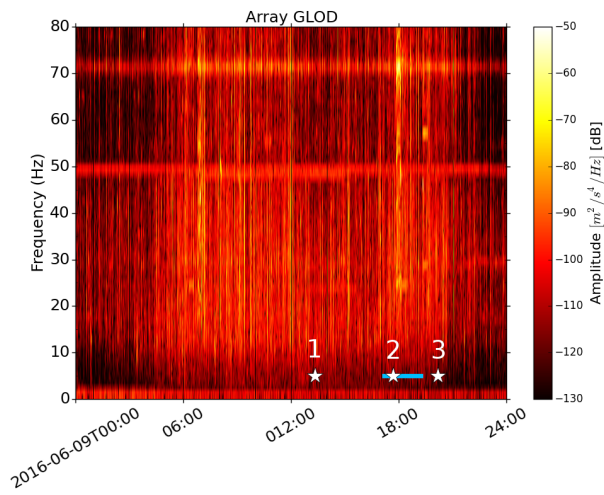
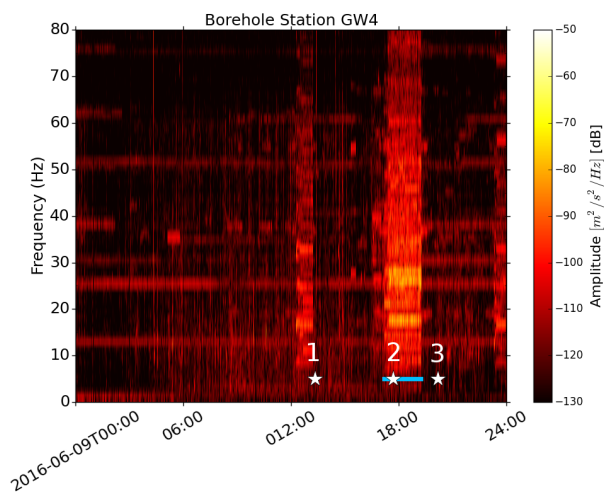


Fig. 10 Blue triangle shows the WARN array. Red circles are locations reported in KNMI catalogue (Table 1) and blue circles are location calculated from single array beamforming method (phase detection module). Numbers are in accordance with the numbers in Table 1.



(a)



(b)

Fig. 11 Noise spectral variation during the hydrofracturing operation at about 2 km distance from the injection point measured on a) a surface array beam (GLOD) and b) at a borehole station (GW4) (see Fig. 1 for the locations of instruments). The blue lines on each plot show the injection time period and the three white stars show the start time of the two-minute time segments used to compare the PSD (Fig. 12) for three periods before, during and after the injection.

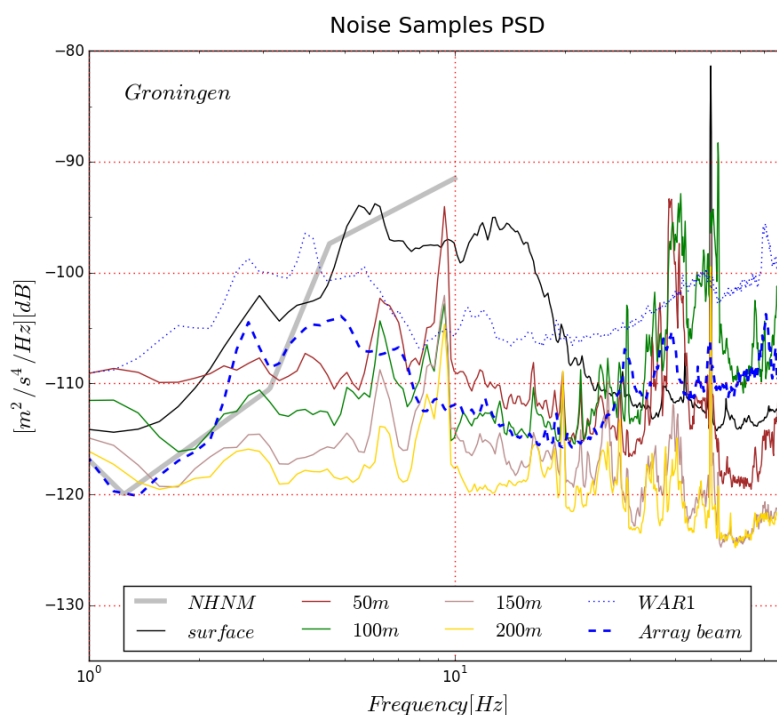
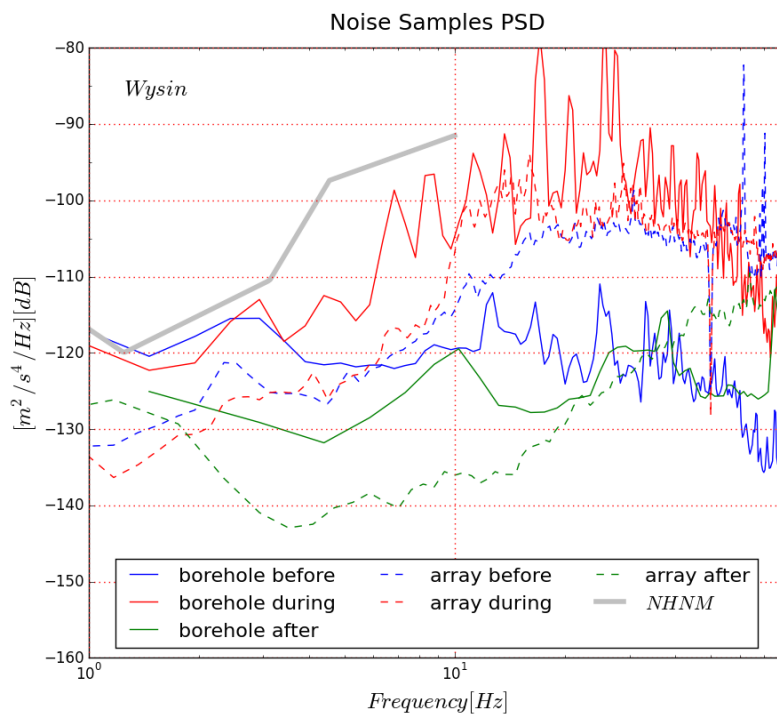


Fig. 12 PSD of the noise samples recorded during a) three periods before (blue lines), during (red lines) and after (green lines) the hydrofracturing experiment in Wysin and b) in Wittewierum. The thick grey line displays the new high noise model according to Peterson (1993). In a), solid lines mark PSDs of recordings in the borehole, whereas dashed lines display PSDs of recordings on the surface array. In b), solid lines mark PSDs of recordings from the instruments of the shallow borehole station G28, the dashed blue line indicates the PSD of the WARN array's beam and the dotted blue line displays the PSD of a record from the central array station, WAR1.