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A hybrid passive localization method under strong interference with a preliminary experimental demonstration

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Abstract

Strong interference exists in many passive localization problems and may lead to the inefficacy of traditional localization methods. In this study, a hybrid passive localization method is proposed to address strong interference. This method combines generalized cross-correlation and interference cancellation for time-difference-of-arrival (TDOA) measurement, followed by a time-delay-based iterative localization method. The proposed method is applied to a preliminary experiment using three hydrophones. The TDOAs estimated by the proposed method are compared with those obtained by the particle filtering method. Results show that the positions are in agreement when the TDOAs are accurately obtained. Furthermore, the proposed method is more capable of localization in the presence of a strong moving jamming source.

Keywords: Interference cancellation, Radon transform, Cross-correlation, Localization, Underwater acoustics

1 Introduction

Passive source localization is a significant and important topic in signal processing because of its minimal impact on the environment and low susceptibility to the effects of clutter. This viable approach has certain advantages in navigation [1], speaker tracking [2], radar [3], and underwater acoustics [4,5]. The time-delay-based method is the most widely used localization strategy, which is a two-step scheme. In general, time-difference-of-arrival (TDOA) measurements of a passive signal on spatially separate receivers are first estimated, followed by the solution of nonlinear hyperbolic equations using the range-difference information obtained from the product of the measured time delays and the known propagation speed. Thus, the source position can then be determined based on the sensor array geometry.

In localization, a straightforward TDOA estimation between a pair of receivers can be realized by determining the peak of the cross-correlation function. A generalized cross-correlation called the phase transform (PHAT) [6], which uses the normalized spectra of the signals, is commonly used in time-delay measurements [7–9]. The

position of the source can be estimated through the intersection point of each pair of hyperbolic functions. However, since each pair can have zero, one, or two intersections, the logic to find the correct one is nontrivial. Also, determining the correct weighting is difficult. Solving the hyperbolic functions using nonlinear least squares has been considered as a possible approach [10], in which a Taylor-series expansion is used for linearization and the solution is determined iteratively. A two-step weighted least-squares algorithm proposed by Chan [11] could provide the final solution of the position coordinates by exploiting the known relation between the intermediate variable and the position coordinates. Young et al. [12] explored the use of cross-correlation-based TDOA methods for localization by a modified minimum-variance distortionless response technique. Lui [13] derived a semi-definite programming algorithm for source localization by integrating some available prior information. Friedlander [14] estimated the range and depth of an underwater source by measuring the propagation delay differences among multiple propagation paths on two vertically deployed receivers. Felisberto et al. [15] further developed a localization method that minimizes a time-delay objective function with respect to the depth and range with the use of a

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target signal output may be buried in the interference. The PHAT method, which is a generalized cross-correlation processing method, has the capability to suppress the interference power and can be mathematically expressed as

$$y(t) = \text{IFFT}\left(\frac{X_1(f)X_2^*(f)}{|X_1(f)||X_2(f)|}\right), \quad (2)$$

where * indicates complex conjugation and $X_1(f)$ and $X_2(f)$ are the spectra of $x_1(t)$ and $x_2(t)$, respectively. In the PHAT output $y(t)$, two peaks corresponding to the interference and target signal are present. When both TDOAs are close, the TDOA of the target signal is difficult to accurately obtain because the target-signal peak of the PHAT output is significantly obscured. Therefore, the interference should be suppressed before TDOA estimation. Even in cases in which the two peaks are totally separated, the cancellation process is beneficial to automatically determine the TDOA.

