Final Response for the manuscript "Obtaining reliable source locations with Time Reverse Imaging: limits to array design, velocity models and signal-to-noise ratios" by Claudia Werner and Erik H. Saenger

Dear Editors and Reviewers,

thank you for your effort in improving this manuscript. We feel that it has improved significantly in its readability. In the following, you will find a summary of the comments by Referees followed by our response and changes made to the manuscript. At the end of this file you will find a marked-up version of the manuscript.

Please note: In the following text referee's comments are put in bold while the author's response is in normal script. Referee's comments may have been shortened for easier reading. No meaning of content was changed. Numbering of the comments of referees was kept the same.

Comments of Referee #1

Major comments:

1) The study suggests that more regular arrays should be better than relative asymmetric arrays. Can the authors present an array design works equally or even better than the 31-receiver irregular array?

Thank you for your suggestion. We added extra simulations with 32 regular stations, as you proposed, with the real velocity model in Southern California and found that it produces the most accurate source locations.

2) The authors improve RTI procedure by Witten and Artman (2011) using illumination map to remove artefacts from velocity models. To make readers directly known how this works, figures for one velocity model in Figure 11 before dividing illumination map, illumination map and after dividing could be presented.

This is a very good suggestion. However, we feel that the manuscript is quite long already (which was also hinted at by Referee #2) and therefore refrain from adding this additional figure. Nevertheless, we added a more direct reference to the study of Witten and Artman (2011) in which such figures are shown and discussed.

3) The authors demonstrate the imaging conditions le and lp in Figure 1. But there other two imaging conditions Is and Id used in this study. To display the imaging conditions well to the readers, the other two should be plotted in Figure 1 as well.

We thank you for pointing out this missing information. We added Id to the figure as you suggested. As you can see, Id is not able to locate the source reliably in this case. There are artificial focusing spots outside the source region. Since this example shows an explosion source, Is does not show anything and we therefore omitted it.

4) To assess the effect of signal-to-noise ratio to localization quality, a set of SNRs have been used in this study. It will be better to add a noise-free results into Figure 13 as a reference for the other results derived from traces with noise.

Thank you for suggesting to add the results without any noise to Figure 13. In our opinion, this will improve the readability.

Minor comments:

Page 2 Line 8: "Conditions" should be "conditions" Page 6 Line 25: "position" should be "positions" Page 14 Line 4: "Fig.(a)" should be "Fig.14(a)" Thank you for your thorough read of the manuscript. All minor comments as mentioned above were corrected in the revised manuscript as suggested.

Page 25 Figure 2: The width of the source area may need to be labeled such as where is the wavelength of p-wave

We regret not designing the figure more self-explanatory. We modified Figure 2 and hope that it is more clear now. We rephrased the x-axis label and added the source position on the x axis. Additionally we marked the y values that are discussed in the text. However, we do not want to put an explicit distance on the x axis because this figure should just show a concept that can be applied to arbitrary models and arbitrary location errors.

Anonymous Referee #2

Major comments:

1) The paper could be shortened and the main findings presented in a more systematic way. At times, I have an impression that the authors describe everything what has been done, rather then summarizing their main findings.

Thank you for your thorough review and honest assessment. We rewrote parts of the manuscript to present our main findings more systematically and more clearly. The changes are mentioned below your corresponding comments. However, we were not able to shorten the manuscript significantly without removing a significant part of the content.

My intuitive conclusion would be that it is best to use a random network distribution, spanning a range of inter-station distances with as many stations as possible. I'm not asking explicitly to test such a case, but if it is not too difficult, it could be a good addition.

We thank you for sharing your ideas on what would be an optimal station distribution. However, we decided to perform additional simulations with 32 stations with homogeneous inter-station distances and obtained very accurate source locations that are superior to the source locations obtained with the real stations in Southern California. We therefore conclude that with a similar amount of stations, regular inter-station distances are better than random inter-station distances. We believe that this is an important conclusion for the application of TRI to field data. Performing a synthetic simulation as you suggested with a random network distribution with a range of inter-station distances would be an interesting addition to this study. Additionally, we agree with you that a lot of stations improves the location results and therefore as many stations as possible should be used. However, we decided to not include it in order to keep the topic of the manuscript a bit more focused on the applicability. Often there are not a lot of stations available and therefore it is crucial to know that placing stations more regularly will increase location accuracy.

2) "Localization" should be replaced throughout the manuscript with "source location", also "localization quality" is actually the "location accuracy". It would be good to find a native speaker to read the paper before re-submission if possible.

As suggested, we discussed the manuscript with expert speakers of the English language and changed "to localize" into "to locate" throughout the manuscript. Additionally "localization quality" was changed to "location accuracy". The word "localization" was either turned into "source location" or kept as "localization" to highlight that we are describing the process of finding a source location in individual phrases. Although not explicitly marked in the supplement, we changed the abstract and the title as well. We thank you for suggesting the term "source location" because now the title incorporates the word "source" and therefore states more directly what the manuscript is dealing with.

3) Defining the criteria to assess the performance of TRI is not clear enough. I did not understand what are categories I-IV. Also, some parts are unnecessarily repeated.

We thank you for pointing out that this part is not well explained. We rewrote section "2.3: Evaluation of location success" and concentrated especially on the part where the four categories are explained. Unnecessary repetitions were removed and the explanations were written more precise. Furthermore we updated Figure 2 to help explain this part more directly. Additionally, we highlighted that muting the upper part of the model interferes with locating shallow sources and explained more clearly why we chose a rather large error for the source location.

4) The proposed method is not suitable for shallow sources because the authors mute the upper part of the model. This is an important limitation and should be explicitly stated in the conclusion.

We added the muting of the upper part of the model explicitly in the conclusion and stated it more clearly in the discussion. We are much obliged for helping us sharpen our main message.

5) When the authors are talking about the real data from Southern California, they actually use synthetic data. This is fine but needs to be better explained. Clearly: "To mimic a real case scenario from Southern California, we simulate ... The advantage of using synthetic data when testing a method is because we know what the true answer is ..."

This is a good suggestion. The corresponding paragraph was changed according to your suggestion.

6) The discussion part should be more systematic. It is currently divided by recent literature and it is comparing the results from this study with the literature. Instead, it should be divided by the nature of the results, where the literature is cited as needed.

Thank you for your detailed evaluation of our writing style. We did not realize that we accidentally wrote the discussion this way. We rewrote the discussion to make it more clear and removed unnecessary repetitions. We restructured the section to use references from literature to support our findings instead of the other way around. Additionally, we separated the parts of the discussion more clearly into general discussion about the used method, the station distribution with homogeneous velocity models, complex velocity models and noise and finally, future challenges.

Additional Comments from Referee #2 as found in the supplement to the comment (only major comments are listed, minor comments such as rephrasing of individual sentences or paragraphs for readability are not commented but are marked in the revised manuscript):

• Suggestion to change some of the section titles

Thank you for suggesting to change some of the section titles. We feel that they more clearly express what the sections are about now. We changed the titles of the following sections according to your suggestions as follows:

section 1.1: We kept the original title (but change the word "localization") to reflect that this section deals only with the source location of TRI and does not discuss the potential of TRI to characterize sources

section 3.1: changed according to suggestion

section 3.2: changed to be more precise

section 3.3: change according to suggestion

• Page 4-5: You suggested to use the deterministic signal case of the signal to produce the illumination map

We thank you for suggesting to further improve this method. However, this was tested in previous studies and also as a predecessor to this study. We found that using the not time reversed signal to produce the illumination map achieved the best results in suppressing artefacts. In our opinion, including an additional part in the manuscript discussing a deterministic signal or random noise to produce the illumination map would be too elaborate and elongate the manuscript unnecessary. However, we added a more direct reference to the paper of Witten and Artman (2011) where this topic is discussed in more detail.

• Page 5: the mention of source coordinates is meaningless without giving the origin We thank you for pointing out this obvious mistake. We changed how we describe the

We thank you for pointing out this obvious mistake. We changed how we describe the model dimensions at the beginning of the section to include the origin point and to be able to place the source coordinates in relation to the model.

• Page 7, Line 9-10: The referee suggested to use Pythagoras theme to calculate the location error

We agree with you that Pythagoras' theme should be used for calculation location errors. However, in this study the focus was to find station distributions that yield locations roughly in the vicinity of the initial source location. We therefore did not want to restrict the source area too much. When locating real data it is sometimes better to have a location with a rather large error than no source location at all and we wanted to include this in this study to make the study useful for a wider range of applications. For specific applications, the error should be estimated more accurately of course and the setup should be chosen to minimize the error.

Additional changes not directly suggested by the Referees

We changed Figure 4 so that the last data point is not intersecting with the axis on the right. Please excuse this minor mistake that we overlooked in the first version of the manuscript.

Although not explicitly mentioned, we changed the wording in the abstract to incorporate the suggestions of Referee #2 to use "to locate" rather than "to localize". We would like to change the title as well, if possible, to reflect this and to state more precisely what the manuscript is about.

Yours Sincerely,

Claudia Werner and Erik H. Saenger

Obtaining reliable localizations source locations with Time Reverse Imaging: limits to array design, velocity models and signal-to-noise ratios

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Abstract. Time Reverse Imaging (TRI) is evolving into a standard technique for localizing locating and characterizing seismic events. In recent years, TRI has been applied to a wide range of applications from the lab scale over the field scale up to the global scale. No identification of events and their onset times is necessary when localizing locating events with TRI. Therefore, it is especially suited for localizing locating quasi-simultaneous events and events with a low signal-to-noise ratio. However,

5 in contrast to more regularly applied localization methods, the prerequisites for applying TRI are not sufficiently known.

To investigate the significance of station distributions, complex velocity models and signal-to-noise ratios for the localization qualitylocation accuracy, numerous simulations were performed using a finite difference code to propagate elastic waves through three-dimensional models. Synthetic seismograms were reversed in time and re-inserted into the model. The time-reversed wavefield backpropagates through the model and, in theory, focuses at the source location. This focusing was visu-

10 alized using imaging conditions. Additionally, artificial focusing spots were removed with an illumination map specific to the setup. Successful localizations locations were sorted into four categories depending on their reliability. Consequently, individual simulation setups could be evaluated by their ability to produce reliable localizations source locations.

Optimal inter-station distances, minimum apertures, relations between array and source location, heterogeneities of interstation distances and total number of stations were investigated for different source depth as well as source types. Additionally,

15 the quality of the localization accuracy of the locations was analysed when using a complex velocity model or a low signal-tonoise ratio.

Finally, an array in Southern California was investigated for its ability to localize locate seismic events in specific target depths while using the actual velocity model for that region. In addition, the success rate with recorded data was estimated.

