

# Mitigating Artifacts in Back-Projection Source Imaging with Implications on Frequency-Dependent Properties of the Tohoku-Oki Earthquake

Lingsen Meng<sup>1\*</sup> (lsmeng@gps.caltech.edu), Jean-Paul Ampuero<sup>1</sup>, Yingdi Luo<sup>1</sup>, Wenbo Wu<sup>2</sup> and Sidao Ni<sup>3</sup>.

<sup>1</sup>Seismological Laboratory, California Institute of Technology, Pasadena, California 91125, USA.

<sup>2</sup>Department of Earth and Space Sciences, University of Science and Technology of China, Hefei, Anhui 230026, P.R. China.

<sup>3</sup>CAS Key Laboratory of Dynamical Geodesy, Institute of Geodesy and Geophysics, Wuhan 430077, China.

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## Abstract:

Comparing teleseismic array back-projection source images of the 2011 Tohoku-Oki earthquake to results from static and kinematic finite source inversions has revealed little overlap between the regions of high and low frequency slip. Motivated by this interesting observation, back-projection studies extended to intermediate frequencies, down to about 0.1Hz, have proposed that a progressive transition of rupture properties as a function of frequency is observable. Here, by adapting the concept of array response function to non-stationary signals, we demonstrate that the “swimming artifact”, a systematic drift resulting from signal non-stationarity, induces significant bias on beamforming back-projection at low frequencies. We introduce a “reference window strategy” into the multitaper-MUSIC back-projection technique and significantly mitigate the “swimming artifact” in high frequencies (1 s to 4 s). At lower frequencies, this modification yields notable but significantly smaller artifacts than time-domain stacking. We perform extensive synthetic tests that include a 3D regional velocity model for Japan. We analyze the recordings of the Tohoku-Oki earthquake at the USArray and at the European array at periods from 1 s to 16 s. The migration of the source location as a function of period, regardless of the back-projection methods, has characteristics that are consistent with the expected effect of the “swimming artifact”. In particular, the apparent up-dip migration as a function of frequency obtained with the USArray can be explained by the “swimming artifact”. This indicates that the most substantial frequency-dependence of the Tohoku-Oki earthquake source occurs at periods longer than 16 s. Thus, low frequency back-projection needs to be further tested and validated in order to contribute to the characterization of frequency-dependent rupture properties.

**Key words:** Back-projection, Tohoku-Oki earthquake, Frequency-dependent rupture properties, MUSIC, Swimming artifact

## 1. Introduction:

As one of the most important earthquakes in the history of seismology, the 2011 M9 Tohoku-Oki earthquake enables a broad spectrum of studies of the physics of devastating subduction earthquake giants. One key feature observed in this earthquake is that most of the low frequency (LF) slip is located up-dip from the hypocenter. This is supported by teleseismic and geodetic source inversions [Koketsu *et al.*, 2011; Lee *et al.*, 2011; Shao *et al.*, 2011; Simons *et al.*, 2011; Yue and Lay, 2011], seafloor displacement measurement [Sato *et al.*, 2011] and Rayleigh wave back-projection [Roten *et al.*, 2011]. In contrast, the high frequency (HF) slip is distributed at the bottom of the seismogenic zone. This is inferred from teleseismic back projection [Ishii, 2011; Koper *et al.*, 2011b; Meng *et al.*, 2011; Wang and Mori, 2011; Yao *et al.*, 2011] and local strong motion studies [Asano and Iwata, 2011; Meng *et al.*, 2011; Miyake *et al.*, 2011]. This frequency dependent rupture behavior is reported by (Nakahara *et al.*, 2008) for a number of earthquakes and has also been proposed for the 2004 Sumatra and 2010 Maule earthquakes [Lay *et al.*, 2012]. This spatial complementarity between low and high frequency slip provides interesting constraints for physical models of earthquake rupture [Kato, 2007; Huang *et al.*, 2011] and is important for strong motion prediction. [Meng *et al.*, 2011] related this observation to rheological heterogeneities in a broad brittle ductile transition zone.

Motivated by the spatial complementarity between LF slip ( $< 0.1$  Hz) and HF slip ( $\sim 1$  Hz), a number of studies [Koper *et al.*, 2011a; Mori, 2011; Yao *et al.*, 2011; Lay *et al.*, 2012] attempted to probe the transition between these two frequency ranges by performing back-projection at intermediate frequencies. Their results based on the USArray recordings suggest a progressive up-dip migration of the dominant sources as a function of decreasing frequency from 1 to 0.1 Hz. As plausible as this finding is, the back-projection at low frequencies around 0.1 Hz needs to be validated. A potential source of bias addressed here is the so-called “swimming artifact” [Ishii *et al.*, 2007; Walker and Shearer, 2009; Xu *et al.*, 2009; Yao *et al.*, 2012] which appears as a frequency-dependent migration artifact due to the non-stationarity of seismic signals. This artifact is a well-known problem in the back-projection community. It degrades the quality of the images and makes it difficult to build confidence on the fine details of the source imaging, especially when the features of interest have a similar migration direction as the artifact. A common practice is to smooth the images to suppress the artifact [Koper *et al.*, 2011a], but this is not fully successful and comes at the expense of resolution.

In this study, by introducing a modified form of the array response function for non-stationary signals and synthetic tests that incorporate regional velocity models for Japan, we show that the “swimming artifact” is prominent in low frequency beamforming back-projection and can lead to apparent frequency-dependent rupture behavior. On the other hand, by adopting a “reference window strategy” in the frequency-domain MUSIC back-projection [Meng *et al.*, 2011], we are able to compensate the signal non-stationarity and mitigate the swimming artifacts at high

frequency ( $\sim 1\text{Hz}$ ) and significantly reduce them at relative low frequencies ( $\sim 0.1\text{Hz}$ ). Based on extensive synthetic tests and improved results from the USArray and European array, we find that the frequency-dependent source offset observed for the Tohoku-Oki earthquake is consistent with the expected effect of the artifact regardless of the back-projection methods. We thus conclude with a cautionary note on the inference of frequency dependent source properties from low frequency back-projection studies.