2.2 Interference cancellation

If a strong jamming source exists in the background, an obvious additional peak will appear in the PHAT output. In block processing, the sampled waveform of the target signal when the source is moving is divided into blocks, and PHAT processing is applied to each of the blocks. Once the PHAT outputs are organized into a cross-correlation matrix, in which each row represents a PHAT output, a false trajectory corresponding to the peaks may be present along the running time dimension. In most cases, the trajectory does not exhibit a straight-line behavior. If the PHAT outputs are rearranged to generate a line for the dominant interference component, the Radon transform can be exploited, which is effective for line detection. On the basis of this intuition, a novel processing method is proposed for interference cancellation on the PHAT outputs. The procedure of this method is illustrated in Fig. 2 and described as follows:

1. Successive blocks of the received signals on each receiver pair are processed using the PHAT technique to generate a cross-correlation matrix. Given that the Radon transform renders good line detection, all the peaks of the PHAT outputs, which correspond to the dominant interference component in the matrix, are aligned to generate a line along the running time axis. Thus, a new matrix is generated, as shown on the left of Fig. 2. In this way, an output matrix P with dimension $N \times M$ is produced, where N is the number of processed blocks and M is the length of the PHAT output. The output matrix has a nearly straight vertical line along the running time axis, and this line corresponds to peaks of the interference cross-correlation. The offset of each PHAT peak in the processing procedure is stored in memory for later use.
2. The first M rows of P are selected and form the block named P_1 , which is of dimension $M \times M$ and, in this example, covers an event when the target signal and interference have the same or similar TDOAs. The second block following P_1 , named P_2 , is also of dimension $M \times M$. The Radon transform is performed on both matrices:

$$\begin{aligned} P_{1R} &= \text{RT}(P_1), \\ P_{2R} &= \text{RT}(P_2), \end{aligned} \quad (3)$$

where $\text{RT}(\cdot)$ denotes the Radon transform. The transformed matrix P_{1R} contains both the TDOA variations of the interference and target signal along the running time dimension, whereas the matrix P_{2R} contains only information of the interference. If the target signal is partially contained in P_2 , then a negative peak will appear in the interference cancellation result.

3. Let $\Delta P_R = P_{1R} - P_{2R}$, so that the interference in P_{1R} is canceled. The inverse Radon transform (IRT) is then applied to ΔP_R , yielding

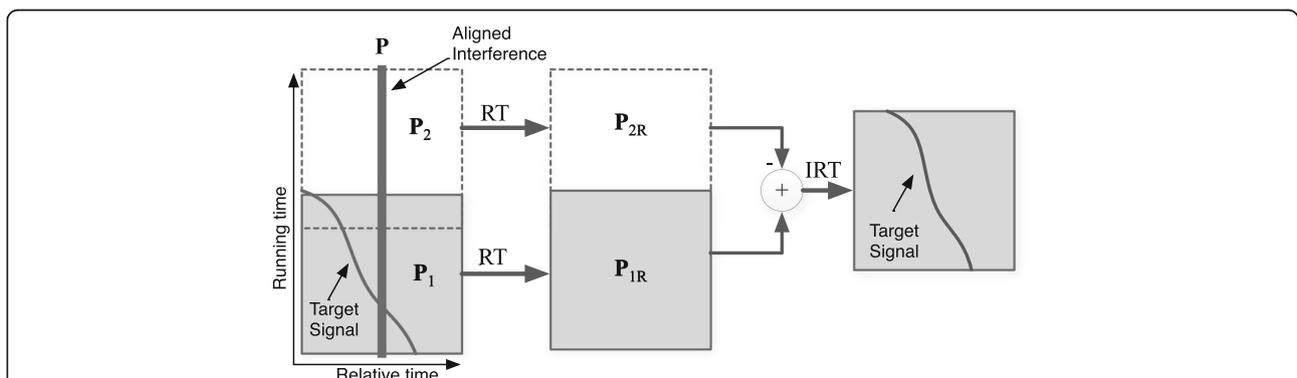


Fig. 2 Interference cancellation method, whereby the Radon transform is executed on two aligned matrices selected from the PHAT outputs, and the interference is canceled by the inverse Radon transform on their difference

