# OBSrange: A new tool for the precise remote location of Ocean Bottom Seismometers

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10 Abstract

As the marine geophysics community continues to instrument the seafloor, data quality and instrument re-11 coverability rely on accurate estimates of instrument locations on the ocean floor. However, freely available 12 software for this estimation does not currently exist. We present OBSrange, an open-source tool for ro-13 bustly locating ocean bottom seismometers (OBS) on the seafloor using acoustic transponder ranging data. Available in both MATLAB and Python, the algorithm inverts two-way acoustic ranging travel-time data 15 for instrument location, depth, and average water velocity and accounts for ship velocity, region-specific ray-bending, and a static GPS-transponder offset. The tool provides comprehensive estimates of model pa-17 rameter uncertainty including bootstrap uncertainties for all four parameters as well as an F-test grid search providing a 3D confidence ellipsoid around each station. We validate the tool using a synthetic travel-time 19 dataset and find average horizontal location errors on the order of ~4 m for an instrument at 5000 m depth. An exploration of survey geometries shows that the so-called "PACMAN" style survey pattern of radius 21 1 Nm with long ship-tracks towards and away from the instrument is optimal for resolving all parameters, 22 including the trade-off between instrument depth and water velocity. A survey radius of performs best at recovering horizontal instrument positions on the seafloor. Optimal survey size for resolving instrument location depends on water depth and desired precision and nominally ranges from 0.75-Nm is sufficient for accurate horizontal locations (to within 1 Nm at 5000 m water depth to ~5 m) with diminishing improvement as radius is increased. Depth and water 0.25 Nm at 500 m depth. Radial tows toward and away from the instrument are crucial for resolving the depth-water velocity trade offperfectly for, and thus Circle surveys, and surveys should be avoided. Line surveys, common for active source experiments, are unable to resolve the instrument location orthogonal to the survey line; if possible, both geometries should be avoided. We apply our tool to the 2018 Young Pacific ORCA deployment in the south Pacific producing 31 an average RMS data misfit of 1.96 ms with an average instrument drift of  $\sim$ 170 m. Observed drifts reveal a clockwise-rotation pattern of  $\sim$ 500 km diameter that resembles a cyclonic mesoscale gyre observed in the geostrophic flow field, suggesting a potential use for application of accurate instrument drifts as a novel proxy for depth-integrated flow through the water column.

#### 36 1 Introduction

The last two decades have seen a sea change in the longevity, distribution, and sophistication of temporary ocean bottom seismic installations. The proliferation of ocean bottom seismometer (OBS) deployments has opened up new possibilities for understanding the ocean basins (e.g. Lin et al., 2016, Takeo et al., 2016), continental margins (e.g. Eilon and Abers, 2017, Hawley et al., 2016, Janiszewski and Abers, 2015, Lynner and Bodmer, 2017), and even inland submerged environments (e.g. Accardo et al., 2017). However, even straightforward OBS installations present several unique challenges. Foremost among these is the inability to directly measure the location of the sensor at the seafloor. Precise knowledge of station location is essential for almost all seismological analysis. While the location of the ship is known at the time of deployment, OBS instruments may drift by up to hundreds of meters from this point due to ocean currents and a non-streamlined basal profile. For broadband OBS deployments, it has long been accepted practice to conduct an acoustic survey in order to triangulate the position of the instrument (i.e., Creager and Dorman, 1982). To accomplish this, ships send non-directional acoustic pulses into the water column. These are received by the OBS transponder which sends its own acoustic pulse in response. The time elapsed between the ship sending and receiving acoustic pulses is proportional to distance, which (for known ship location) may be used to locate the instrument. It is common for this analysis to be conducted by technicians at OBS instrument centers and provided latterly to PIs and data centers as station metadata. Some codes are proprietary intellectual 53 property of the instrument centers, and others are available for a license fee. However, standard station location algorithms to date are lacking in certain respects. Water sound speed and even water depth are often assumed a priori. Commonly, no correction is made corrections are made to account for the movement of the ship between sending and receiving, the relative offset between GPS and transponder location, or ray bending due to refraction through the water column. Robust uncertainty analysis, which would allow practitioners to gauge potential location errors, is either not conducted or communicated. We present an open-source OBS locator software for use by the marine geophysics community that can account for ship velocity, GPS-transponder offset, and ray bending. Our efficient inversion algorithm provides station location in three dimensions and solves for depth-averaged water sound speed. We use statistical tools to provide robust uncertainties on the instrument location as well as water velocity. The code is available in both MATLAB and Python to promote accessibility (see Data and Resources). In this article, we present the theory behind our algorithm, validate the inversion using synthetic testing, compare its accuracy with a