## 2. “Swimming” effect in back-projection of non-stationary signals

### 2.1 Non-stationary array response function

The basic tool to assess the resolution capability of a seismic array is the array response function (ARF) defined as the linear beamforming amplitude as a function of source location (or direction of arrival  $\theta$ ) offset with respect to the true location of a point source, under the assumption of a stationary signal with perfect coherence across the array (e.g. [Rost and Thomas, 2002]):

$$A(\theta) = \left| \sum_k e^{i\omega t_k(\theta)} \right|^2$$

where  $\omega$  is the angular frequency,  $t_k$  is the time delay at the  $k$ th station as a function of relative location  $\theta$  of the trial source. In principle, the true source location brings in phase the signal at all the stations and yields the maximum array beamforming output. The ARF of 2D arrays typically shows an elliptical main lobe, whose size is proportional to the wavelength to aperture ratio and defines the resolution limit of standard beamforming. In reality, earthquake waveforms are far from being stationary. Their envelope amplitude decays as a function of time due to scattering in the heterogeneous crust [Sato and Fehler, 1998; Zerva and Zervas, 2002]. To account for the non-stationarity of the seismic signal, we propose a modified ARF by introducing an additional time dimension and a decaying weight function  $S(t)$  that represents the typical decay of the waveform envelopes:

$$A(\theta) = \left| \sum_k S(t_k(\theta)) e^{i\omega t_k(\theta)} \right|^2$$

The function  $S(t)$  can be rather complicated since it involves both the amplitude and phase perturbation. Furthermore, in general this function differs from station to station due to site effects. To simplify the presentation, we consider that  $S(t)$  is the same for all the stations in the array and adopt a decaying exponential function. We estimate its characteristic decay time as a function of frequency by fitting a decaying exponential to the envelope of the stacked USArray seismograms of a Mw 7.1 foreshock (on March 9<sup>th</sup>, 2011) in different frequency bands.

Introducing this decay function into the ARF represents the beamforming of a signal with an exponentially decaying envelope starting at  $t=0$  (Fig. 1c).

## 2.2 The origin of the “swimming artifact”

We study the modified ARF in a 2D Earth configuration first. A linear array composed of 16 stations is located at teleseismic distances, from  $75^\circ$  to  $90^\circ$  away from the hypocenter of a point source. The stations are regularly spaced by  $1^\circ$  (Fig. 1a). We computed the modified ARF in different frequency bands. Figure 1b shows that the main lobe of the modified ARF migrates as a function of time towards the direction of the array. This is the hallmark of an artifact that has been referred to in previous back-projection studies as the “swimming artifact” [Ishii *et al.*, 2007; Walker and Shearer, 2009; Xu *et al.*, 2009; Yao *et al.*, 2012]. Our analysis shows that the artifact is caused by the non-stationarity of the signals.

Although the decay rate of  $S(t)$  controls the severity of the artifact, the existence of the bias is inevitable as long as the signal power decays as a function of time. In particular its existence does not depend on the detailed shape of the decay function. The origin of the artifact can be understood as follows. We consider the true source location A and a trial location B closer to the array. At  $t=0$  s, when the signal envelope reaches its maximum, the travel time curve from source A samples the maximum of the signal envelope at all stations and leads to a maximum stack. Thus the peak of the beam gives a correct estimate of the true location. Later on, for instance at  $t=10$  s, the travel time curve from A still aligns the array signals with uniform, although lower amplitude. However, the travel time curve from source B (dash line in Figure 1a) samples also the earlier, larger amplitude part of the waveform. Although it renders the stations slightly out of phase, it gives a larger stack than a trial source on A at  $t=10$  (solid line in Figure 1b). Thus, the modified ARF at B is larger than at A, which creates an apparent shift in the estimated source location. The speed of the drift scales with wavelength, so it is amplified at lower frequency. For a given travel time curve, the phase perturbation is smaller at longer period, resulting in the peak sum appearing even further off the true location. Although our analysis is based on the array response, a concept belonging to standard beamforming, this phenomenon is common to all array processing methods, since they are all based on the signal coherency and amplitude.

The “swimming artifact” in this 2D Earth example leads to the naive interpretation that the bias occurs in the source-array direction, which is in the along-strike direction when imaging the Tohoku-Oki earthquake with the USArray. However, in the 3D Earth case, the direction and strength of the artifact are controlled by both the source-to-array direction and the array configuration. Figure 2 shows that the artifact is most prominent along the longer axis of the array response for both the USArray and European array. The configuration of the two arrays can be found in Figure 3. The ARF of the USArray extends along the E-W direction due to its dominantly longitudinal station distribution. Hence the swimming artifact operates along dip (Figure 2). This can potentially perturb any attempt to image frequency dependent along-dip location of slip.

## 2.3 Mitigating the artifact

Based on our developed understanding of the origin of the “swimming artifact”, we can now propose a mitigation technique. Since the artifact is due to the fact that the windows corresponding to different trial slownesses sample different amplitudes of the non-stationary signal envelope, we propose a certain choice of windowing to minimize the effect of the signal non-stationarity. We call this technique a “reference window” approach.

The idea is to sample the recordings with the window corresponding to a reference slowness, usually corresponding to the hypocenter. When testing different slownesses (corresponding to different trial source locations) instead of using the actual window defined by the trial differential arrival times, we phase shift the data inside the reference window in the Fourier domain. Because this approach tests different slownesses with the same segment of the waveforms, the result is not affected by the temporal non-stationarity of the signals and therefore the swimming artifact is significantly reduced. Our reference window approach can be understood in the example in Figure 1. At  $t=10$  s, when testing the travel time curve corresponding to location B, instead of using the actual curve (blue dash line in Figure 1a) we test a curve B' (orange dash line in Figure 1a) that has the same slope as B but whose mean is adjusted to that of curve A. This curve B' corresponds to the same location as B but has a delayed absolute source origin time. Curves A and B' sample the same part of the waveform and thus the same amplitude of the signal. Curve B' has a smaller stack than curve A since it is off phase. Therefore the correct location A is recovered and no artifact is introduced.