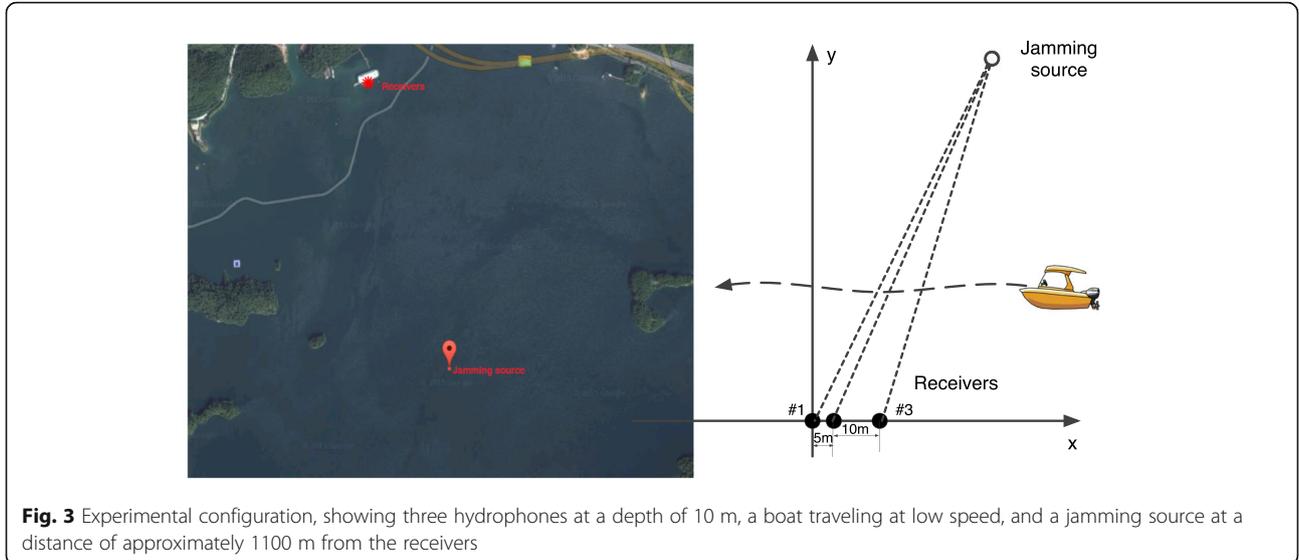


Fig. 3 Experimental configuration, showing three hydrophones at a depth of 10 m, a boat traveling at low speed, and a jamming source at a distance of approximately 1100 m from the receivers

The rays propagated from the moving boat in this environment were computed using the Bellhop ray model [25, 26] with the source located at a depth of 0.5 m, as shown in Fig. 4b. Most of the rays travel downward and are then reflected from the bottom. Direct-path waveforms were received at a depth of 10 m when the source range was less than 500 m, and bounces at the boundaries occurred more than once when the source distance exceeded 700 m.

As the boat moves beyond the receiver array, a 5–15 kHz linear frequency modulation (LFM) signal was radiated from the jamming source with a duration of 0.1 s and repeated every 0.5 s. Both the LFM signal and boat noise were simultaneously filtered and recorded. Even though the spectrum of the boat noise is lower at frequencies of only a few thousand hertz, it is more significant for the

interference cancellation study. A portion of the waveform recorded on the #1 hydrophone and its power spectrum are shown in Fig. 5. The plots show that the boat noise is approximately 25 dB lower than the LFM jamming signal and is therefore seriously contaminated.

Given that the jamming source was practically motionless, a line in the cross-correlation output matrix should exist. Therefore, the interference cancellation procedure can be simplified in subsequent processing because PHAT peak offsets are not necessary.