Knowledge about the prerequisites for using TRI enables the estimation of success rates for a given problem. Furthermore,

20 it reduces the time needed for adjusting stations to achieve more reliable localizations locations and provides a foundation for designing arrays for applying TRI.

1 Introduction

The localization and characterization of seismic events in the subsurface is crucial for understanding physical processes in the Earth. Well-established methods are able to localize locate most seismic events in a fast and reliable manner; but they rely on identifiable onsets of events. Time Reverse Imaging (TRI) is a method especially suited for localizing locating and

- 5 characterizing events which are indistinguishable in traces because they occur quasi-simultaneously or are superposed by noise. The prerequisites for more regularly applied localization methods are very well known. However, which station distributions, which degree of complexity in the velocity model and which level of noise hinder or enhance localizations locating events with TRI is not sufficiently known. Therefore, this study systematically tests different station distributions for their localization capabilities while considering complex velocity models and low signal-to-noise ratios.
- 10 TRI uses the whole recorded waveform rendering the identification of events and their onsets obsolete. It can be applied as long as the wave propagation can be described with a time-invariant wave equation. Seismic traces are reversed in time and backpropagated through a medium until they focus on the initial event location. Imaging Conditions conditions are used to visualize aspects of the backpropagating wavefield and obtain the localization pointsource location.
- TRI has been applied in earth sciences as well as medical sciences for some time (Fink et al., 1999). In recent years multiple
 studies have shown that TRI is an easy-to-use and reliable localization tool: It has been used to retrieve source information on various scales from the lab scale in non-destructive testing (Saenger, 2011; Anderson et al., 2011; Harker and Anderson, 2013; Kocur et al., 2016) over the field scale, for example in volcanic tremor (Lokmer et al., 2009) and non-volcanic tremor applications (Larmat et al., 2009; Horstmann et al., 2015) and above hydrocarbon reservoirs (Steiner et al., 2008), up to the global scale (Larmat et al., 2006, 2008). However, to apply TRI, a fairly accurate velocity model is needed to accurately
 backpropagate the wavefield. With increasing availability of high resolution large three-dimensional velocity models and the
- knowledge about prerequisites, TRI has the potential to localize locate seismic events, which could not be localized located reliably thus far, in a wide range of applications.

1.1 Restrictions to the localization capabilities of TRI

The estimation of localization qualities location accuracy is one major challenge when applying TRI. A common approach is, therefore, to perform a preliminary synthetic study to test if the given velocity model and station distribution enable reliable localizations locations. If the synthetic study fails, the setup is adjusted until either the study is abandoned or a sufficiently reliable result is achieved. This adjustment phase can be time-consuming because there are multiple characteristics appearing at once that may hinder localizations the localization.

Numerous characteristics of where stations are placed at the surface seem to influence the chance of success with TRI 30 significantly. In theory, TRI works with only one station (Montagner et al., 2012). Nevertheless, in most cases more stations are needed to obtain a stable result. Therefore, the total number of stations is often considered to have a major influence on the success or failure of localizations obtaining accurate source locations (Kremers et al., 2011; Horstmann et al., 2015). However,

numerous reports state that a smaller amount of stations works just as well (Gajewski and Tessmer, 2005; Steiner et al., 2008; Lokmer et al., 2009; Larmat et al., 2009).

The aperture of the array seems to be another characteristic of the station distribution influencing localization qualitylocation accuracy. Steiner et al. (2008) and Lokmer et al. (2009) report false localizations locations in the two-dimensional case when

5 the aperture of the array is limited. Artman et al. (2010) emphasize the importance of a sufficiently large aperture to get obtain a spatially focused localizationlocation.

Distances between the individual stations and the homogeneity of these inter-station distances seem to be important as well (Lokmer et al., 2009). Furthermore, the azimuthal gap, which is the angle between two stations viewed from the epicentre location, is introduced by Horstmann et al. (2015). It is an indirect measurement for the heterogeneity of inter-station distances.

10 Horstmann et al. (2015) observe an enhanced localization result if the maximum azimuthal gap is small. Lokmer et al. (2009) and Horstmann et al. (2015) also note a different quality of focusing for sources in different depths while using the same stations.

In addition to the placement of stations, the velocity model can influence the failure or success significantly influence the success rate of TRI. An erroneous velocity model A velocity model that differs from the true velocity model may inhibit the lo-

- 15 calization of real eventswhile a rather complex velocity model may hinder the localization already during preliminary synthetic tests. As long as errors are. However, if the error is small enough, TRI appears to be successful with a false velocity model is still successful (Gajewski and Tessmer, 2005; Lokmer et al., 2009; Saenger, 2011). Similarly, a smoothed velocity model does not significantly influence the results (Gajewski and Tessmer, 2005). Furthermore, complex velocity structures like low-velocity zones or sharp velocity contrasts may inhibit the application of TRI even when using synthetic data (Larmat et al., 2009).
- 20 Nevertheless, necessary simplifications may inhibit localizations of due to the availability of velocity models may inhibit localization of real events with TRI (Artman et al., 2010; Horstmann et al., 2015). Common simplifications include the usage of a constant ratio of p-wave velocity to s-wave velocity or a constant density. Additionally, complex velocity structures may alter the final image produced with TRI (Larmat et al., 2009).

A high level of noise in the traces may inhibit localizations the localization with TRI, even when the array and the velocity model are sufficiently wellgood. In theory, TRI works even with a very low signal-to-noise ratio because noise is random and will not superpose constructively to form a focus during the backpropagation of the wavefield. Gajewski and Tessmer (2005) show traces with events not distinguishable from the noise and TRI is still able to reconstruct the source location. Witten and Artman (2011) create synthetic data with signal-to-noise ratios as low as 0.25 and show successful localizations Nevertheless, they observe a decrease in localization-location accuracy with lower signal-to-noise ratios.

30 1.2 Objective of this study

This study aims at finding station distributions producing reliable localizations source locations with TRI. This Finding these optimal station distributions is crucial to estimate the success rate of TRI with a given set of stations. Additionally, the time needed to adjust station distributions may be decreased. Furthermore, the prerequisites of the method should be known when

designing an array for using TRI. Therefore, the influence of the station distribution, the complexity of the velocity model and the rate of noise on the localization quality location accuracy were investigated.

We performed numerous simulations to systematically analyse different station distributions and their influence on the localization quality location accuracy of sources in different depths as well as of different source types. The focus was thereby

- 5 on the distance between receivers, the symmetry of the array in relation to the source position, the azimuthal gap between receivers and the number of stations. Simulations were performed first with a homogeneous velocity model and afterwards with a complex velocity model. Localization quality Location accuracy was investigated while the velocity model is known and when it is not known correctly. We investigated the ability of TRI to cope with very low signal-to-noise ratios. To complete the study, we applied the guidelines found with the methodical tests to an actual example in Southern California. The ability to
- 10 localize-locate events in a target depth was investigated while using the existing array as well as the actual velocity model for that region by Zeng et al. (2016).

With the example in Southern California we demonstrate how to assess the success rate of localizations the localization with TRI using a synthetic study. Additionally, the station distribution was altered to enhance localization qualitylocation accuracy. We give estimates in which part of the model reliable localizations locations can be expected. Additionally, we demonstrate

15 how to design an array, which produces reliable localizationssource locations.

All simulations were performed using a finite difference scheme to propagate elastic waves through three-dimensional models. The advantage of a purely synthetic study is the suppression of unknown side effects. Therefore, all influences on the localization were controlled to investigate each parameter that the source location is known and subsequently the location accuracy can be estimated. Additionally, parameters influencing the localization could be tested individually.

20 2 The method of Time Reverse Imaging (TRI)

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Time Reverse Imaging (TRI) uses the whole waveform of recorded seismograms to localize-locate and characterize seismic events. The method consists of three steps following the workflow introduced by Saenger (2011) and modified by Witten and Artman (2011): Reversal of individual traces in time, backpropagation of time-reversed wavefield and elimination of artefacts impinged by velocity structure and model setup. Results are afterwards visualized using suitable imaging conditions. In the following, the adaptation of this workflow to this study is described in detail.

The method of TRI was investigated using synthetic seismograms created by forward simulations of the propagation of elastic waves through a medium. suitable medium. In this study first a homogeneous medium and later a heterogeneous velocity model for Southern California was used. The obtained seismograms were not altered besides flipping them in time. Montagner et al. (2012) use binarized seismograms to demonstrate that TRI is based on the coherency of the phases in the seismograms

30 and not on the amplitudes. Therefore, the phase information in the recorded seismograms should be kept as close to the original as possible and any filter should be a zero-phase filter to prevent phase shifts in the time domain. Additionally, all traces need to be time-synchronous.

The time-reversed seismograms were reinserted into the model domain at the exact locations they were recorded at. The receivers of the forward simulation act as sources in the time-reversed simulation. In this study, receivers always mean stations at the surface which act as receivers in forward simulations and sources in reverse simulations. The time-reversed wavefield backpropagates through the model and collapses at the initial source location.

- 5 Imaging conditions highlight specific characteristics of the backpropagating wavefield. They were used to visualize the point in space and time where the wavefield focuses. In this numerical study, the event time was known and the position of foci are compared to the source position used in the forward simulation to determine the <u>quality of localizations</u>accuracy of the event locations.
- Apart from the focus spot at the initial source location, parts of the velocity structure and the model domain itself may be highlighted by artificial focusing spots. Usually, artificial focusing spots appear around the receiver positions at the surface of the model. Additionally, special velocity structures, like low velocity zones, may cause artificial focusing (Larmat et al., 2009). To eliminate those artefacts, the workflow introduced by Witten and Artman (2011) was used. Images produced with the specific imaging conditions were divided by images produced by the backpropagation of random noise. To keep amplitudes and frequency content the same, recorded seismograms were backpropagated through the model not time-reversed. The not
- 15 time-reversed wavefield cannot focus on the initial source location and acts as a noise field. The result is an illumination map of the model highlighting areas where focusing occurs solely due to the used velocity structure and the model setup as described by Witten and Artman (2011). When dividing the results by this illumination map ideally only focusing spots created by interferences of the time-reversed traces remain in the image.

2.1 Simulation of Wave Propagation in Elastic Media

- 20 The wave propagation in three-dimensional elastic media for the forward as well as the backward simulation was performed using a finite difference code developed by Saenger et al. (2000). A second-order finite-difference operator of length two was used. The was used in space as well as in time. The explicit finite difference operators for the used rotated staggered grid are discussed in Saenger et al. (2000). The model boundaries at the bottom and at the sides of the models were absorbing boundaries after Clayton and Engquist (1980) and the top boundary was a free surface that is incorporated as a vacuum layer.
- A non-volcanic tremor application in Southern California was used as a real-life example. Therefore, the models used in this study were set up to be numerically stable when using the receivers used in Horstmann et al. (2015) and the updated velocity model by Zeng et al. (2016) that covers the same region as in Horstmann et al. (2015). All models were 130km by 120km by span from -65km to +65km in x-direction, from -70km to +50km in y-direction and from the surface at 0km to a depth of 28 kmlarge. The grid spacing was set to 0.1 km to balance accuracy and stability in the simulations, while the time step was set
- 30 to 0.01 s. For the synthetic tests, a homogeneous velocity model with the same dimensions as the velocity model from Southern California was created.