The reference window strategy is embedded in frequency domain back-projection techniques, such as the frequency-domain beamforming, MUSIC [Meng *et al.*, 2011] and compressive sensing [Yao *et al.*, 2011], in which the Fourier coefficients or the covariance matrix are computed based on the signals in the reference window. Because the Fourier shift implies periodic signals, the phase shift should not be too long relative to the window. Hence the method is appropriate provided that the differential arrival times across the array are small compared to the length of the window. This is true when the sizes of the array and source region are small compared to the distance that P waves travel over the window duration. For the Tohoku-Oki earthquake imaged by the European array and USArray at teleseismic distance, if the trial source region is up to 2 degrees from the epicenter, the standard deviation of the travel time curve is smaller than 1 s, which is a small fraction of the 10 s long window. Hence the reference window approach is valid in this case.

The reference window approach introduces a time shift, the difference between the mean of B and B', therefore a timing correction is needed [Yao *et al.*, 2011]. This correction is readily implemented once the radiator locations have been identified in each back-projection image frame. The timing shown in our summary maps of HF radiation incorporates this correction, in which the true source time (color coded) of each identified radiator equals to the timing of the back-projection image frame minus the mean of the travel time curve corresponding to the location of the radiator. In the next section we conduct a series of synthetic tests to compare the frequency domain MUSIC (reference window) and time domain stacking (absolute window).

### 3. Synthetic test of back-projection at various frequencies

#### 3.1 Point source synthetic test

To demonstrate the artifact at various frequencies and how well it can be mitigated by MUSIC, we test the back-projection on the synthetic USArray and EU array seismograms of a M6.2 aftershock with hypocenter location at 143.41 °E, 38.32 °N. The station distributions of the two arrays are shown in Figure 3. The synthetics are computed by a hybrid approach in which the wavefield in the source region (a 1100 km ×1000 km ×70 km box) is computed by the spectral element method (SPECFEM3D, [Tromp *et al.*, 2008]) and interfaced with the geometrical ray theory up to the teleseismic receivers [Helmberger, 1983]. This approach enables incorporating the complexity of regional velocity structures at affordable computational cost and is ideal for testing teleseismic back-projection techniques at relatively high frequencies. In the SPECFEM3D simulation we used a regional tomography model [Miura *et al.*, 2005] to account for waveform complexity introduced by 3D structures. The synthetic seismograms are computed with the sampling rate of 5 Hz, but due to the limited computation power accuracy in the SPECFEM simulation is warranted only up to 1 Hz. Future work involves incorporating realistic small scale heterogeneities in the velocity model under the receivers to model waveform incoherence and coda decay.

Figure 4 shows the results of MUSIC and time-domain stacking back-projection of the aftershock scenario at various frequency bands. As expected from the modified ARF, the peak of the beamforming power progressively migrates along the major axis of the array response. Like in our idealized ARF analysis, the peak amplitude decreases as it swims. On the other hand, the spatial bias of the MUSIC analysis at high frequencies (0.25 ~1 Hz) is negligible. At frequencies lower than 0.25 Hz, the location shift is notable but substantially smaller than in time-domain stacking. Hence at low frequency the “swimming” artifact cannot be ignored even with the MUSIC approach.

#### 3.2 Kinematic source synthetic test

To further understand the artifact under more complicated and realistic circumstances, we conduct a kinematic rupture scenario involving two branches of simultaneous rupture along a circular rim (Fig.5). The circle is centered at the hypocenter of the M6.2 aftershock with a radius of 100 km. It is divided into two semicircles by a line trending 210 ° through the center. Two simultaneous North-to-South ruptures develop along each semicircle with rupture speed of 2 km/s. Physically, this scenario is inspired by dynamic simulations in which a rupture front surrounds a circular asperity or low stress region before breaking it [Dunham *et al.*, 2003]. The ruptures are composed of moving sources with a spatial interval of 40 km. This spacing is chosen so that the sources are dense enough to represent a continuous rupture yet the coda wave is still

substantial to maintain realistic signal non-stationarity. The Green's functions are the same as for the M6.2 aftershock. This circular rupture model is relatively simple but has enough complexity, including simultaneous sources with temporally varying spacing.

Figure 5 shows the results of MUSIC and linear beamforming back-projection of the circular rupture scenario with seismograms computed for both USArray and European array at periods from 2 s to 16 s. In order to compare to results by [Yao *et al.*, 2011], we set the time window to be 10 s at the band of 1 - 4 s and 20 s for 4 - 16 s. The locations of the first and second strongest radiators detected by both arrays in each window are plotted and color-coded by time. The size of the radiators is normalized by the maximum of the beamforming power or MUSIC pseudo-spectrum over the first 150 s of the rupture. In the highest frequency band (0.5-1 Hz), the MUSIC result of the European array almost exactly reproduces the synthetic rupture scenario, recovering radiators on the edge of the circle. The USArray result is noisier and distributed within the circle because its Green's functions have a smaller coherent arrival to coda ratio resulting from the nodal orientation of the array with respect to the focal mechanism. In the period band of 2 s to 4 s, the MUSIC result of both arrays are within the circle. In the low frequency band (8 s -16 s), the uncertainties become large due to limited resolution and the swimming bias starts to be notable.

In comparison, the beamforming is less capable of resolving the simultaneous sources. The recovered radiators are distributed along the expected artifact direction. Here we also applied a common post-processing technique to weaken the swimming artifact [Koper *et al.*, 2011b]. The idea is that although the artifact swims, the true location always has the largest beamformed power. Thus plotting the high frequency power against time and picking only the local maximum can in principle discriminate the true source location from the spurious sources. The processing is useful when the source process is simple, for instance for a fixed point source or a unilateral rupture, but less effective in complicated rupture scenarios involving multiple simultaneous sources. In the case of the circular rupture scenario, at relatively short periods (1 s~4 s) the identified radiators are located in between the true locations. At longer periods (4 s~16 s) they show considerable bias "downstream" of the true locations along the artifact direction, creating an apparently frequency-dependent rupture pattern.