previous tool, and demonstrate its utility with real data. Finally, we use the tool to carefully test a variety

of survey patterns and identify an optimal geometry-identifying optimal geometries for accurately recovering
all model parameters, including the trade-off between depth and water velocity. Finally, we demonstrate its
utility with real data from the 2018 Young Pacific ORCA (OBS Research into Convecting Asthenosphere)
Experiment (Gaherty et al., 2018), revealing a network-wide clockwise-rotation that resembles a cyclonic
mesoscale gyre. This study represents a first open-source tool for accurately locating instruments on the
seafloor as well as a thorough investigation of survey geometry geometries that will serve to inform future
OBS deployments.

# 75 2 Algorithm

#### $_{76}$ 2.1 The forward problem

Here we outline the forward and inverse problems for inverting acoustic ranging data for instrument location on the seafloor following Creager and Dorman (1982). We wish to locate an instrument which rests at unknown position and depth on the ocean floor (Figure 1). Taking the drop coordinates as the center of 79 a Cartesian coordinate system in which x is positive towards East, y is positive towards North, and z is positive upwards from the sea surface, the instrument lies at location (x, y, z). We account for Earth's ellipticity when converting between geodetic and local ENU coordinates using the WGS84 reference ellipsoid (Agency and Mapping, 2000) and standard coordinate transformations (i.e., Hoffmann-Wellenhof et al., 2001). 83 The time taken for an acoustic pulse to travel from the ship's transponder to the instrument and back is a function of the sound speed in water  $(V_P)$ , and the location of the ship, as well as the "turn-around time"  $(\tau)$ that corresponds to the (fixed) processing time between the OBS transducer receiving a ping and sending its response. If the shipboard transponder and GPS are not co-located and their relative positions are known, a heading-dependent correction is applied to the GPS position such that they do coincide. In detail, we can account for the possibility that if the ship is under way, its position changes between sending and receiving pings. Thus, the total travel time, T, is:

$$T = \frac{r_s + r_r}{V_P} + \tau \,, \tag{1}$$

91 where for a straight-ray approximation,

$$r_s = \sqrt{(x_s - x)^2 + (y_s - y)^2 + z^2}$$
(2)

$$r_r = \sqrt{(x_r - x)^2 + (y_r - y)^2 + z^2}.$$
 (3)

Subscript "s" indicates the ship's transponder sending a ping and "r" indicates the ship's transponder receiving the OBS's response. These positions are related by the velocity ( $\mathbf{u} = (u_x, u_y, 0)$ ) of the ship, which is estimated from the survey data by differencing neighboring survey points:

$$\begin{pmatrix} x_s \\ y_s \\ 0 \end{pmatrix} = \begin{pmatrix} x_r \\ y_r \\ 0 \end{pmatrix} - T \begin{pmatrix} u_x \\ u_y \\ 0 \end{pmatrix}. \tag{4}$$

It follows that, to a close approximation,

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$$r_s \approx r_r - (\mathbf{u} \cdot \hat{\mathbf{r}}_r) T$$
  
=  $r_r - \delta r$ , (5)

related to a change in the ship's position by computing a correction time,  $\delta T = \delta r/V_P$ . Substituting this into 98  $\delta T_{\text{dopp}} = \delta r/V_P$ , which will be positive if GPS coordinates correspond to the receive location and negative 99 if they correspond to the send location. 100 We can also account for ray-bending due to refraction through the water column by calculating an 101 additional correction time,  $\delta T_{\rm bend}$ , that is the difference in two-way travel time between the straight-ray 102 approximation calculated through the depth-averaged water column and the value calculated by ray tracing 103 through a 1D sound-speed profile. A velocity profile is selected from the 2009 World Ocean Atlas database 104 decadal averages (see Data and Resources) for the appropriate survey location and month (determined by 105 GPS location and time stamps in the data), or the user can specify their own. Rays are traced out to 106 4 km offset for  $\pm 200$  m about the nominal drop depth, and an evenly spaced mesh of  $\delta T_{\rm bend}$  corrections is 107 constructed. The corrections are then added to the raw travel times for the appropriate depth and offset 108 to convert from bent to straight rays. This correction is most significant for stations in shallow water (less 109 than  $\sim 1000$  m) at long offsets, in particular if there is a sharp velocity change at the thermocline, but is 110 negligible (<1 ms) for deeper instruments and at shorter offsets (see Figures S1-S2, available in the electronic supplement to this article). With the addition of these corrections to equation (1), we have the two-way 112 travel time is given by:

where  $\hat{\mathbf{r}}_r$  is the unit-vector pointing from the instrument to the ship at the time of receiving. If we know

the distance  $\delta r$  By calculating the distance  $\delta r = (\mathbf{u} \cdot \hat{\mathbf{r}}_r) T$ , we can account for the send-receive timing offset

$$T + \delta T = \frac{2r_r}{V_P} + \tau_{::},\tag{6}$$

#### 2.2The inverse problem 115

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If the ship location and travel times between the OBS and ship are known, but the position of the OBS 116 is not, equation (6) can be thought of as a non-linear inverse problem, of the form  $\mathbf{d} = g(\mathbf{m})$ , where  $g(\mathbf{m})$ 117 represents the forward-model. In practice, a limited survey radius makes it difficult to uniquely solve for z, 118  $V_P$ , and  $\tau$ . Since turn-around time is a parameter provided by the transponder manufacturer, we choose 119 to fix  $\tau$  in order to reduce unnecessary trade-offs in the inversion and more precisely resolve depth and 120 water velocity. Thus, the model contains four parameters:  $\mathbf{m} = \{x, y, z, V_P\}$ . The data,  $\mathbf{d}$ , are a vector 121 of corrected travel times,  $T + \delta T$  (note that  $\delta T$  is itself a function of **m**; this will be adjusted iteratively). 122 Uncorrected travel-time residuals predicted from the starting model with magnitude >500 ms are considered 123 anomalous and are removed before beginning the inversion. This type of problem can be solved iteratively using Newton's method (Menke, 2018): 125

$$\mathbf{m}_{k+1} = \mathbf{m}_k + \left[ \mathbf{G}^{\mathrm{T}} \mathbf{G} \right]^{-1} \mathbf{G}^{\mathrm{T}} \left( \mathbf{d} - g(\mathbf{m}_k) \right) , \qquad (7)$$

where **G** is a matrix of partial derivatives:  $G_{ij} = \partial d_i/\partial m_j$ , as follows:

$$\frac{\partial d_i}{\partial x} = -\frac{2(x_i - x)}{V_P \, r_i} \tag{8}$$

$$\frac{\partial d_i}{\partial x} = -\frac{2(x_i - x)}{V_P r_i}$$

$$\frac{\partial d_i}{\partial y} = -\frac{2(y_i - y)}{V_P r_i}$$
(8)

$$\frac{\partial d_i}{\partial z} = \frac{2z}{V_P r_i} \tag{10}$$

$$\frac{\partial d_i}{\partial V_P} = -\frac{2\,r_i}{V_P^2}\,. \tag{11}$$

We use the drop coordinates and water depth (if available from multibeam) as a starting model, along 127 with  $V_P = 1500$  m/s. We fix  $\tau = 13$  ms, which is the default value for all ITC and ORE Offshore and 128 EdgeTech transponders and underwater communications transducers (Ernest Aaron, pers. comm.). There 129 is some degree of trade-off between the water depth and the water velocity. Simplistically, if all survey measurements are made at a constant distance from the station (e.g., if the survey is a circle centered on 131 the station) then these parameters co-vary perfectly. As a result, the inverse problem is ill-posed and, like all mixed-determined problems, requires regularization. We damp perturbations in  $V_P$ , which is not likely 133

to vary substantially from 1500 m/s, and implement global norm damping to stabilize the inversion:

$$\mathbf{F} = \begin{bmatrix} \mathbf{G} \\ \mathbf{H} \\ \epsilon^{1/2} \mathbf{I} \end{bmatrix}, \qquad \mathbf{f} = \begin{bmatrix} \mathbf{d} - g(\mathbf{m}) \\ \mathbf{0} \\ \mathbf{0} \end{bmatrix}, \qquad (12)$$

where **I** is the  $4\times4$  identity matrix,  $\epsilon = 10^{-10}$ ,  $\mathbf{H} = (0, 0, 0, \gamma_{V_P})$ ,  $\mathbf{H} = \operatorname{diag}(\gamma_x, \gamma_y, \gamma_z, \gamma_{V_P})$ ,  $\gamma_x = \gamma_y = \gamma_z = 0$ , and  $\gamma_{V_P} = 5\times10^{-8}$ . These values for the damping parameters were determined by trial and error and are the defaults in the code. They have been tested on many different survey geometries, and thus, should require very little tuning for most applications. The equation to be solved becomes:

$$\mathbf{m}_{k+1} = \mathbf{m}_k + \left[ \mathbf{F}^{\mathrm{T}} \mathbf{F} \right]^{-1} \mathbf{F}^{\mathrm{T}} \mathbf{f} . \tag{13}$$

This equation is solved iteratively, until the root-mean-squared (RMS) of the misfit, e, (where  $e = T + \delta T - g(\mathbf{m})$ ) decreases by less than 0.1 ms compared to the previous iteration. This criterion is typically reached after  $\sim 4$  iterations.