Sources in the forward simulations were implemented as moment tensor sources. An explosion source (only $M_{xx} = M_{yy} = M_{zz}$ were non-zero and all were equal in strength) or a strike-slip source (only $M_{xy} = M_{yx}$ was non-zero) was used. As a source signal, the negative normalized second derivative of the Gaussian function, also called a Ricker wavelet, was used.

The Ricker wavelet was implemented, following Shearer (2009), as

$$R(t) = (1 - 2\pi^2 f_p^2 t^2) \cdot exp(-\pi^2 f_p^2 t^2), \tag{1}$$

where t denotes the time and f_p the peak frequency of the wavelet. For all simulations in this study the peak frequency was set to $f_p = 1.75$ Hz which results in a maximum frequency of about $f_{max} = 5$ Hz. In this frequency range non-volcanic tremor is usually observed (Horstmann et al., 2015). The wavelet was centred around at t = 0 s.

The source position was set to x = -1.8 km and y = -28.3 km, which corresponds to an existing recorded earthquake that was chosen randomly and represents one possible source location. The earthquake occurred at the 28th of June 2011 at 14:10 and had a magnitude of 1.68 (NCEDC, 2014). The three depths used for the sources are: $z_1 = 5$ km, $z_2 = 11.9$ km and $z_3 = 22$ km. The deepest source represents the depth where non-volcanic tremor occurs. The medium depth is the depth of the example earthquake while the shallow source represents a shallow end-member and is not geologically relevant in the

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considered region in Southern California.

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2.2 Imaging Conditions

Imaging conditions were used to visualize specific characteristics of the backpropagated wavefield. They were calculated as the maximum value of specific characteristics of the wavefield at each point x of the model domain over the whole simulation

15 time, from t = 0s to t = T. A perfect result would be a single gridpoint with the highest value of the specific imaging condition at the initial source location and very low values everywhere else.

Numerous imaging conditions have been proposed in the past. Here we summarise characteristics of the wavefield that can be used to calculate imaging conditions. The most intuitive imaging condition uses the maximum amplitude of displacement (e.g. used in Gajewski and Tessmer (2005), Larmat et al. (2009) and Saenger (2011)). The maximum particle velocity is also

- 20 a suitable imaging condition (Steiner et al., 2008; Lokmer et al., 2009). Alternatively, the divergence and the curl field can be used for imaging conditions that are sensitive to p-waves and s-waves, respectively (Larmat et al., 2009; Lokmer et al., 2009; Horstmann et al., 2015). The strain field has the potential to directly reveal source characteristics (Larmat et al., 2009; Kremers et al., 2011). Additionally, energy densities can be computed from the parameters mentioned above (Artman et al., 2010; Saenger, 2011).
- In this study, we focused on the four imaging conditions proposed by Saenger (2011): The maximum particle displacement I_d was calculated by

$$\mathbf{I}_d(\boldsymbol{x}) = \max_{t \in [0,T]} \|\boldsymbol{u}(\boldsymbol{x},t)\|,\tag{2}$$

with u(x,t) being the displacement at each point x in the model at each time t.

The maximum p- and s-wave energy density imaging conditions (I_p and I_s) were calculated by separating the wavefield in a divergence field and a curl field, followed by the calculation of the energy densities after Dougherty and Stephen (1988):

$$\mathbf{I}_{p}(\boldsymbol{x}) = \max_{t \in [0,T]} (\lambda + 2\mu) [\nabla \cdot \boldsymbol{u}(\boldsymbol{x},t)]^{2},$$
(3)

$$\mathbf{I}_{s}(\boldsymbol{x}) = \max_{t \in [0,T]} \mu [\nabla \times \boldsymbol{u}(\boldsymbol{x},t)]^{2}.$$
(4)

5 λ and μ represent the Lamé parameters. The maximum total energy density imaging condition I_e was based on the multiplication of stresses and strains at every point in the model domain:

$$\mathbf{I}_{e}(\boldsymbol{x}) = \max_{t \in [0,T]} \sum_{i} \sum_{j} [\sigma_{ij}(\boldsymbol{x},t)\varepsilon_{ij}(\boldsymbol{x},t)].$$
(5)

 $\sigma_{ij}(x,t)$ are the stresses and $\varepsilon_{ij}(x,t)$ the strains at each point x in the model domain at each time t.

These Each of these four imaging conditions were calculated with separate was calculated with a different characteristics of 10 the wavefield. Therefore, they enable the independent inspection of the focus point.

2.3 Evaluation of localization location success

In this study, we want to find prerequisites for the application of TRI. Therefore, it is necessary to be able to evaluate the reliability of the focusing. TRI claims to work with no a priori information about the number of events and their position positions in time and space, which implies that results from this method should enable the localization of events unambiguously.

15 The origin time was known for all simulations and we used only one source per simulation. Therefore, the focus was on the quality of the localization as a position in spacelocation accuracy.

The localization location of an event can be found by looking for the point with the maximum value in each imaging condition. Because the wavefield was inserted only at discrete points at the surface during the backpropagation, the wavefront needs to heal before being able to focus on the source location. The depth in which the wavefront is healed depends on the

- 20 discretization of the emitted wavefield (Witten and Artman, 2011). In our simulations artefacts remained after dividing the results by the illumination map. These artefacts were close to the surface and had higher amplitudes than the localization. We observed that on average at a depth of one p-wave wavelength sampling artefacts stopped interfering with the localization of events. Therefore all values above the depth of one p-wave wavelength were set to zero. With the used frequency range and velocity models, this boundary depth was 2.3 km beneath the free surface.
- 25 Localizations found while excluding the shallowest parts However, muting the upper 2.3 km of the model inhibits localization of shallow sources. Depending on the expected source depths, this should be considered. In our example application in Southern California, local earthquakes are reported not shallower than 10 km while the non-volcanic tremor is expected at even greater depths (Horstmann et al., 2015). Therefore, muting the shallow part of the model does not interfere with the event locations in this case.
- 30 To evaluate if a certain station distribution enhances reliable locations, a two-step approach was performed: First the location accuracy was determined and locations were sorted as being close to the source or far away. In the second step the intensity of

artificial focusing spots was evaluated by introducing four categories. It is crucial to evaluate the intensity of artificial focusing produced with certain setups because they can obscure source locations. In the following, these two steps are described in more detail.

To determine if the location accuracy was adequate, a maximum average deviation threshold was introduced. Locations

- 5 deviating further away than this threshold were then compared to the initial source location set in the forward simulation. A successful localization was allowed to deviate less than 1.2 km from the initial source localization. Localizations deviating further than the threshold from the source location were considered considered to be not successful. The average deviation was calculated as the mean of the deviation error of the source location in all three directions. We did not define a source area with a certain radius around the source location but rather allowed localizations to be shifted a greater distance. Therefore, locations
- 10 could have an error in one direction while being very close to of up to three times the defined maximum average deviation if the source in the other two directions had exactly the value of the original source location. Consequently, the allowed source area is a octahedron centered at the source location. The maximum average deviation threshold was empirically found to be 1.2km. The deviation threshold of 1.2km was found empirically but coincides with approximately half the p-wave wavelength. The maximum values found in the imaging conditions were either inside this range the octahedron formed by this threshold or
- 15 far away from it. To allow this rather large error in locations enabled the focus of this study to be on finding optimal station distributions rather than focusing on very accurate source locations. Finding an appropriate setup to achieve the most accurate source locations possible depends highly on the specific application and is therefore not the focus of this study.

After the step described above, simulations were sorted into either producing localizations close to the source location or far away from it. The advantage of TRI is, however, to not only provide point coordinates of the localization. The imaging

- 20 conditions can be visualized as well. In order to compare simulations and imaging conditions As a second step, each imaging condition was normalized in itself resulting in the maximum value (the localization) having the value onethat was labelled successful in the first step was normalised by itself and then visualized. Normalising the imaging conditions allowed the direct comparison of different station distributions as well as different imaging conditions. When visualizing the normalised imaging conditions, it proved to be useful to create separate plots containing all points with a certain fraction of the maximum value.
- Plots were created for values in incremental steps of 0.1, corresponding to a tenth of the maximum value. By viewing all points of the imaging conditions with a specific fraction , successful localizations of the maximum value, successful locations could be assessed further. An example of this plot type is shown in Fig. 1. The top two plots show imaging conditions for the total energy density imaging condition I_e for two different values (0.6 and 0.9). The bottom middle two plots show the same for the p-wave energy density imaging condition I_p - and the bottom two plots for the maximum displacement imaging condition I_d .
- 30 Successful localizations were viewed as shown in Fig 1 and sorted into four categories. Figure 2 is a one-dimensional representation outlining relevant aspects of the four categories. This representation is equivalent to viewing a one-dimensional profile through the localization location and noting the values of the imaging conditions along this profile. A peak in Fig. 2 refers to a visible focus in the image and the height of the peak represents the value at the focusing point. The top dashed line in Fig. 2 shows amplitudes of 0.9. This corresponds to the right plots in Fig. 1. All visible spots in the right plots in Fig. 1
- 35 translate to peaks higher than 0.9 in Fig. 2. Similarly, the bottom dashed line represents values of 0.6 or 60% (left plots in Fig.

1). Depending on the maximum value of peaks outside the designated source area, each imaging condition was sorted into one

of four categories:

Category I included the most reliable $\frac{10 \text{ calizations} \text{ localizations}}{10 \text{ calization}}$. There was one peak inside the source area corresponding to the $\frac{10 \text{ calization}}{10 \text{ calization}}$ of the event. Other All other peaks were below 0.6, which is equivalent to 60% of the amplitude of the

5 highest peak. When visualizing the whole model domain and looking at all points with a value of 0.6, there would be only one focus. The plots showing I_e in Fig. 1 would be categorised into category I.