3.2 Processing results and comparison

All three hydrophone outputs were used to compute the TDOAs, as described in (5). Consequently, three hyperbolic functions were generated. The PHAT results from

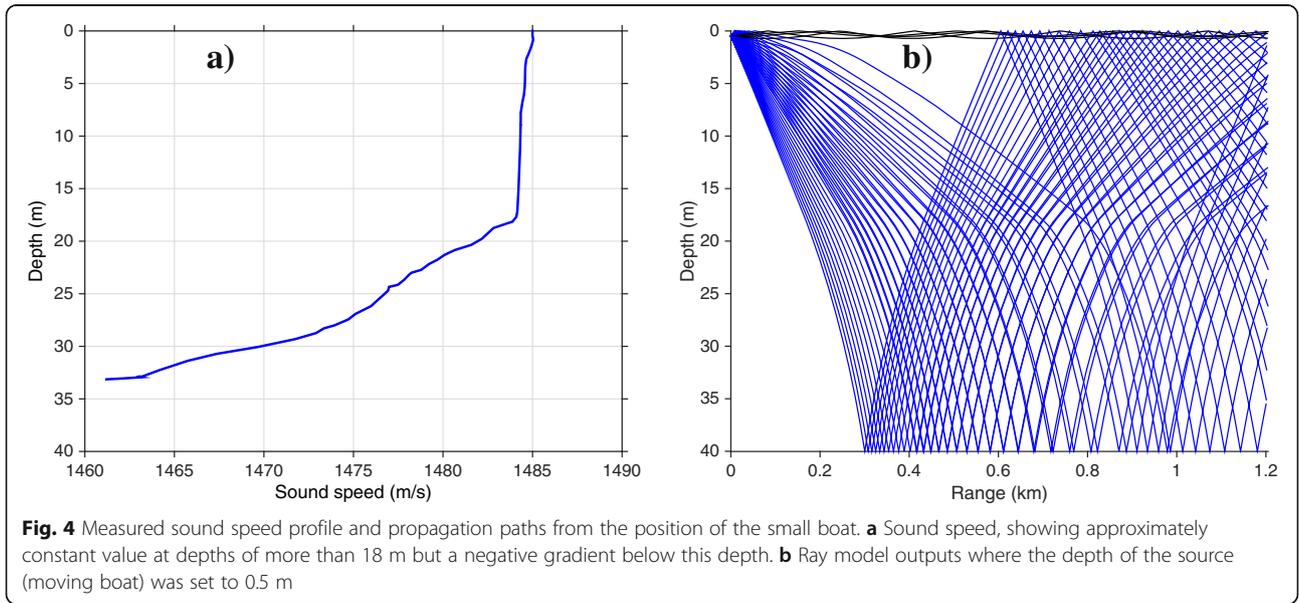
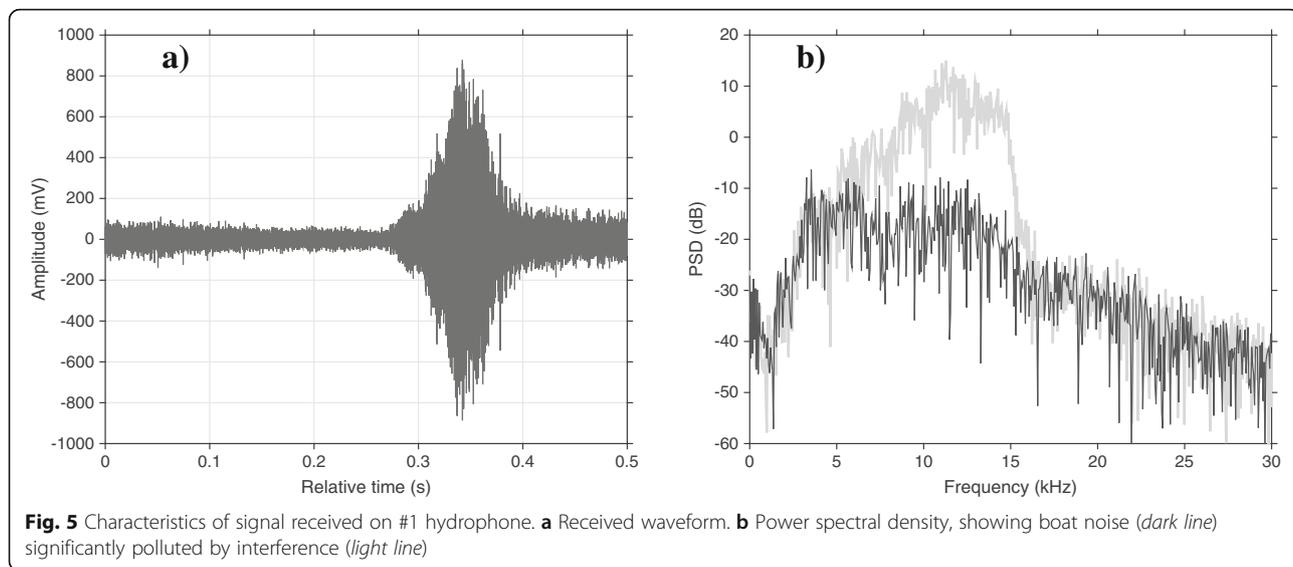