#### 2.3 Errors and uncertainty

In order to estimate the uncertainty in our model, we perform 1,000 bootstrap iterations on survey travel-143 time data with a balanced resampling approach (Davison et al., 1986). In each iteration the algorithm inverts a random sub-sample of the true data set, with the constraint that all data points are eventually sampled 145 an equal number of times. This approach reduces variance in bias and achieves robust uncertainty estimates in fewer iterations compared to traditional uniform sampling approaches (Hung et al., 2011). Although 147 balanced resampling provides empirical probability distributions of possible model parameters, it does not 148 straightforwardly offer quantitative estimates of model uncertainty because the goodness of data fit for each run in the bootstrap iteration is ignored (that is, within each iteration, a model is found that best fits 150 the randomly sub-sampled dataset, but in the context of the full dataset, the fit and uncertainty of that 151 particular model may be relatively poor). For more statistically robust uncertainty estimates, we perform 152 a grid search over (x, y, z) within a region centered on the bootstrapped mean location,  $(x_{\text{best}}, y_{\text{best}}, z_{\text{best}})$ . For each perturbed location, (x', y', z'), we use an F-test to compare the norm of the data prediction error to 154 the minimum error, assuming they each have a  $\chi^2$  distribution. The effective number of degrees of freedom,  $\nu$  can be approximated as

$$\nu \approx N_f - \text{tr}(\mathbf{F}\mathbf{F}_{\text{inv}}), \tag{14}$$

where  $\mathbf{F}_{\text{inv}} = [\mathbf{F}^{\text{T}}\mathbf{F}]^{-1}\mathbf{F}^{\text{T}}$ ,  $N_f$  is the length of vector  $\mathbf{f}$ , and tr() denotes the trace. Using the F-test, we can evaluate the statistical probability of the true OBS location departing from our best-fitting location by a given value.

Some care is required in implementing this grid search. Since z covaries with  $V_P$ , varying z quickly leads to large errors in data prediction as  $|z'-z_{\text{best}}|$  increases if one holds  $V_P$  fixed. As a result, it appears as if the gradient in the error surface is very sharp in the z direction, implying this parameter is very well resolved; in fact, the opposite is true. We find the empirical covariance of z and  $V_P$  by performing principal component analysis on the bootstrap model solutions. We then use the largest eigenvector to project perturbations in z within the grid search onto  $v_P$ , adjusting velocity appropriately as we progress through the grid search.

#### <sup>66</sup> 2.4 Model resolution and trade-offs

In order to quantitatively compare various survey configurations and assess their ability to recover the true model parameters, we calculate the model resolution,  $\mathbf{R}$ , and correlation,  $\mathbf{C}$ , matrices. The  $M \times M$  model resolution matrix is given by (Menke, 2018):

$$\mathbf{R} = \mathbf{G}_{inv}\mathbf{G}, \tag{15}$$

where  $\mathbf{G}_{\text{inv}} = \left[\mathbf{G}^{\text{T}}\mathbf{G} + \mathbf{H}^{\text{T}}\mathbf{H} + \epsilon \mathbf{I}\right]^{-1}\mathbf{G}^{\text{T}}$ . Since the resolution matrix depends only on the data kernel and applied damping and is thus independent of the data themselves, it reflects strongly the chosen survey geometry. Each model parameter is independently resolved when  $\mathbf{R} = \mathbf{I}$ . Since perfect resolution occurs when  $\mathbf{R}$  is equal to the identity matrix, off-diagonal elements (or "spread") indicate poor model resolution and trade-offs between the respective parameters. The spread of the model resolution matrix is defined as the squared  $L_2$  norm of the difference between  $\mathbf{R}$  and the identity matrix (*Menke*, 2018):

spread(**R**) = 
$$\sum_{i=1}^{M} \sum_{j=1}^{M} [R_{ij} - \delta_{ij}]^2$$
, (16)

where  $\delta_{ij}$  is the Dirac delta function. Therefore, model resolution is perfect when spread( $\mathbf{R}$ ) = 0.