Category II was similar to Category I but one (or more) secondary peaks were between 0.6 and 0.9. When plotting all points with the value 0.6 in this case there was more than one focus spot. When visualizing all points with the value 0.9, however, there was a single focus spot. Simulations sorted into this category were considered reliable as well. The plots showing I_p in

- 10 Fig. 1 would be sorted into category II because at 0.6 there are multiple black spots and at 0.9 there was only one focus visible. Category III is depicted in Fig. 2 with two peaks above 0.9. Both of these peaks are inside the source area. In general, a secondary focus introduces unwanted ambiguity to the localizations. It would be unclear which of the peaks is the real localization and which the artefact. In the the cases we associated with category III, however, all foci there was more than one peak but all peaks above 0.6 were within the deviation threshold when viewing values of 0.9source area. Therefore,
- 15 we assumed they belong to the same localizationlocation. Depending on the type of application, these localizations may be considered reliable or not. If an application includes only the localization of single events, these category III simulations can be used to localize the events. If, however, there is more than one event or the number of events is unknown, these simulations could be problematic, station distributions producing category III locations should be considered carefully.

Category IV simulations were regarded unsuccessful <u>as well</u> although the highest value was found to deviate less than the 20 threshold value from the source. Focusing spots were outside of the source area and had a peak value of <u>more than</u> 0.9or higher. We assumed that these artificial focusing spots appeared due to the model setup. The plots for I_d in Fig. 1 would be sorted into this category. In Category IV simulation setupseould potentially lead to erroneous localization results, locations could not be distinguished from artificial focusing spots without knowing the initial source location.

In summary, all simulations were first sorted into successful (close to source) and unsuccessful (far from source) localizations. Afterwards the successful localizations were sorted into the four described categories depending on their reliability. To Finally, to determine which simulation setups will produce reliable localizations locations, the simulations with localizations locations in category I and II should be viewed. Simulations with more than one imaging condition in category I or II were considered simulations producing reliable localizations cations. This requirement to have two successful imaging conditions per simulation inhibits the misinterpretation of an artefact for a localization. It-location. This criterion could be crucial when using real

30 data.

The influence of the station distribution 3

To discover prerequisites for localizing locating seismic sources with TRI, simulations were performed with varying station distributions. Whether the specific setup enhances localizations the localization can be derived from the reliability of localizations locations achieved with that setup.

5 The reliability of localizations locations is influenced by the amount and position of stations at the surface. The wavefront wavefield is only sampled at these discrete positions. Therefore, different aspects of the station distribution were tested systematically to determine which station placements enable a reliable and unambiguous localizations

In the first set of simulations, the minimum aperture and maximum receiver distance were investigated optimal apertures and inter-station distances were sought for that still produce reliable locations. The ability to localize-locate sources with an array

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not centred above the source was tested in a second set of simulations. In the third set of simulations, the ability of TRI to cope with heterogeneous station distributions was tested.

These three sets of simulations were performed with nine receivers at the top of the model. Additionally, the effect of using an increased number of receivers was investigated for individual setups. All simulations in this section were performed using a homogeneous velocity model for forward as well as time-reversed simulations. The p-wave velocity was set to $4000 \,\mathrm{ms}^{-1}$,

the s-wave velocity to $2300 \,\mathrm{ms}^{-1}$ and the density to $2000 \,\mathrm{kgm}^{-3}$. There was no noise added to the traces. Therefore, the 15 only change between simulations was the station distribution. Presumably, observed differences in localization quality-location accuracy were caused by the change in the station placement.

3.1 Minimum Optimum aperture and maximum inter-station distance

- To find the minimum aperture optimal apertures and maximum inter-station distance still enabling localizations distances still 20 enabling the localization with TRI, nine stations were placed in a square and centred above the source location. The distance dbetween the stations was then increased discretely (see Fig. 3). By increasing the inter-station distance, the aperture of the array is increased as well. When using nine stations in a square layout, the aperture is twice the distance d between receivers. The expected result would be a range of receiver distances producing reliable localizations source locations. The lower bound of this range corresponds to the minimum aperture and the upper bound to the maximum inter-station distance needed to localize 25 locate a source of the specific type in the specific depth.
 - In Fig. 4 performed simulations are marked with a grey bar to distinguish gaps in simulations from simulations that did not localize locate the source successfully. Only successful localizations deviating less than the threshold from the source location, are marked with a symbol corresponding to the imaging condition and a colour corresponding to the category. In all results in this study, \mathbf{I}_s is excluded for explosion sources because the radiation pattern mainly-only produces p-waves
- and therefore does not allow any localization with I_s . Similarly, I_p is excluded for strike-slip sources because 30 using a homogeneous model it was not possible to locate strike-slip sources with \mathbf{I}_{p} . Three source depths were tested with an explosion and a strike-slip source. Inter-station distances producing localizations in category I or II for at least two imaging conditions were considered reliable. Category III localizations locations may introduce ambiguities.

Inter-station distances and subsequently apertures producing reliable localizations locations can be seen in Fig. 4. We were able to localize locate a strike-slip source in 5 km depth with nine receivers placed 1 to 9 km apart. The explosion source in 5 km depth was localized located reliably with an inter-station distance of 6 km. For a 11.9 km deep source, a reliable localization was possible with inter-station distances of 4 to 19 km for a strike-slip source and 9 to 15 km for an explosion source. The

- 5 strike-slip source in 22 km depth was localized located with nine receivers spaced 17 to 25 km apart and the explosion source with receivers spaced 15 to 25 km apart. The strike-slip source in 22 km depth could also be localized located with inter-station distances of 6 to 12 km. However, at an inter-station distance of 15 km there was only one imaging condition that led to a reliable localization. Therefore only the larger inter-station distances were considered successful for this source depth.
- In general, we found that sources in a certain depth could be localized located with an inter-station distance roughly the same as the source depth and an aperture of twice the source depth which relates to an aperture angle of 90° to 100°. Additionally, the spread of distances that worked for a specific source depth increased with an increasing source depthrange for optimal apertures decreased with increasing source depths for strike slip sources but increased with increasing source depths for explosion sources. Furthermore, strike-slip sources could be localized located with a wider range of inter-station distances than explosion sources.
- 15

In our setup with a homogeneous velocity model, nine receivers were sufficient to localize-locate explosion and strike-slip sources reliably. In Fig. 5, the localization results for an increased number of receivers are shown. Receivers were added outside of the nine original receivers with the same inter-station distance. Receiver distances stayed constant (at 13 km for this source in 11.9 km depth) while the aperture was increased. Additionally, receivers were added inside the original array and consequently the aperture was kept constant at 24 km.

20 the aperture was kept constant at $24 \,\mathrm{km}$.

Increasing the number of receivers from 9 to 25 increased the quality accuracy of the localization. 49 receivers slightly enhanced the results further. Using 169 receivers, spaced 2 km apart, did not improve the localization quality location accuracy anymore. For the strike-slip source the localization quality location accuracy even decreased for I_e to a category III localizationlocation. These results suggest that a slight improvement in localization quality location accuracy can be achieved by using more sta-

25 tions. Nevertheless, nine stations produced reliable localizations locations with a homogeneous velocity model and no noise in the traces. The only simulations of this study where all imaging conditions produced a category I localization location can be seen in Fig. 5 for the strike-slip source when using 25 or 49 stations. An explosion source could not be localized located with three category I localizations.

In addition to the optimal range of inter-station distances, we found that different imaging conditions were sensitive to 30 different source types. While I_d and I_s seemed to be successful for a strike-slip source, I_e and I_p were more successful for an explosion source. This can be seen especially well when considering only category I localizations locations in Fig. 4 and 5.

3.2 Maximum asymmetry over Arrays not centered above source location

To determine the sensitivity of TRI to an event not centred beneath the array, localizations locations were analysed with an array of nine receivers shifted discretely in one direction. In practice, arrays are rarely centred above an event location. Therefore,

it is necessary to know in which area of the model sources can be localizedlocated. This helps to estimate either where to put stations if events are expected in a specific target area or where localizations can be expected locations can be successful when using an already existing array.

- In this section, the asymmetry of the array in relation to the source location was investigated. Nine receivers were placed in 5 a square using the inter-station distances that produced reliable localizations locations found in the previous section. In Table 1, the used inter-station distance for each source depth can be seen. These nine receivers were moved in negative x direction in order to discretely-increase the shift distance *s* between the centre receiver and the source location (see Fig. 6). For smaller shift distances some part of the array is still above the source. At one shift *s* the shift distance is equal to the inter-station distance. At this point one of the side receivers is directly above the source location. For larger shifts the source location is beside the
- 10 array. In Fig. 7 the shift distance s where the source is no longer beneath the array is marked by a dashed line.

In Fig. 7 the results for different shift distances s are shown. A 0 km shift represents an array that is centred above the source location. Shallow explosion sources, at 5 km depth, could not be localized located with an array not centred above the source while strike-slip sources in 5 km depth could be localized located with a shift s of 6 km. Reliable localizations locations were possible for the explosion source in 11.9 km depth at shifts of 6 and 8 km. The strike-slip source in 11.9 km depth could be

15 localized located with shifts of 2, 13 and 19 km. In-between those shift distances it can be either localized located only with one imaging condition or not at all. The explosion source in 22 km could be localized located with shifts from 8 to 13 km while the strike-slip source in this depth could be localized located with shifts of 20 km and 23 km.

Explosion sources could best be localized located when the centre of the array was directly above the source or when the source was in-between the receivers. It could not be localized located reliably if the source location was too close to one of the receivers or beside the array. Strike-slip sources could be localized located if one of the receivers of the array was above or near the source location but they could not be localized-located if the source location was between two stations. Neither the

- explosion source nor the strike-slip source could be localized located when the source location was outside the array. The only exception was the strike-slip source in 11.9 km depth. It could be localized located reliably with a shift of 19 km.
- To further investigate the different behaviour of the localization of explosion and strike-slip sources, simulations were performed with an increased amount of receivers. 25 receivers were placed in a square of 5 by 5. The inter-station distance was set to 8 km which is smaller than the inter-station distance used for the nine receivers in Fig. 7. An explosion and a strike-slip source in 11.9 km depth were tested. The results can be seen in Fig. 8. For both source types almost all tested shifts of the array were able to localize-locate the sources reliably. There is no significant difference between simulations where one of the
- 30 receivers was above the source location (s = 8 km and s = 16 km) and those where the source location was in-between the receivers (s = 4 km and s = 12 km). From a shift distance of 16 km onwards, the source was beside the array. Both source types could be localized located reliably when the source was next to the array up to a shift of 32 km where the source was 16 km next to the array. At a shift of 24 km, the explosion source could not be localized located reliably anymore while at a shift of 28 km the strike-slip source could not be localized located reliably anymore. An overall decrease in localization quality
- 35 <u>location accuracy</u> was observed when the source was no longer beneath the array.