Fig. 4 Measured sound speed profile and propagation paths from the position of the small boat. **a** Sound speed, showing approximately constant value at depths of more than 18 m but a negative gradient below this depth. **b** Ray model outputs where the depth of the source (moving boat) was set to 0.5 m



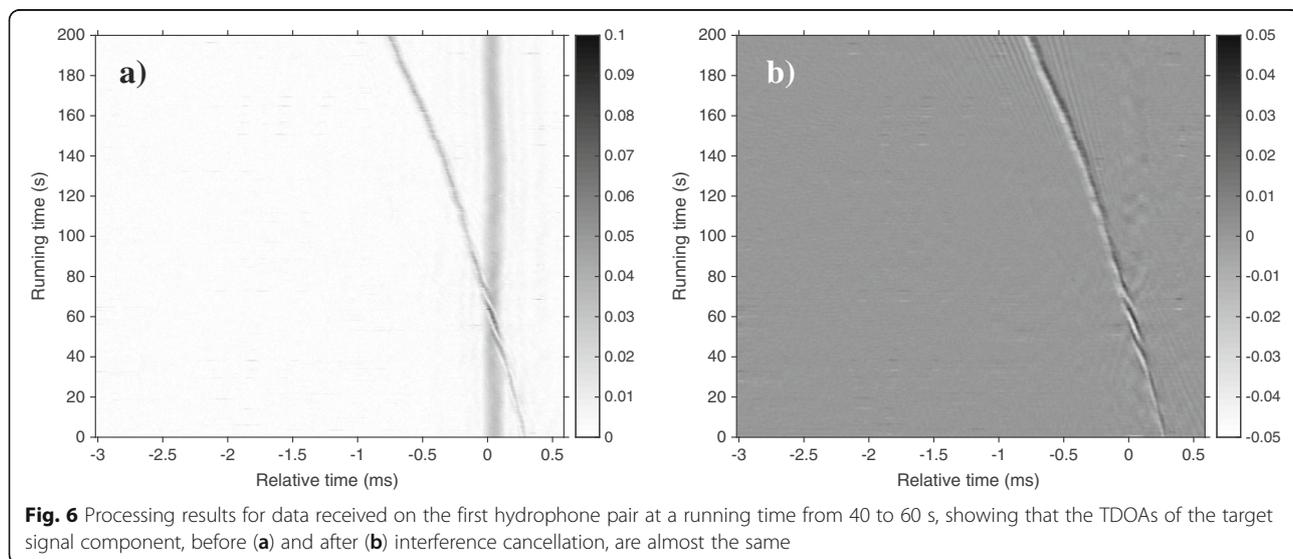
the received data on the first pair of hydrophones (#1 and #2) are shown in Fig. 6a. The peaks of the cross-correlation output of the boat noise are evident, owing to the spectral normalization of the interference by PHAT processing. The proposed interference cancellation method was then applied to the PHAT output, where parameter $M = 400$ and pulses 1–400 were selected for P_1 , whereas pulses 11–410 were selected for P_2 . The interference cancellation results in Fig. 6b show that the interference was well suppressed throughout the entire running time, particularly at the crossing event. The TDOAs are corresponding to the time delays of the maximum values of the rows of matrix \tilde{P} were finally determined, as shown in Fig. 7a. The result obtained by the PF method is shown in Fig. 7b for comparison. The PF method apparently tracked

the wrong target at the crossing, whereas the proposed method provides a satisfactory assessment of the TDOAs.