#### **4. Low frequency back projection of the Tohoku-Oki earthquake**

The along-dip frequency dependent slip migration observed in previous back projection studies is based on the USArray data [Koper *et al.*, 2011a; Mori, 2011; Yao *et al.*, 2011]. The other large regional array, the European array, has been processed at high frequency around 1 Hz [Koper *et al.*, 2011b; Meng *et al.*, 2011]. Analysis of the European array data at longer periods has not been reported before. Here we back-project the Tohoku-Oki earthquake data recorded by the European array and USArray at periods from 2 s to 16 s with both the MUSIC and linear

beamforming methods (Fig.6). In order to be comparable to [Yao *et al.*, 2011], we set the beamforming time window to be 10 s at the band of 1 - 4 s and 20 s for 4 - 16 s. The locations of the radiators detected by both arrays in each frequency band are shown at Figure 6. The size of the radiators is normalized by the maximum of the beamforming power or MUSIC pseudo-spectrum over the first 150 s of the rupture. For time-domain stacking, similar to the point source synthetic test, we observe strong swimming effect at periods longer than 2 s. In the highest frequency band (0.5-1 Hz), the artifact is smaller and the beamforming images are roughly consistent with the MUSIC estimates, which explain the overall agreement of high frequency back-projection studies.

At lower frequencies, the peak beamforming power migrates along the elongated ARF and is clearly dominated by the swimming effect. In contrast, in the MUSIC back-projection results, the dominant distribution of the seismic radiation in the down-dip region is clear in all frequency bands at both arrays, except in the 8~16 s band which shows linear patterns corresponding to the artifact. We therefore restrict analysis of frequency-dependent source behavior based on MUSIC results to the band of 1~8 s. As shown by the synthetic tests, even with the reference window strategy and the MUSIC method, the artifact at lower frequency is significant. For a given period, the radiators imaged by MUSIC with the European array are always to the west of those imaged with the USArray. At USArray an eastward migration of about 70 km is seen between 1 and 8 s. This is consistent with the most clearly reported frequency dependent shifts by compressive sensing [Yao *et al.*, 2011]. However, this trend is absent in the European array results, which do not show notable frequency-dependent variation. This difference is consistent with the stronger artifact in USArray, as shown in Figure 5, due to the smaller signal to coda ratio resulting from its nodal orientation. Therefore, a frequency-dependent source location is not needed to explain the observations within the 1~8 s band. This indicates that any true frequency dependent source migration is minor compared to the 70 km shift apparent in the USArray back-projection.

## **5. Summary and discussion:**

In this study we explained the origin of the “swimming” artifact in array back-projection through the modified array response function and synthetic tests. We find that this effect is significant for time-domain stacking but can be efficiently mitigated by MUSIC array processing with a reference window strategy. MUSIC back-projection of the Tohoku-Oki earthquake recordings at the USArray and European array show no significant tendency for the source to migrate towards the trench at increasing periods within the period band of 1~8s. An alternative interpretation is that the most substantial transition from deep to shallow slip occurs at periods longer than 16 s, which implies even longer rise time in the shallow portion of the megathrust. Furthermore, given that the swimming artifact is substantial in the time-domain stacking back projections especially at long periods, and that this bias at USArray behaves similarly to the potential frequency dependent along dip migration of slip, we consider further tests and validations need to be performed before one can conclude that the along-dip slip migration can be observed by the

low frequency back projection.

Our study also poses an interesting question: over which frequency band can we reliably image earthquake rupture processes by teleseismic back-projection? To image the 2011 Tohoku-Oki earthquake by the time-domain stacking technique with the USArray and European array we determined that the frequency should be above 0.25 Hz to avoid substantial artifacts. As for the MUSIC technique, which suffers less severely from the swimming artifact, we suggest that the low frequency results around 0.1 Hz can indicate first order spatial patterns, but the finer details of the images are not reliable due to the limited resolution.

The reference window strategy needs to be compared with other efforts to mitigate the ‘swimming’ effect. For instance, [Koper *et al.*, 2011b] proposed to reduce the strength of the artifact by selecting the temporal maxima among all the identified radiators. However, as we show in the synthetic circular rupture test, this approach cannot fully eliminate the frequency-dependent artifact when dealing with realistic rupture complexity involving for instance multiple simultaneous sources.

One mystery that remains to be unwrapped is the discrepancy between the MUSIC and compressive sensing result [Yao *et al.*, 2011]. In principle, they are both performed in frequency domain and share the reference window strategy, therefore should both suffer less from the swimming artifact. Yet, compressive sensing provide large trenchward shift at 10 s~20 s, which is absent in the 8 s~16 s band result with MUSIC. Efforts could be devoted to understand the other potential bias and artifact of various back-projection techniques. This concern also demonstrates the need to perform more rigorous synthetic tests involving more realistic rupture scenarios and crustal velocity models, which we will address in future work.