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Overall, more receivers spaced closer together than suggested from the previous section reduced the effect of source types not being localized an increased amount of receivers with a smaller inter-station distance ensures the localization of strike-slip and explosion sources beneath the whole array. When the source was Additionally, a larger array enables the localization of events outside of the array , localizations became impossible when using only nine receivers. When using 25 receivers, localizations

5 were possible also outside the arrayas well. Conclusively, if the source locations are not known a rather large array should be used.

3.3 Maximum heterogeneity of azimuthal gaps between stationsIrregular station distributions

To determine the influence of heterogeneous inter-station distances on the localization capabilities of TRI, the azimuthal gap a was used. Seismic stations are rarely placed in a square with every receiver the same distance away from the next. Horstmann

- 10 et al. (2015) introduced the azimuthal gap as the horizontal angle between two stations viewed from the projection of the source to the surface. With nine receivers placed in a square, the azimuthal gap is 45° for each station pair, excluding the centre station. When moving the corner stations closer to the source location in x direction, the angle increases between some of the stations and decrease between other stations (see Fig. 9). In this study, the azimuthal gap refers to the maximum angle between stations. The minimum azimuthal gap can be derived by subtracting the maximum azimuthal gap from 90° -because the corner
- 15 stations are moved inward from their corner positions in x direction until they meet the next station. At the end, the array is effectively reduced to five stations with homogeneous azimuthal gaps of 90°. In this synthetic test the array is still symmetric to the source location. However, for larger and potentially more irregular arrays the azimuthal gap indicates if there is a large gap in the array where no signal is recorded. Depending on the size of this gap, there may not be enough recorded waveforms from that direction and therefore the source reconstruction may become impossible.

25 4 The effect of a complex velocity model

In addition to the station distribution, a complex velocity model may have a strong influence on the localization capabilities of TRI. In general, a sufficiently correct velocity model is needed to be able to backpropagate the wavefield adequately. But also a sufficiently correct velocity model may include complex velocity structures such as low velocity zones or sharp velocity contrasts. These structures can trap energy and obscure the source localizationlocation. This is why the imaging conditions

30 were divided by an illumination map as described in section 2. However, pronounced <u>effects-artefacts</u> may remain in the final result.

To investigate the extend of focusing errors due to complex velocity structures, four different velocity models were tested. Differently shaped and positioned low velocity zones were tested as well as a fault. Each velocity model was once tested with the low velocity zone or fault known and once with the low velocity zone or fault not known. The velocities in the low velocity zones were 75% of the values from the homogeneous models ($v_p = 4000 \text{ m/s}$). The layered model used four layers and p-wave velocities ranged from 3000 km to 6000 km. S-wave velocities were calculated with a constant ratio of $v_s = v_p/\sqrt{3}$.

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The forward simulation incorporated the structure while one backward propagation was done with the exact same velocity model as the forward simulation and one was done with a homogeneous or layered velocity model instead. For each velocity model, a strike-slip source and an explosion source was tested in 11.9 km depth. Two sets of receivers, one with nine receivers and one with 25 receivers, were placed in a square and centred above the source. The receivers were spaced 13 km apart for

10 both sets.

possible.

In Fig. 11 the localization results are shown. The results of the two sets of receivers used are shown in the upper and middle part of the plot. The velocity model used for the forward simulation and one of the time-reversed simulations is shown in the lower part of the plot. For the second time-reversed simulation a homogeneous model or a simple layered model was used.

When there is a known low velocity layer above the source (see Fig. 11, left model), both a strike-slip source and an explosion source could be localized-located reliably. There is no drastic improvement when using more receivers. When the low velocity layer above the source was not known, the localization capabilities decreased and a reliable localization-location was no longer

When the source was inside the low velocity layer (see Fig. 11, second model), the localization was not significantly enhanced by using more receivers as well. When this low velocity zone was not known, the reliable localization of a strike-slip source was still possible but not the localization of an explosion source.

When there was a spherically shaped low velocity zone around the source (see Fig. 11, second model from the right), the localization was enhanced when using 25 receivers. A strike-slip source inside a spherically shaped low velocity zone could be localized located when the low velocity zone was known but not at all when it was not known while an explosion source could still be localized located when the low velocity zone was not known.

The last velocity model was a layered model with a fault (see Fig. 11, right model). When the fault was known the strike-slip source could be **localized located** with 9 and 25 receivers. When it was not known, when just a layered velocity model was used for the backward propagation, the reliability decreased and the source could not be **localized located** anymore. An explosion source could not be **localized located** successfully, even with 25 receivers.

Taken together these results suggest that an increased number of receivers helps only slightly when the velocity model was more complex. Because the additional receivers were placed the same distance apart from the original nine receivers, the main characteristic helping the localization was an increased aperture. Additionally, the localization of strike-slip sources was influenced less by a complex velocity model than explosion sources. If structures like low velocity zones and faults were known, it did not hinder localizationsthe localization. However, if they are not known, localization quality llocation accuracy decreased.

5 Limits for the signal-to-noise ratio

The previous sections used only synthetic seismograms recorded during forward simulations and then re-emitted into the model time-reversed. Real data, however, does not only consist of the signal corresponding to the event. It also includes a variable amount of noise. In theory, TRI works with noisy data (Gajewski and Tessmer, 2005; Witten and Artman, 2011). In this section,

5 the smallest signal-to-noise ratio (SNR) still enabling localizations source locations was investigated. An explosion source and a strike-slip source in 11.9 km depth were used. 9 and 25 receivers were spaced 13 km apart and centred above the source. Five different SNR values were used: 1, 0.75, 0.5, 0.25 and 0.1.

The noisy data was created by constructing a time series with random amplitudes and the same time step and length as the seismograms. Afterwards the noise signal was filtered to exclude numerically unstable frequencies above 5 Hz. The amplitudes

- 10 of this time series were modified to achieve the desired SNR of this noise signal in relation to the seismograms of all stations. The filtered noise signal was afterwards added to the seismograms of all stations. Figure 12 shows example traces of the seismograms without noise and the seismograms with the respective SNR value for a receiver directly above an explosion source. When the SNR decreases, the event signal becomes less and less distinguishable from the noise.
- Figure 13 shows the localization results. When using nine receivers there was no reliable localization location possible for 15 both source types. With a SNR of 1 there was only one localization location in category II and for SNRs down to 0.5 there were only localizations locations in category III. When using 25 receivers it was possible to localize locate both source types with a SNR as low as 0.25 in category I but only with one imaging condition. The explosion source could be localized located in category I with two different imaging conditions with a SNR as low as 0.5. Surprisingly, the total energy density imaging condition I_e seemed to be the most stable one for localizing locating sources of both source types. In the previous sections, I_e 20 seemed to be not as suitable for a strike alia source
- 20 seemed to be not as suitable for a strike-slip source.

Overall, these results suggest that the noise level has a higher impact on localization quality location accuracy compared to complex velocity models. It was possible to localize-locate sources even if the noise level was too high to distinguish events in the traces. Nevertheless very low SNR hinder a reliable localization which can only partly be compensated by adding more receivers.

25 6 Application example for Southern California

In previous sections, station distributions were tested systematically to gain insight into the characteristics of array designs that influence localization results. Additionally, results showed that noisy data influence the localization more than a complex velocity model if the velocity model is accurate enough. In this section, an example of applying these results is showna real case scenario from Southern California is minicked by simulating synthetic seismograms with a real velocity model as well

30 as real station positions. The advantage of using synthetic data is that the true source location is known and therefore the location accuracy can be seen directly. First, the given stations are evaluated for their ability to localize locate events with a homogeneous velocity model. We show that subsets of the array may enhance localization quality-location accuracy and how

to design an array in this region. In the second part, we estimate the success rate achievable with different station distributions using the velocity model by Zeng et al. (2016) and noisy data.

6.1 Determine localization possibilities using results from previous sections

Horstmann et al. (2015) localize-locate non-volcanic tremor in Southern California near Cholame and use 39 stations. In

- 5 this study, we took 38 of the 39 stations (the northernmost station was excluded here) and tried to localize locate synthetic events. The receiver positions were transformed to the same x-y-grid as in Horstmann et al. (2015) and plotted in Fig. 14(a). Additionally, three source positions are plotted. These source positions will be used in the following to test the possibility to localize locate events with one of three receiver sets derived from the 38 stations in Southern California and one receiver set suggested as an optimal array two receiver sets suggested as a optimal array following the results of the previous sections.
- 10 As source type, strike-slip sources were used in this section. Strike-slip sources occur more dominantly in the subsurface than explosion sources. The extension of this model in x and y direction is the same as in previous models as well as in Horstmann et al. (2015).

Figure 14(a) shows that the 38 stations are positioned heterogeneously and irregular stations extend farther in y direction than in x direction. Because the receivers are so heterogeneously spaced, this set of receivers was not expected to give a reliable

- 15 localization for any of the three sources. The total amount of stations, however, may counteract the heterogeneous inter-station distances. Additionally, we determined two subsets of receivers with more homogeneous inter-station distances. Two subsets were chosen here: one with 31 stations (see Fig. 14(b)) and one with 20 stations (see Fig.14(c)). For receiver set (b) stations very close to each other were excluded while for set (c) stations were reduced to decrease the total amount of traces, which may impact computation time. Lastly, in Fig. 14(d) an optimal array is suggested and and 14(e) two optimal arrays are suggested.
- 20 one with 32 stations and one with 20 stations. This array was designed with a homogeneous station distance of 8 km and an aperture of 24 km. The array was. The arrays were positioned to allow localizations locations in roughly the same areas as in Fig. 14(b) and 14(c). For a real application, the array would be moved to localize locate events in the specific target area. The inter-station distances and apertures for the arrays can be found in Table 2.

The target depths for localizations locations was 10 km to 25 km because bigger events occur at depths as shallow as 10 km

- 25 while the non-volcanic tremor signals seem to occur deeper (Horstmann et al., 2015). For this target depth range, the results of section 3.1 suggested the aperture should be about 20 km or larger to be able to localize-locate deeper events and the receiver distance should not be larger than about 13 km to include shallower events. When comparing these requirements to the values reported in Table 2, the minimum aperture was greater than 20 km for all four receiver sets. Similarly, the average inter-station distance was smaller than 13 km for all four receiver sets. However, the inter-station distances vary greatly, especially for
- 30 receiver set (a) and (b).

In Fig. 14 two circles mark areas where events are expected to be located with less or more reliable localizations are expected for the target depth range imaging conditions in better categories. These circles were derived from the results from previous sections where we discovered that sources could be localized located beneath the array when using fewer stations and slightly

outside the array when using an increased amount of receivers. Three source positions were chosen to test the hypotheses of where localizations locations were expected.

Simulations were performed with a strike-slip source and a homogeneous velocity model (see top of Fig. 15). The source was placed at all three source positions and in two depths. The <u>four-five</u> receiver sets presented in Fig. 14 were tested for their capability to <u>localize locate</u> these sources.