The localization process was then performed using the assessed TDOA for each of the three receiver pairs. The results for the proposed method throughout the entire running time are shown in Fig. 7c, where $\mu = 1$, showing that the boat traveled approximately along a straight line. By contrast, a portion of the results obtained using PF method is shown in Fig. 7d. Both methods have nearly the same localization results, with a difference not exceeding 20 m along the y direction.

4 Experiment on moving jamming source

In Section 3, the jamming source is almost motionless and cooperative. In actual multitarget localization,



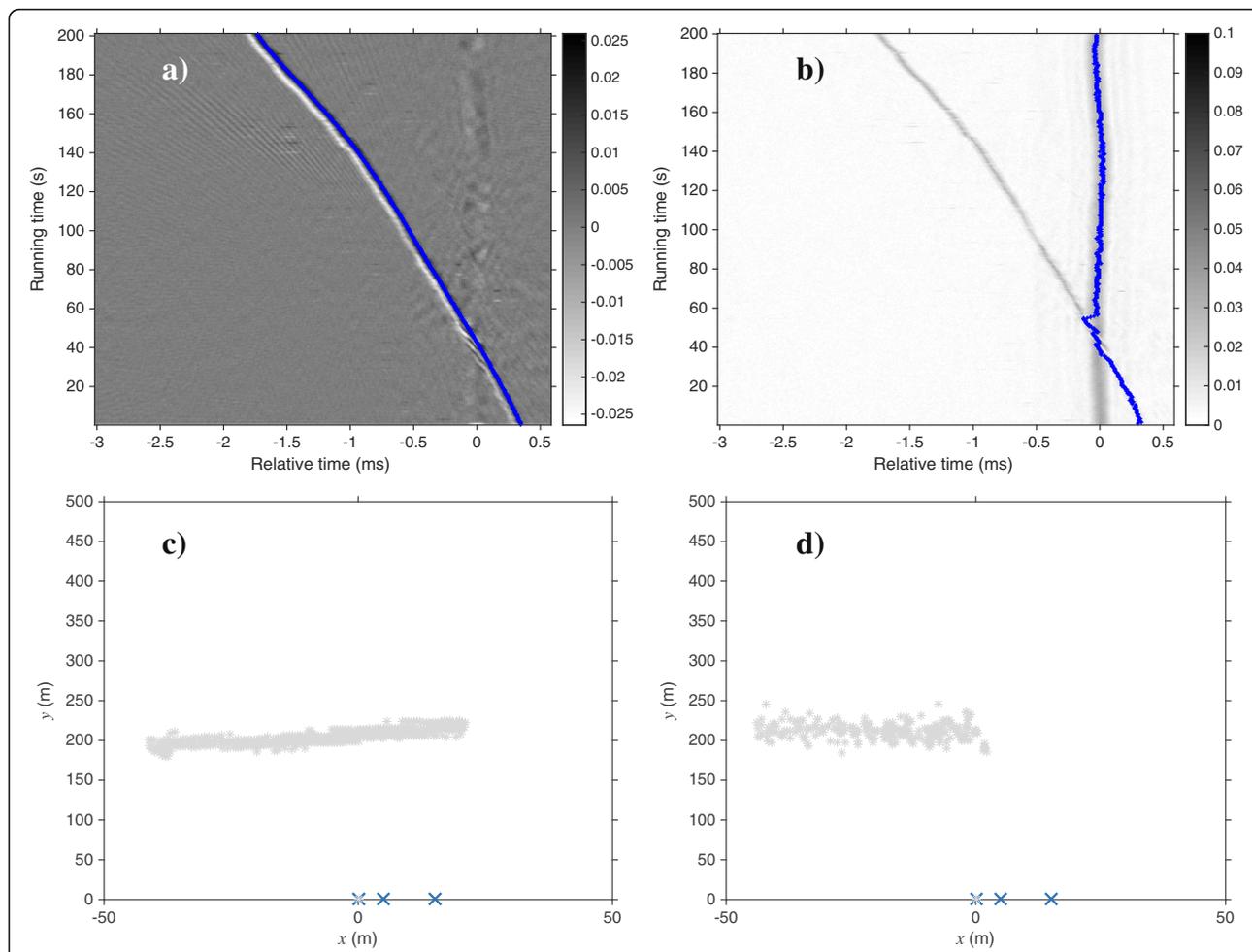


Fig. 7 TDOA estimation and localization results based on PHAT processing of the first pair of signals. **a** TDOA proposed method. **b** TDOA PF method (unavailable