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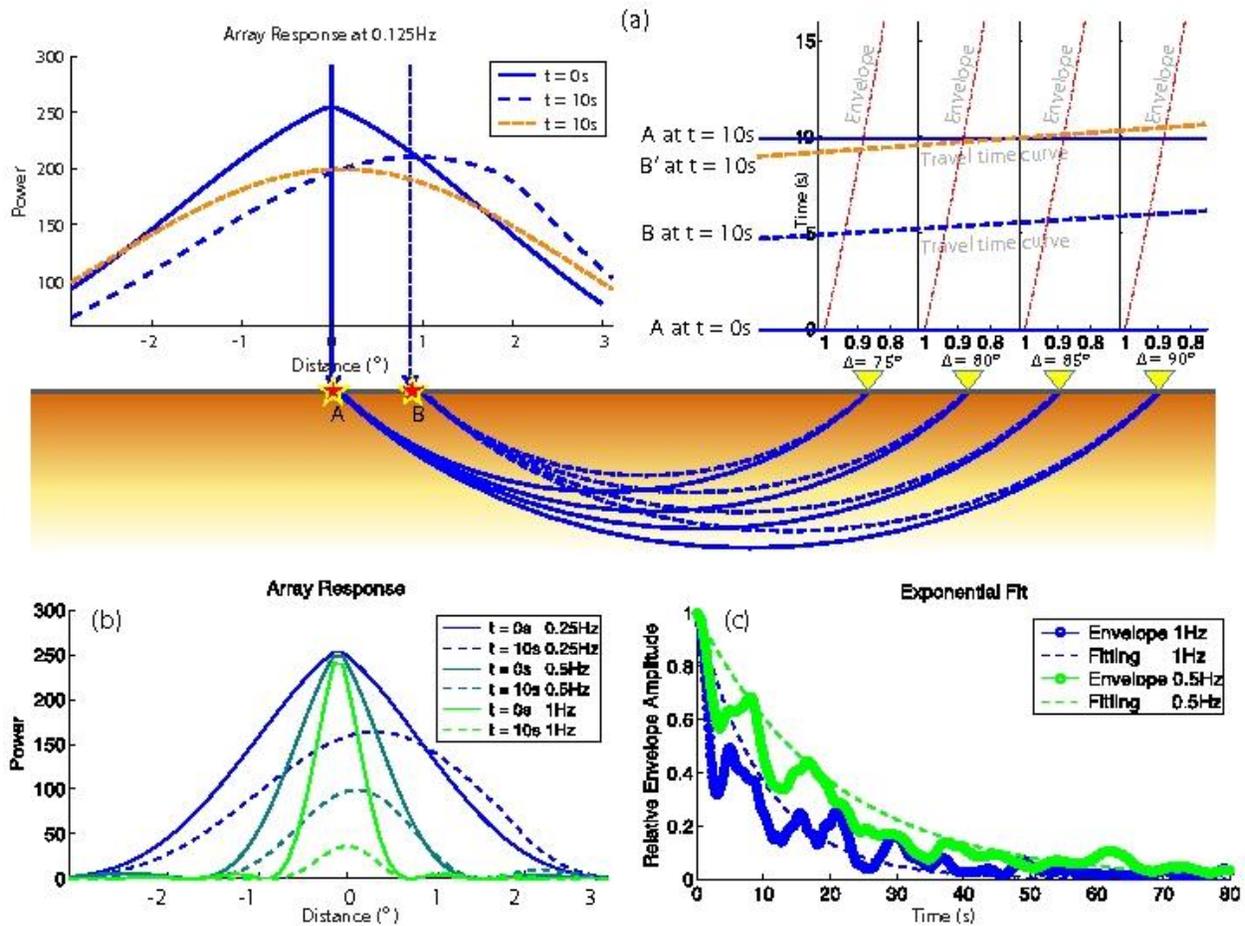
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### **Acknowledgements**

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## Figure Caption



### Figure 1 The 'swimming' artifact of a 1D array in a 2D Earth.

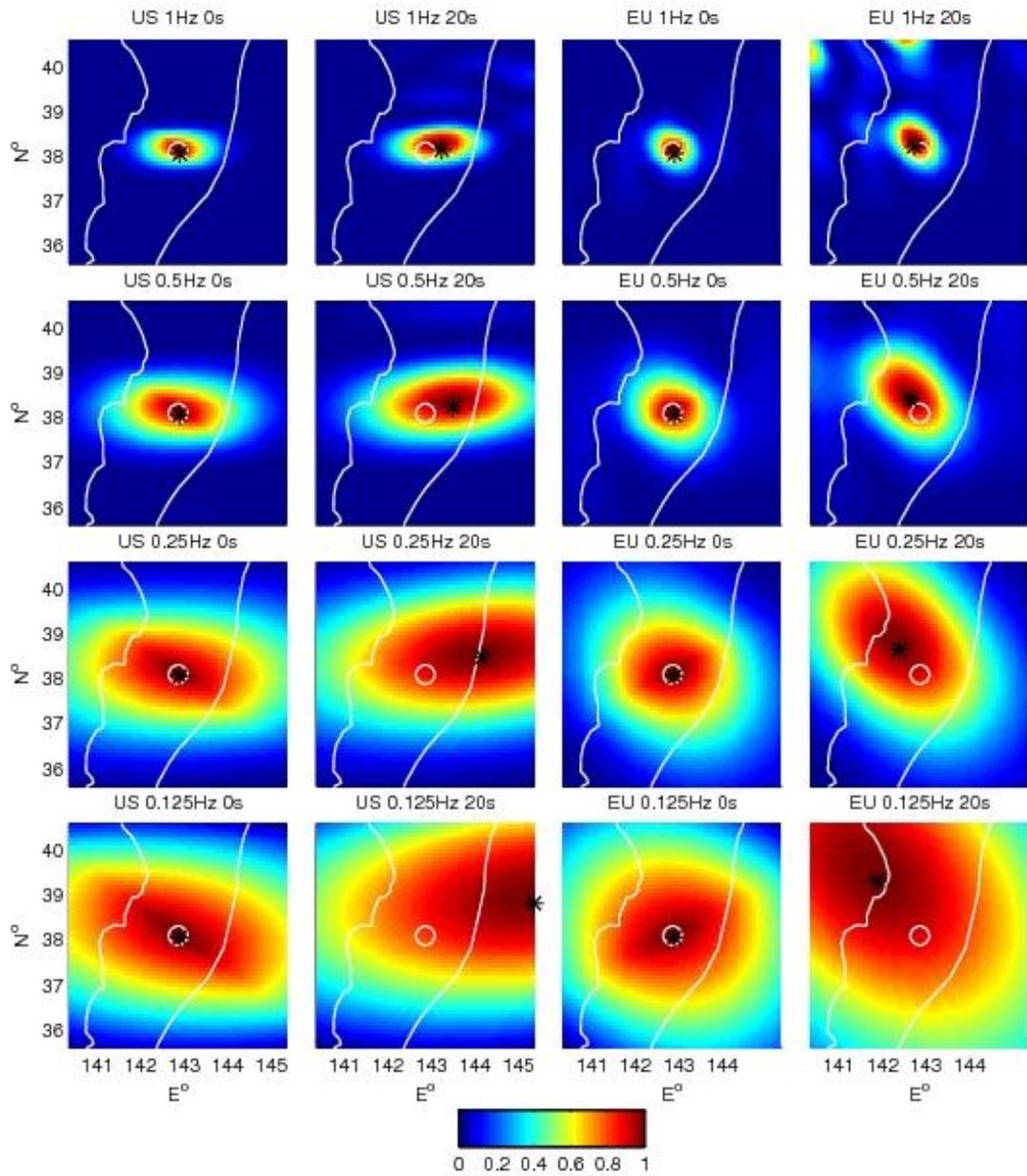
(a) 'Swimming' effect at lower frequency (0.125 Hz) with respect to a teleseismic ( $75^\circ$ - $90^\circ$ ) linear array of 16 stations ( $1^\circ$  spacing).