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Localizations Locations were possible with receiver set (a) although inter-station distances were very heterogeneous. At source position 1, a reliable localization location was possible in a depth of 11.9 km. In At a depth of 22 km, a reliable localization was not possible location could not be found. At source position 2 and 3 a localization in location at a depth of 22 km was possible.

10 Receiver set (b) has a slightly enhanced localization quality location accuracy compared to set (a). All sources could be localized located reliably. This highlights that TRI is rather stable and only small alterations to the station distribution allow a localization of events in multiple depths at different positions in the model.

Receiver set (c) consisted of 20 stations and localization quality location accuracy was decreased for the sources in 22 km depth. An explanation for the decreased quality for deeper sources could be the reduced aperture of this receiver set. The source

15 in 11.9 km depth could, however, be localized located reliably and with all three imaging conditions in category I or II. This is coherent in agreement with previous results suggesting a decrease of sensitivity to the station distribution with depth. Receiver set sets (d) was suggested as an optimal array basedon the results of the previous sections. This was expected to be

the most successful receiver set because the inter-station distance was chosen to fit the target depths and was homogeneous and the aperture was chosen to be wide enough for deeper sources. The source in 11.9km depth could, however, not be localized

- 20 reliably. Only one imaging condition produced a localization in category I while the other two were in category III. This localization result was, therefore, less reliable than that of receiver set (c). However, both receiver sets have the same amount of stations and the aperture is larger for receiver and (e) were suggested as optimal arrays based. In comparison to receiver sets (b), receiver set (d) than for (c). The source is also beneath the array in both cases. In produced a higher location accuracy while receiver set (d), the distance between receivers is 8 km. In section 3.1 a strike-slip source at the same location could be
- 25 localized with nine receivers 8 km apart with I_e and I_s in category I quality. This suggests that additional stations that add to the asymmetry of the array (from 3 by 3 stations to 4 by 5 stations) produced a split of the focus. However, receiver set (b) and (c)were asymmetric as well as they are elongated in y direction. An alternative explanation could be that too regular positioned stations actually slightly decrease the localization quality. The localization quality with receiver set (d) for 22km deep sources was similar to the results with receiver set (c) suggesting that in larger depths the unknown effect is negated was located
- 30 slightly worse than the irregular stations of set (c). For this homogeneous case, the suggested array with 32 stations and regular inter-station distances produced the most accurate locations.

After performing this synthetic study with a homogeneous velocity model, we would decide to use receiver set (b) for localizing-locating events in this region if these are the only available stations. If planning to deploy stations, receiver set (d) needs to be further adjusted to increase the localization qualityshould be used.

6.2 Synthetic tests to estimate success rate with real data

10

After finding a suitable receiver set enabling the localization with a homogeneous velocity model in different source depths and at different source positions, the success rate with the real velocity model and noisy data has to be investigated. Therefore, additional simulations were performed.

5 Zeng et al. (2016) obtain the most current and accurate velocity model for the region in Southern California in which Horstmann et al. (2015) locate non-volcanic tremor. The velocity model is three-dimensional and incorporates p- and s-wave velocities. It was interpolated to fit the used finite difference grid and the density was calculated from the p-wave velocity with the empirical equation by Brocher (2005):

$$\rho = 1.6612v_p - 0.4721v_p^2 + 0.0671v_p^3 - 0.0043v_p^4 + 0.000106v_p^5.$$
(6)

 v_p depicts the p-wave velocity in kms⁻¹ and the resulting density ρ is in gcm⁻³.

In Fig. 15 at the bottom, localization results for simulations with and without added noise are shown. Without any noise, the strike-slip source at position number 1 could be localized located reliably in 11.9 km depth with receiver set (b) and in 22 km depth with receiver set (a). Receiver set (c) was not able to produce any localization location with the actual velocity model.

15 Receiver set The suggested receiver sets (d) localized sources in both depth in category I with I_e but only in category III for the other imaging conditions and (e) produced more accurate locations in these cases with the real velocity model and no noise as well.

When adding noise with a SNR of 1, reliable localizations were possible in both depths with receiver sets (a) and (b)and additionally for the deeper source with receiver set (d). Receiver set (c) was still unable to localize locate any of the sources.

20 However, receiver set (d) and (e) were able to locate the sources. Receiver set (d) even produced a location of category I for all three imaging conditions.

Receiver set (b) remained the best choice in this case followed by receiver set (a). Both were able to localize locate three out of four sources. Both sets localized located the sources with noise reliably. Surprisingly, receiver set (d) was able to localize the deep source with added noise reliably but not without any noise. This adds to the theory that a very regular station distribution

25 may even hinder localizations. Noise has in this case a similar effect on the wavefield as irregular Nevertheless, the suggested arrays with regular inter-station distances were more successful than the irregular arrays.

we We would suggest to use receiver set (b) to localize locate events in this area and avoid ambiguity, because all localizations locations were in category II and there was no localization location in category III. The success rate of localizations in this case is expected to be high inside the grey circles marked in Fig.14 as long as the noise level is not too high. Localization

30 quality Location accuracy is expected to decreases with increasing distance from the array. If, however, new stations were to be deployed, we would recommend to place them similar to receiver set (d)

7 Discussion

The objective of this study was to find station distributions producing reliable localizations with TRI. Additionally, the knowledge about the influence of a complex velocity model-investigate the sensitivity of TRI to station distributions while considering complex velocity models and a low signal-to-noise ratioon the localization quality enables the estimation of

5 localization quality achievable with real data. This is important for (1) estimating the success rate of TRI with a given array and velocity model, (2) decreasing the time needed to adjust the stations (e.g. by choosing only a subset of receivers) and (3) designing an array for localizing locating events in a designated target area.

The method of TRI is straight-forward and can be to implemented into most numerical codes that can propagate elastic waves through a medium. In this study, we further improved the workflow of Saenger (2011) which was modified by Witten

- 10 and Artman (2011). We suggested to visualize all points with certain fractions of the highest value in imaging conditions and proposed a set of categories to differentiate between localization qualities. The purpose of this workflow was to assess which simulations gave the most reliable localizationquantify the accuracy of source locations. When using real data, the sorting into categories may be obsolete. If the receiver distribution is sufficiently well good and the level of noise low enough, all focusing spots appearing in the imaging conditions should be localizations represent source locations.
- 15 Additionally, we rated the success of localizations by the deviation of the maximum value in the imaging conditions to the initial locations by the distance between imaged and true source location. The used threshold deviation was calculated as the average deviation from all three directions. Therefore, successful localizations locations for the shallowest source could be at the surface. Surface localizations locations were, however, excluded. This restricted the range for a successful localization location for the source in 5 km depth. Consequently, it looked like a source in 5 km depth was especially hard to localize locate.
 20 However, sources shallower than 10 km are rarely observed in the region in Southern California (Horstmann et al., 2015).
- 20 However, sources shallower than 10 km are rarely observed in the region in Southern California (Horstmann et al., 2015). All simulations in this study were set up with the same frequency range for the source wavelet, the same grid spacing, and the same time step. For explosion sources this setup was numerically stable in the used range of seismic velocities. However, Swaves and surface waves experienced numerical dispersion . This which cannot be reconstructed during the backpropagation of the wavefield. The numerical dispersion could not be eliminated without reducing the grid spacing and consequently increasing
- 25 computation time significantly. Therefore, we kept the chosen values. We observed no effect in the results suggesting that dispersive s-waves interfered with the localization. The surface waves were more dispersive than the s-waves but are not relevant for this method and consequently do not interfere with localizations the localization as well. The dispersive surface waves may be an alternative reason why we needed to exclude focusing at the surface.

In the used workflow, we muted the top 2.3km in the imaging conditions to remove any focusing at the surface. This does not allow for the localization of shallow sources but increases the success rate for deeper sources. Other studies restricted possible focusing to the region around the source location (e.g. Horstmann et al. (2015)). However, we observerd that the difference between areas where locations were reliable and areas where they were not was not clear but rather a transitional zone. Additionally, depending on the velocity model and the position of the source in relation to velocity structures, waves could be scattered and sources could be located outside of this region as well. In contrast to reducing the area where focusing is allowed, we propose to carefully evaluate focusing spots outside of the array.

7.1 Station distribution for reliable localizationsa localization

Numerous simulations were performed to test different station distributions for their ability to localize locate sources of dif-

5 ferent source types as well as in different depths. We found that In this section the results with a homogeneous velocity model and without any noise added to the synthetic seismograms is discussed.

In general, we found that the inter-station distances distance should not be larger than the source is deep - Additionally, the total aperture of the array should be at least twice the source depth.

Lokmer et al. (2009) observed that inter-station distances of up to half of the dominant p-wave wavelength are still able to

- 10 localize eventsto enhance the localization with TRI. As we performed all simulations with the same frequency range for the source wavelet in the forward simulation. We were unable to judge the influence of varying wavelengths on localization results. However, the localization quality changed with different source depths and inter-station distances. Additionally, inter-station distances found to produce reliable localizations were significantly larger locations in this study were large than half the dominant wavelength , which is (1.2 km in our case.
- 15 Furthermore, Witten and Artman (2011) stated that the backpropagated wavelength is undersampled because traces are only inserted at discrete positions at the surface. The depth in which the wavefront is healed and thus a localization can occur seems to depend on the distance between the stations. They observed that), which was reported as an optimal inter-station distance by Lokmer et al. (2009). Additionally, location accuracy changed with the source depth suggesting a sensitivity of the inter-station distances to the source depth. This can be explained by the discrete sampling of the backpropagated
- 20 wavefield. The wavefront needs to heal before the wavefield can constructively interfere and focus on a source location. Witten and Artman (2011) observed that the wavefront is healed at a depth of 1 to 1.5 times the inter-station distance the wavefront is healed, which means stations should be spaced at a distance equal to the source depth or slightly closerand consequently sources need to be at least as deep as the inter-station distance to be locatable. This is coherent in agreement with our results.
- 25 A common prerequisite when applying TRI is a sufficiently large aperture. This is consistent throughout the literature. Artman et al. (2010) observe a greater influence of the aperture on the horizontal than the vertical resolution. We could not observe this effect in our study but agree that a large aperture is needed for reliable localizationsAdditionally, we found that the total aperture of the array should be at least twice the source depth. The requirement for large apertures has also been reported in previous studies (e.g.: Artman et al. (2010)). However, this is the first study to present a quantification for the required aperture 30 size.