at the crossing event). **c** Localization proposed method. **d** Localization PF method (only the portion with the correct TDOAs is shown)

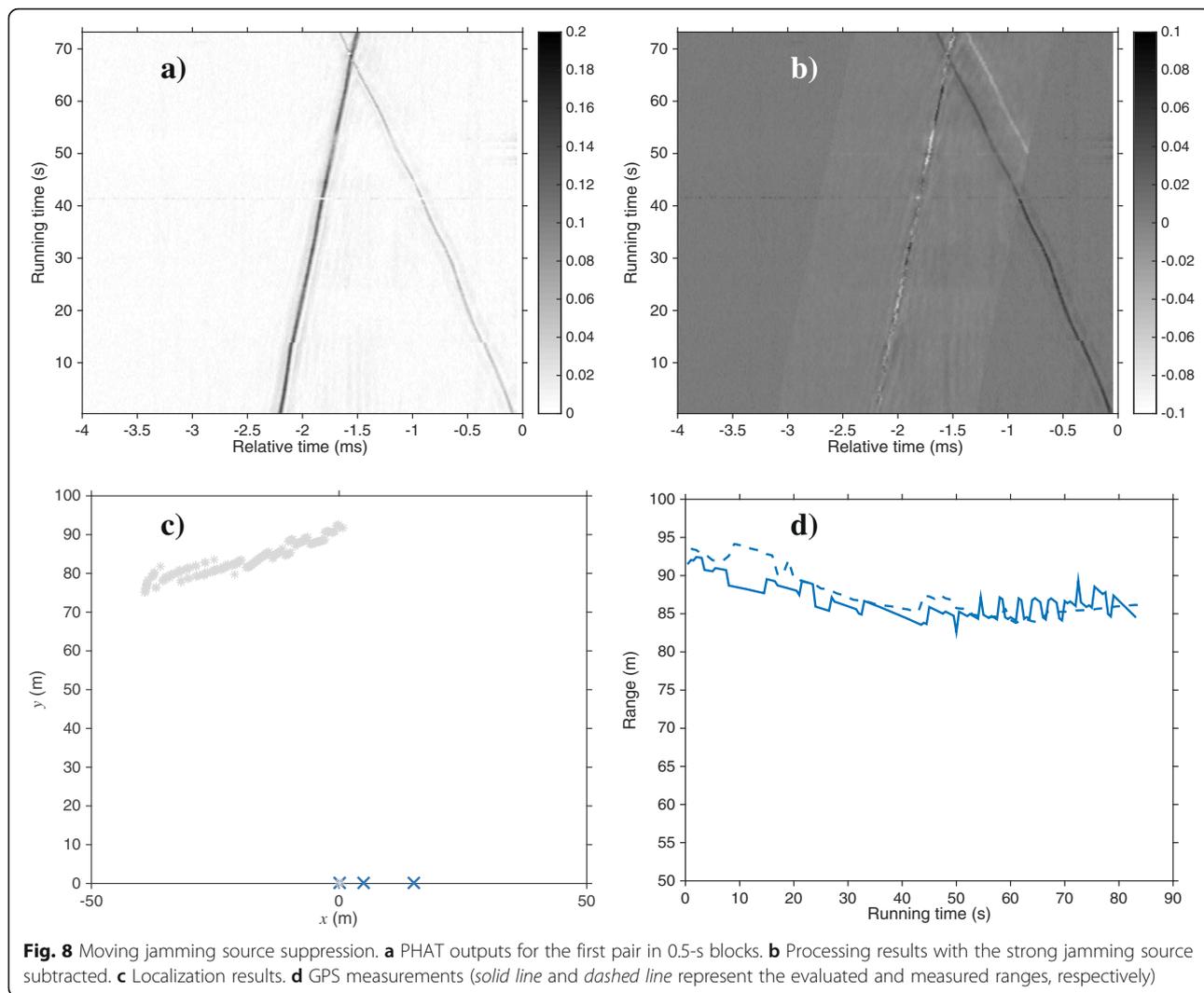
however, the jamming source may be moving as well as strong. Strong moving jamming sources could include a merchantman or military vessel. In this scenario, the same problem prevails in the TDOA estimation. Given that the trajectory does not exhibit a line on the PHAT outputs, additional preprocessing is required for TDOA estimation used in localization. When PHAT processing is performed, the strongest peaks from the outputs should be aligned and the deviations stored in memory. Subsequently, the interference cancellation method is performed by block processing. Afterward, the TDOA of the target signal is connected using the recorded deviations.