Upper left figure shows the artifact: at  $t = 10s$ , maximum array response drifted from true location A ( $0^\circ$ , as solid-edged star) to apparent location B ( $0.9^\circ$ , dash-edged star), a difference of about 100km.

Upper right figure shows the traveling time curve sampling envelopes of station #1, 6, 11 and 16 (distance  $75^\circ$ ,  $80^\circ$ ,  $85^\circ$ ,  $90^\circ$ , respectively, plotted as yellow triangles). The solid and dashed abscissas denote the travel time curve of a hypothetical source occurring at certain location and origin time. At  $t = 10s$ , Blue dash line is the traveling time curve that yields the overall maximum of the array response taking into account the signal decay. Instead of the true source location A, it introduces an apparent location B closer to the array. On the hand the array response of the travel of B' (reference window strategy) is smaller than that of A, therefore no swimming artifact is created.

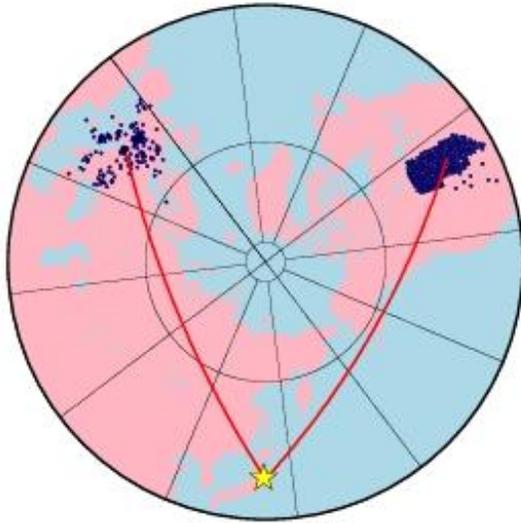
(b) 'Swimming' effect in different frequency band, with solid curves showing  $t = 0s$ , and dash curves showing  $t = 10s$ , respectively. Note that at all the frequencies the maximum of array response shifts towards the array direction, this effect is reduced at higher frequency.

(c) Exponential-fitting estimation of the frequency dependent time decay function. Envelopes of the stacked signals are smoothed with a time window 2.5 times the upper period bound of the bandpass filter. Each envelope are aligned to  $t = 0$  and normalized with respect to its maximum. Due to the contamination of the signals by the micro-seisms, only signals higher than 0.25 Hz are analyzed. An attenuation decay function  $e^{-0.1ft}$  is estimated and used for all frequencies in this paper.