The total number of stations is often considered a crucial factor controlling localization quality. We found that in the simple case of a Most simulations produced reliable location with a homogeneous velocity model and noise-free data, nine stationswere sufficient to localize events reliably, even if they are spaced slightly heterogeneouslyonly nine stations. More

stations increased the quality of the localization slightly location accuracy slightly and helped counteract effects of a complex velocity model and high noise. However, a significantly large larger number of stations did not produce perfect localizations but in some cases even decreased localization quality. Additionally, we found a slightly increased amount of stations may help counteract effects of a complex velocity model and high noise in the data.Horstmann et al. (2015) suspect-locations. This is

5 contrary to most studies that report a large number of stations is necessary for TRI (e.g. Kremers et al. (2011)). We conclude that the distribution of stations may be more influential than the total number of stations -on the localization, which has been reported by Horstmann et al. (2015) as well.

No study reported how far outside of the array sources can be localized. However, this is crucial when designing an array because the array should be positioned so events can be localized in the target region. We Furthermore, we found that a

10 smaller amount of stations enhances localizations locations only beneath the array. When reducing the inter-station distance and increasing the amount of stations, events could be localized located outside the array as well. The reliability of localizationlocations, however, decreased when sources were outside of the array. This might be crucial when designing an array because the array should be optimally positioned above the targeted source region.

Horstmann et al. (2015) observed that In this study we used the maximum azimuthal gap , which is a measurement for the heterogeneity of between stations as an indicator for the sensitivity of location accuracy with irregular inter-station distances , influences the localizations. We observed a similar behaviour and additionally found that with increasing source depth, the allowed heterogeneity increases. The azimuthal gaps and found that up to a certain rate of irregularity sources could still be located. Additionally, we observed that stations could be more irregularly placed the deeper the source location. Comparing our maximum azimuthal gaps to those reported by Horstmann et al. (2015) are, however, at least we find that their azimuthal gaps

- 20 <u>are roughly twice what we found observed</u> to be the maximum azimuthal gap. In our case with nine stations, an increase in the maximum azimuthal gap between two stations subsequently resulted in a decrease in the minimum azimuthal gap between two other stations. The discrepancy with Horstmann et al. (2015) suggests that the minimum azimuthal gap (how close two stations are together) has a higher influence than the maximum azimuthal gap on the localization results. This is also supported by the improvement in localization quality location accuracy when using 31 of the 38 stations in Southern Californiathe Southern
- 25 California example. Stations close together were excluded to form a subset of the 38 stations. On the other handAlternatively, some studies (e.g. Larmat et al. (2009) or Montagner et al. (2012)) compensate an irregular station distribution by weighing the stations according to an area assigned to each station . Localization results seem to improve when using this method. Our results suggest, however, that by omitting a few stations results can be improved significantly. Consequently, the weighing of the stations may become obsolete. When the aim is to have to improve location accuracy. However, when the aim is a fast and
- 30 reliable localization method, the gain in localization quality location accuracy has to be balanced with the extra computation time that is needed for weighing the stations.

While investigating optimal inter-station distances, we observed that We performed all simulations once with an explosion source and once with a strike-slip sources could be localized with a much wider range of inter-station distances and apertures

35 as explosion sources. We also observed that strike-slip sources could be localized most reliably when one of the receivers

was above the source and explosion sources could be localized most reliably when the source was in-between stations. We therefore source and observed different location accuracies for the same station distributions. We conclude that for strike-slip sources the receiver directly above the source has a greater influence on the localization result and for explosion sources the receivers farther away have a greater influence. Explosion sources are therefore more sensitive to the positioning and number

- 5 of receivers while strike-slip sources are more sensitive to how close a receiver is to the source location. This could also explain the observation of Steiner et al. (2008) that the most accurate localizations locations can be gained when using sources emitting strong s-waves in a vertical direction, as is the case with some strike-slip sources. It suggests their aperture was not wide enough or their inter-station distance too large for localizing locating sources emitting mainly p-waves. Furthermore, this observation dictates that inter-station distances should be small to not produce gaps in the array where strike-slip source cannot be located.
- 10 In the used workflow, we set the first 2.3km in the imaging conditions to zero to remove any focusing at the surface. This could be extended further to reduce the area where focusing is allowed to the area underneath the receivers. However, we observed that sources could be localized outside the array as well if there were enough stations. The transition between areas where localizations were possible and impossible was not a clear line but a transitional zone. Additionally, depending on the velocity model and the position of the source in relation to velocity structures, waves could be scattered and sources could be
- 15 localized outside of this region as well. In contrast to reducing the area where focusing is allowed, we propose to carefully evaluate focusing spots outside of the array. Furthermore, if a focusing spot is outside the array but the area where focusing is allowed is reduced to the area beneath the array, normalisation of imaging conditions leads to an amplification of amplitudes inside this area beneath the array. By construct, there will be one point in this area with the highest value of 1 and there will be spots of focusing. Whereas, when allowing localizations in the whole model, the location of the highest value may indicate
- 20 that it is an artificial focusing spot and additionally, amplitudes in the area are not artificially increased. This allows for the possibility that there is no focusing spot beneath the array.

7.2 Evaluation of success rate with real data

Preliminary synthetic studies are typically used to evaluate the localization quality location accuracy with TRI achievable with a certain station distribution. Often the first simulations are performed with a homogeneous velocity model. If these simulation
are successful and a station distribution yields reliable results, the real velocity model is used. If that is successful again, the real data is used that contains varying amounts of noise. Therefore we used complex artificial velocity models and artificial noise as well as a real velocity model from Southern California to estimate the influence on the localization.

We showed that complex velocity structures do not hinder localizations with TRI if they are known. Low velocity zones did not prevent reliable localizations even when using only nine stations. If the low velocity zone was not known, localizationquality

30 decreased. Additionally, we saw a similar effect for a layered velocity model with a fault. The velocity model can be fairly complex and We showed that the velocity model can be rather complex and still does not interfere with the localization if the prominent velocity structures are sufficiently known. Additionally, we observed that noisy data can hinder localizations. When using noisy data, more receivers were helpful to still be able localize sourcesthe localization. An increased amount of receivers enhanced the location accuracy with noisy data. However, when adding noise to the traces, the same random noise signal is added to all stations. The noise is still random but the same for all stations. This could unintentionally result in a structured noise that is not random anymore. Nevertheless, when this noisy signal is inserted into the model it will travel in different directions and will interfere differently with each other, thus creating a noisy wavefield.

Furthermore, in some cases we observed an increase in localization quality location accuracy when using noisy data com-

- 5 pared to simulations without noise Additionally, we observed an increase in localizations quality when using 20 heterogeneously and when using irregular spaced stations compared to 20 homogeneously spaced station when using regular spaced stations in combination with a homogeneous velocity model. That suggests that in some cases a very regular station distribution or traces with no noise may actually hinder localizations. It also stresses the necessity to attempt to localize a real event with the given array and velocity model before abandoning the study. This suggests that the introduction of irregularity into the simulation
- 10 helps to differentiate the source signal from any other part of the waveform and enhances the focusing. Nevertheless, when mimicking a real data problem, very regular inter-station distances produced the most reliable locations.

The scope of this study was limited in terms of computation time and therefore only distinct aspects of the station distribution were investigated. One additional aspect that could influence the localization quality are location accuracy is the influence of

15 an asymmetric array. An asymmetric array that extends further in one direction than in the other may decrease localization qualitylocation accuracy. We observed, that it may cause the focus to be split into multiple focusing spots and therefore introducing ambiguity. However, the study should give fundamental guidelines into the placement of stations for localizing sources with TRL.

Furthermore, TRI can be used for different scales as well as different applications. In this study we concentrated on the field
scale. However, it would be a valuable addition to this study if a similar study would be performed on different scales to see if the same guidelines stay true on other scales as well. If the same general principles hold true for smaller or larger scales, it would suggest that observed effects are inherent of the method.

In this study, the event time was known and run-times were adjusted accordingly. When using real data, the event time is not known and therefore a strategy has to be developed to find accurate event times as well. Possibly, the station distribution, the velocity model and the noise also have an influence on the event time. This has to be investigated in future studies.

25

Lastly, we observed that different imaging conditions were sensitive to different source types. This could be further investigated to potentially derive the source type from results already obtained while localizing locating the source.

8 Conclusions

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This study aimed at investigating the prerequisites for applying TRI on the field scale. We, therefore, systematically tested different station distributions with a homogeneous velocity model and evaluated the resulting <u>localizations_locations</u> for their reliability. We focused, thereby, on deeper sources (> 5 km) and muted the upper part of the model to eliminate artefacts.

We found that the inter-station distance should be not larger than the source depth and the aperture of the array should be at least twice the source depth. Additionally, sources could be localized located best when they were underneath the array. When

using more stations, localizations locations outside of the array became possible. Stations In general, stations should be spaced homogeneously regularly but the deeper the source the more heterogeneously the stations could be and still achieve reliable locations.

Complex velocity structures did not hinder localizations if they were included in the velocity modelwhile noise could inhibit

- 5 reliable localizations, especially when using too few stations. The localization quality is, however, increased when using a complex velocity model with noisy data or a homogeneous velocity model with heterogeneous inter-station distances Additionally to this strong sensitivity of the source location accuracy to the station distribution, we found a strong influence of the velocity model on the localization. However, complex velocity structures, like low velocity zones or faults, do not hinder the localization as long as they are incorporated adequately in the model. A high level of noise could, however, inhibit the source location even
- 10 if the velocity model was homogeneous. An increased amount of stations seemed to increase location accuracy in the presence of noise.

Furthermore, we observed in some cases an increase in location accuracy with an increase in complexity, like adding noise or more irregular stations or a more complex velocity model. This suggests that even when synthetic studies fail, localizations may still be possible with the real data additional scattering of waves may help the localization. We therefore advise to perform

15 preliminary synthetic studies not only with homogeneous velocity models and regular stations but also incorporating as many complexities as possible to get an accurate estimation of the achievable source location.

We showed that only a few simulations are necessary when performing a preliminary synthetic study to estimate if the given setup will work for TRI. Additionally, we showed that for designing an array that should be used with TRI the target area should be considered. The depth of expected events then dictates the receiver-inter-stations distance and aperture of the array.

20 If considering a range of depths, the inter-station distance should fit the shallowest events and the aperture the deeper-deepest events.

Competing interests. The authors declare that they have no competing interests.

Acknowledgements. This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No. 727550 (http://www.gemex-h2020.eu) as well as the "Landesprogramm für Geschlechtergerechte Hochschule des Lan-

25 des NRW" from the Ministry of Innovation, Science and Research of North Rhine-Westphalia, Germany. The authors gratefully acknowledge the computing time granted by the John von Neumann Institute for Computing (NIC) and provided on the supercomputer JURECA at Jülich Supercomputing Centre (JSC), Germany. Furthermore, we would like to thank the two anonymous reviewers for their invaluable help in improving this manuscript.