As an example, two moving sources are present in this experiment: one is the same boat whose trajectory is known based on its GPS, and the other is an unknown boat moving at a high speed. In processing, the second boat is considered the jamming source. The recorded waveforms are prefiltered the same as in Section 3 and processed in 0.5-s blocks. The two correlation outputs are displayed in Fig. 8a, corresponding to the jamming

source (dark curve) and target source (light curve). The relative delays of the jamming source indicate that it moves in the opposite direction of the target source. At a running time of approximately 68 s, the two sources are at the same position and thus have the same TDOA. Given the relative time delays of the interference alignment, interference cancellation is performed on the PHAT output, yielding the result shown in Fig. 8b. The strong moving jamming source is eliminated, whereas the target source is retained. Some portions of the interference are not well isolated because of variations in the jamming source when it moves, as mentioned in Section 2.2.

The relative time delays of the target source on the receiver pairs can then be obtained directly, even at a running time close to the crossing event. Finally, the localization results are obtained, as shown in Fig. 8c, which agrees well with the GPS measurements in Fig. 8d.

The Radon transform works well for line detection. When the signal-to-interference ratio is very weak, a weak variation in the PHAT output exists at the crossing



event, such that the target signal will be eliminated as well during the interference cancellation. Consequently, the trajectory of the target signal will be interrupted at the crossing event, causing a gap in the estimated time delays. Given that the wideband jamming source (moving boat noise) has a good correlation function, the interference has only a slight influence on the TDOA estimation in the experiment. Nevertheless, this influence is sufficient to show the efficacy of the proposed method. If the jamming signal does not have a sharp correlation peak, this method may be more applicable.

5 Conclusions

In passive localization, the target signal is significantly contaminated by strong interference. As a result, traditional localization methods may be ineffective. In this study, a hybrid method involving PHAT processing, interference cancellation, and position searching is proposed. By certain additional preprocessing of the PHAT

outputs, the interference can be adequately suppressed, allowing for good localization results in the preliminary experiments.

Although the experimental range is not the main concern of this study, the localization method can also achieve good performance at farther distances. A large system aperture is expected in that case, such as a long-baseline sensor array to achieve better localization. Furthermore, joint estimation is suggested for multiple localization systems when the number of receivers is more than three.

One possible application of this method is the monitoring of multiple moving acoustic sources with fixed hydrophones. A factor that is likely to impact the performance of this method is strong variation in the interference. This problem may be solved by applying a constant strength to the PHAT output setting over an appropriate threshold. In the experimental investigation, only direct arrival signals are considered. However, multipath propagation may not be negligible at longer