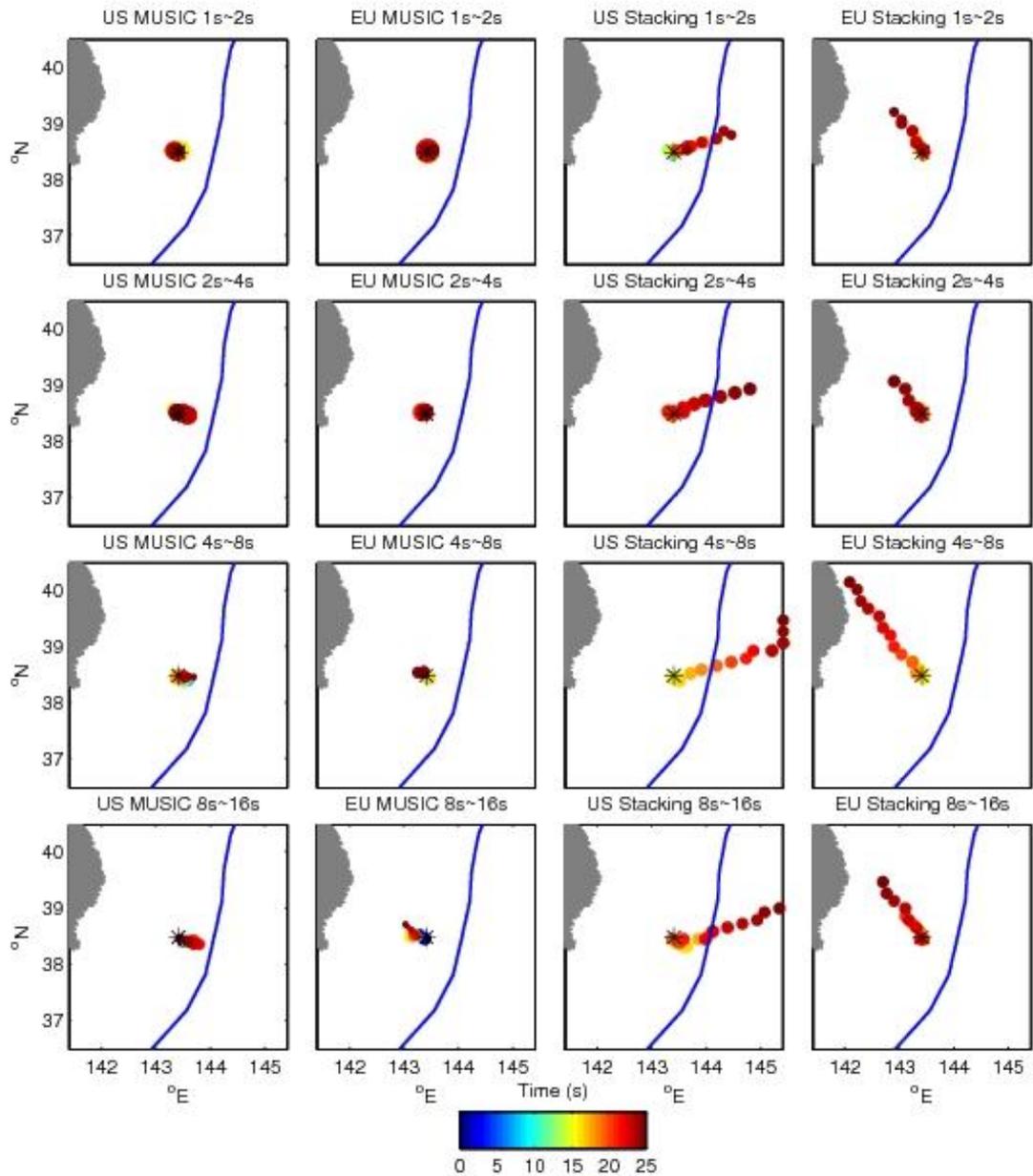


**Figure 2** Swimming effect in the 2D array response of the USArray (left two columns) and

European array (right two columns) at frequency of 1, 0.5, 0.25 and 0.125 Hz, with color coded array response normalized by its maximum, white circle indicates the epicenter and black star indicates the location of maximum array response. Note that the swimming effect intensifies as frequency decreases like in the 1D case, but the maximum swims in a direction that combines the longer axis of the array response and the source-to-array direction.

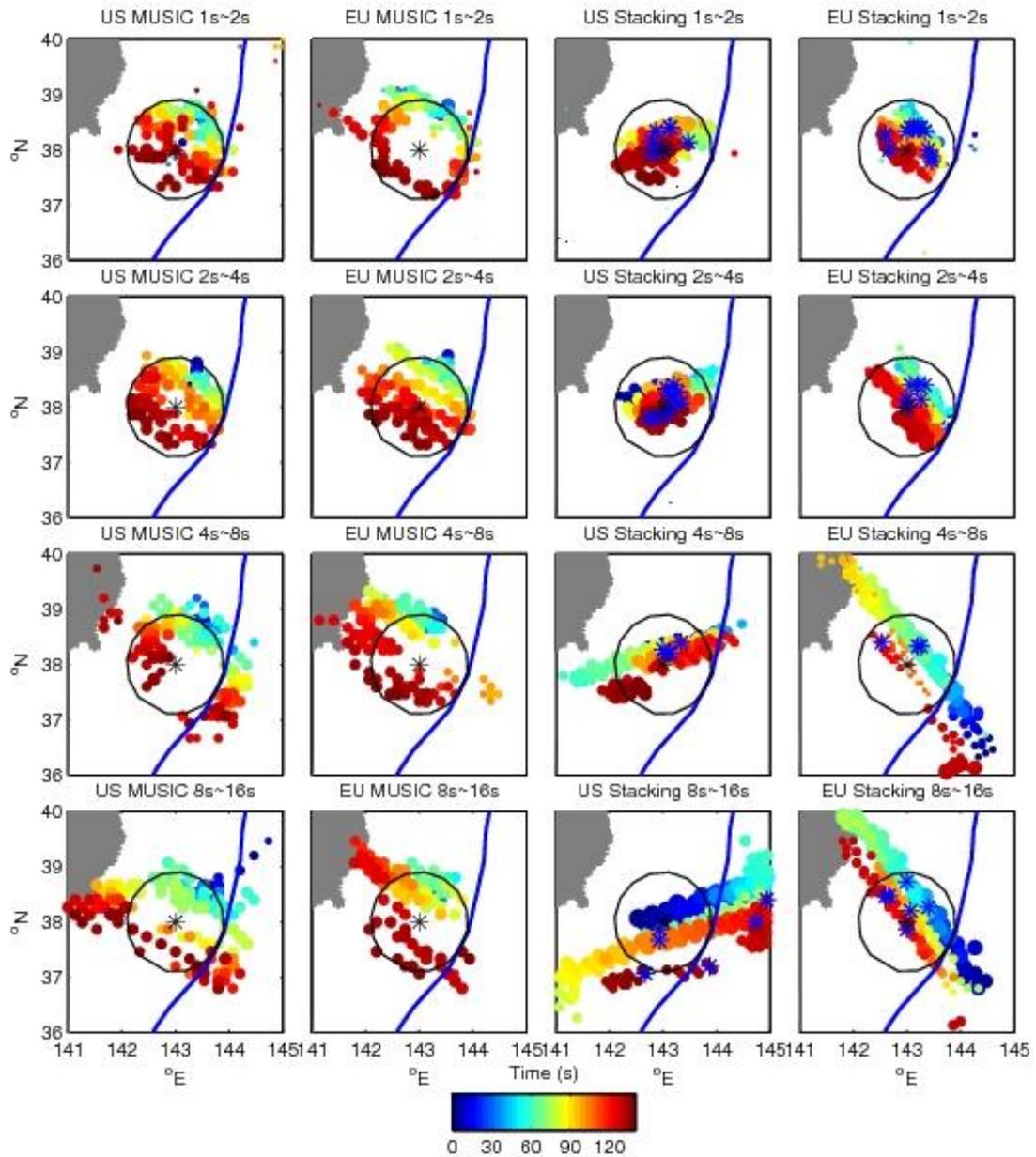


**Figure 3** Selected stations of the USArray and European array are denoted as the blue dots. The JMA hypocenter of the Tohoku-Oki is the yellow asterisk. The red lines are the great circle path from the centroid of each array to the hypocenter. The two arrays are both within  $75^{\circ}$ ~ $90^{\circ}$  away from the hypocenter.