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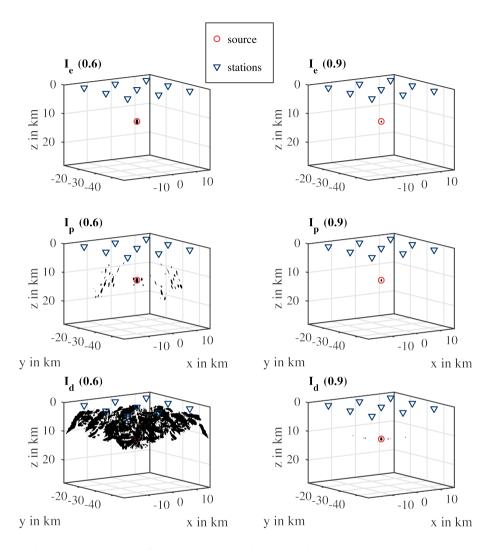


Figure 1. Imaging Conditions conditions plotted for one example simulation. Black spots are points having the plotted value (0.6 on the left and 0.9 on the right). I_e would be classified into category Iand, I_p would be classified into category II and I_d would be classified as category IV and thus be regarded unsuccessful. This example shows an explosion source in 11.9 km depth with 9 stations placed in a square. The inter-station distance is 13 km. Only the part of the model underneath the stations is shown.

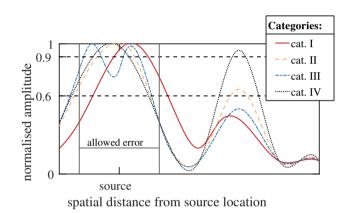


Figure 2. One-dimensional plot-schematic outlining four different categories that were used to rank simulation setups by their localization capabilities location accuracy.

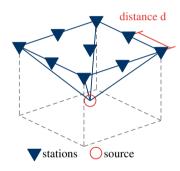


Figure 3. Placement of the nine stations used as receivers for testing the influence of the inter-station distance *d*. The middle receiver is directly above the source.

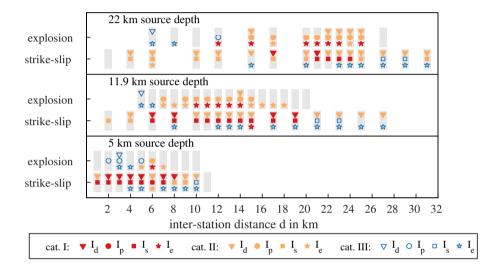


Figure 4. The <u>quality of localizations location accuracy</u> achieved with different inter-station distances *d*. Three source depths were tested for two source types each. The <u>localization location accuracies</u> achieved with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the <u>localization location</u> was not successful. Symbol type and colour in the grey bar represent successful <u>localizations locations</u> with the imaging condition sorted into the respective category.

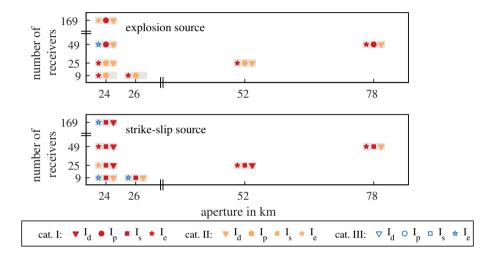


Figure 5. The quality of localizations location accuracy achieved with an increased number of stations. Two source types were tested in 11.9 km depth. Receivers were added either in-between the existing nine stations (aperture stays the same) or outside of the existing nine receivers (aperture increases). The localization locations achieved with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization location was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.

 Table 1. Receiver distances used for different source depths according to results from section 3.1

| source depth (km) | receiver distance d (km) | | |
|-------------------|--------------------------|--|--|
| 5 | 6 | | |
| 11.9 | 13 | | |
| 22 | 23 | | |

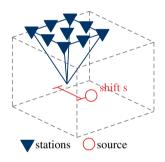


Figure 6. Placement of the nine stations used as receivers for testing the influence of an array that is not centred above the source. The shift *s* was discretely increased.

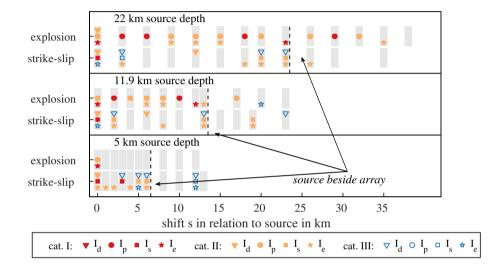


Figure 7. The quality of localizations achieved location accuracy obtained with different shift distances *s* between the middle of the array and the source location. It is marked at which shifts the array is no longer above the array. Three source depths were tested for two source types each. The localization locations achieved with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.

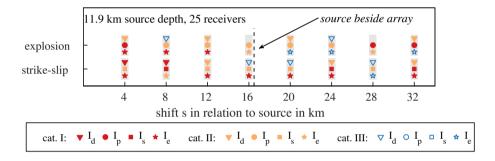


Figure 8. The quality of localizations location accuracy achieved by using 25 instead of 9 stations placed 8 km apart while shifting the array. It is marked at which shifts the array is no longer above the array. A source in 11.9 km depth was tested with two source types. The localization achieved obtained with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.

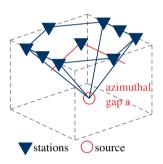


Figure 9. Placement of the nine stations used as receivers for testing the influence of an stations that are distributed heterogeneously. The maximum azimuthal gap a is the largest found angle between two station viewed from the centre station. The azimuthal gap was increased by moving the corner stations closer toward the side receivers on two sides.

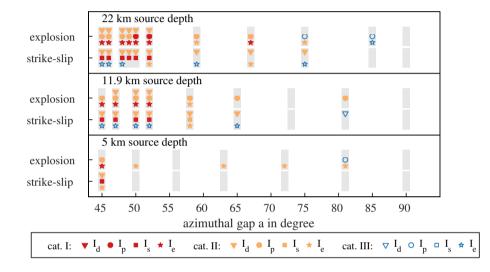


Figure 10. The quality of localizations location accuracy achieved with different maximum azimuthal gaps *a*. Three source depths were tested for two source types each. The localization achieved locations obtained with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.

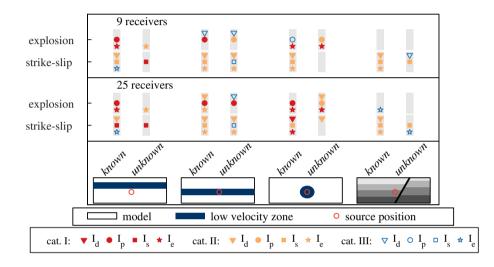


Figure 11. The quality of localizations location accuracy achieved with different velocity models. For each velocity model one simulation was performed with the low velocity zone or fault known and one with a homogeneous or layered velocity model for the backward simulation. A set of nine receivers and a set with 25 receivers was tested. The localization achieved obtained with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.

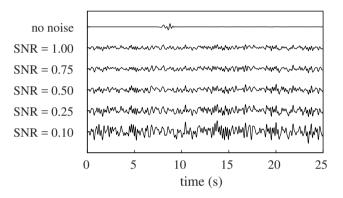


Figure 12. One example trace Example traces recorded with a receiver directly above the source \cdot The for an explosion source was placed in 11.9 km depth. The trace traces without noise and with different degrees of noise is are shown, resulting in different signal-to-noise ratios (SNR).

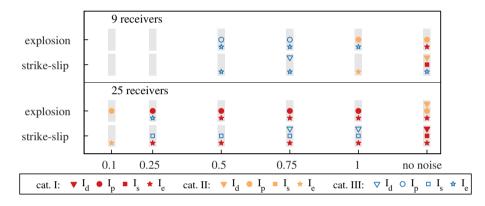


Figure 13. The quality of localizations achieved location accuracy obtained with different amounts of noise added to the traces. A set of nine receivers and a set with 25 receivers was tested for two different source types. The localization achieved locations obtained with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.

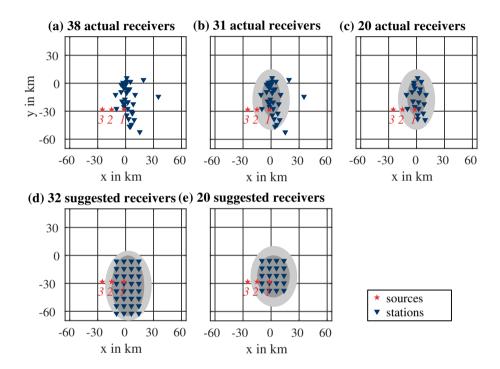


Figure 14. Receiver sets used to test success rate of <u>localizations locations</u> in Southern California: (a) 38 stations as used by Horstmann et al. (2015), (b) a subset of (a) excluding stations that are very close to another station, (c) 20 stations of (a)and, (d) <u>32 suggested stations</u> with regular inter-station distances and (e) 20 stations suggested for optimal results. Three source positions are chosen to test the range of localization.

| receiver set (from Fig. 14) | number of stations | $\min d$ (km) | $\max d$ (km) | mean d (km) | min a (km) | max a (km) |
|-----------------------------|--------------------|---------------|---------------|---------------|------------|------------|
| (a) | 38 | 0.138 | 23.94 | 3.919 | 45.369 | 58.487 |
| (b) | 31 | 2.002 | 23.94 | 5.224 | 45.369 | 58.487 |
| (c) | 20 | 2.901 | 7.499 | 5.024 | 20.348 | 44.923 |
| (d) | 31 | 8~ | 8 | 8~~~ | 24 | <u>56</u> |
| <u>(e)</u> | 20 | 8 | 8 | 8 | 24 | 32 |

Table 2. Inter-station distances d and apertures a of the four-five receiver sets shown in Fig. 14

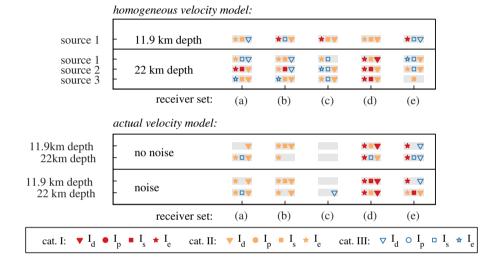


Figure 15. The quality of localizations location accuracy achieved with a strike-slip source in different depths with the different receiver sets and a homogeneous velocity model (top half) and with the velocity model of Zeng et al. (2016) and added noise (SNR = 1)(bottom half). The lower case letters represent the receivers sets of Fig. 14. The localization achieved obtained with the individual imaging conditions were ranked according to the categories from Fig. 2. Grey bars indicate setups that were tested. No symbol in the grey bar means the localization was not successful. Symbol type and colour in the grey bar represent successful localizations locations with the imaging condition sorted into the respective category.