**Figure 4 Back-projection of aftershock synthetics.** The synthetic aftershock seismograms at

USArray (left two columns) and European array (right two columns) are processed by the MUSIC and linear stacking techniques separately at periods of 1~2 s, 2~4 s, 4~8 s and 8~16 s. The location of the aftershock is denoted by the asterisk. The solid circles are the peak of the back projection images color-coded by time and sized by their relative amplitude with respect to the global maximum. The beamforming results show a “swimming” artifact at all frequencies. The MUSIC estimates are reliable at periods shorter than 4 s. In lower frequencies, the spatial bias is notable but less severe than that of beamforming.



**Figure 5 Back-projection of circular rupture synthetics.** The synthetic seismograms of a

circular rupture scenario recorded at USArray (left two columns) and European array (right two columns) are processed by the MUSIC and linear stacking techniques separately at periods of 1~2 s, 2~4 s, 4~8 s and 8~16 s. The location of the aftershock is denoted by the black asterisk. The black circle is the hypothetical circular path of the rupture scenario. The solid circles are the peak of the back projection images color-coded by time and sized by their relative amplitude with respect to the global maximum. The blue asterisks are the “temporal local maximums” of the stacking result. The MUSIC recovers the rupture reasonably well at high frequency but loses the resolution beyond 4 s. The time-domain stacking method shows bias resulting from the swimming artifact.

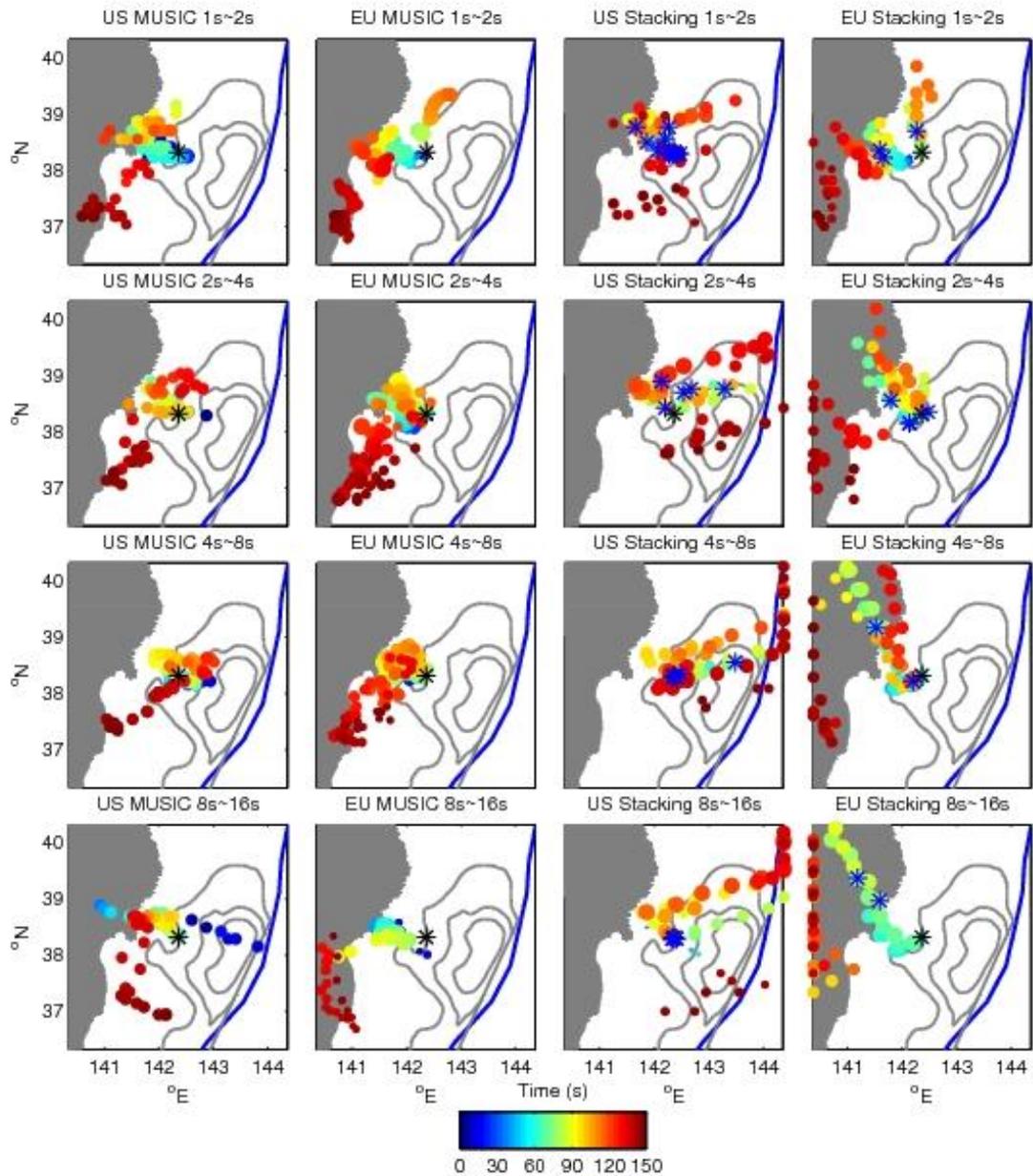


Figure 6 back-projection of the Tohoku-Oki earthquake at various periods (1s~16s) of

USArray and European array data with the linear stacking and MUSIC approaches. The hypocenter is denoted by the black asterisk. The location of the radiators are colored by time and sized by the amplitude with respect to the maximum. The blue asterisks are the “temporal local maxima” of the stacking result. The background grey lines are 12 m, 14 m and 36 m slip contours of a geodetic and seismic joint inversion model [Wei *et al.*, 2012]. The beamforming results are dominated by the artifact at periods longer than 4 s. The MUSIC results are consistent over all frequency bands. Minor up-dip migration shows up in the period of 1 s~8 s at the USArray, but it is within the range expected from the “swimming” artifact and it is absent in the European network.