The model correlation matrix (or unit covariance matrix),  $\mathbf{C}$ , describes the mapping of error between model parameters. Given the covariance matrix  $\mathbf{\Sigma}_{\mathrm{m}} = \mathbf{G}_{\mathrm{inv}} \mathbf{G}_{\mathrm{inv}}^{\mathrm{T}}$ , the correlation matrix is defined as:

$$\mathbf{C} = \mathbf{D}^{-1} \mathbf{\Sigma}_{\mathbf{m}} \mathbf{D}^{-1} \,, \tag{17}$$

where  $\mathbf{D} = \operatorname{diag}(\mathbf{\Sigma}_{\mathrm{m}})^{1/2}$  is the diagonal matrix of model parameter standard deviations. The off diagonal elements of this unitless matrix indicate how model parameters trade off with one another in the inversion,

with negative numbers indicating negatively correlated parameters and vice versa.

### 182 3 Results

We summarize the results of synthetic testing and application to a real data set in order to demonstrate
the robust features of *OBSrange*. All synthetic tests shown in this section were carried out at 5000 m depth
unless noted otherwise. This depth is similar to the average depth of the Young Pacific ORCA Experiment,
where the tool is applied in section 3.4, allowing for easier comparison. Furthermore, the magnitude of
uncertainties generally decrease for shallow water (see Figures S7–S8, available in the electronic supplement
to this article), and therefore, uncertainties reported here represent upper bounds for the algorithm.

#### 3.1 Demonstration on synthetic data

We validated our algorithm by checking that it correctly recovers the (known) location of synthetic test 190 stations. Synthetic two-way travel times were computed by interpolating the ship's position (traveling at an average velocity of 8 kn) within a fixed survey pattern at one-minute intervals, sending straight-line rays to 192 the instrument and back, and adding the turn-around time. This travel time includes the change in ship's 193 position between sending and receiving; since the position of the ship at the time it receives the acoustic 194 pulse is itself dependent on the travel time, in constructing the synthetic dataset we iterated on this value 195 until the time and position converged to give an error of  $< 10^{-6}$  s. Only the location two-way travel time, ship location, and absolute time at the moment the ship receives the acoustic pulse was were recorded for 197 the inversion, mimicking data obtained during real surveys using equipment such as an EdgeTech deck box. 198 We then added Gaussian random noise to the resultant travel times using a standard deviation of 4 ms, to 199 account for measurement noise, errors in ship GPS location, and local changes in water velocity. Lastly, we randomly dropped out  $\sim 20\%$  of the travel time data points, simulating the occasional null return from the 201 acoustic survey. This testing procedure was designed to mimic the idiosyncrasies of real acoustic surveys as 202 closely as possible. 203 Figure 2 shows the result of an inversion at a single station at 5000 m depth using a 1 Nm radius 204

Figure 2 shows the result of an inversion at a single station at 5000 m depth using a 1 Nm radius

"PACMAN" survey geometry. For this inversion, we included a the correction for a Doppler shift introduced
by the ship's motion, estimating ship velocity from the timing and location of survey points. The inversion
was successful in locating the OBS station: the estimated location is 3.02-3.0 m from the the true location
(Figure 2). This misfit is extremely small in the context of ~320 m of drift, a survey radius of ~1800 m

(1 Nm), and a water depth of ~5300 m. Moreover, the true location falls well within the uncertainty bounds
estimated from the F-test and the bootstrap analysis.

In order to obtain statistics on the general quality of the synthetic recovery, we performed this test for 211 10,000 synthetic OBS stations, as follows: For each iteration, a synthetic station location was determined relative to a fixed drop point by drawing x- and y-drifts from zero-centered Gaussian distributions with 213 standard deviations of 100 m (only in rare cases are stations thought to drift further than  $\sim 200$  m). The depth, turn-around time, and average water velocity were similarly randomly selected, with mean values 215 of 5000 m, 13 ms, and 1500 m/s and standard deviations of 50 m, 3 ms, and 10 m/s, respectively. The turn-around time is set to 14 ms and is perfectly accounted for. For tests of the basic location algorithm, we 217 held the survey geometry constant, using the PACMAN configuration with a radius of 1 Nm (see Section 3.3). 218 The results of these tests show that on average our inversion is highly successful in correctly locating 219 the OBS stations. The mean location errors in the x-, y-, and z-directions were 0.038 m, 0.152 m, and 220 -0.599 m respectively, demonstrating there was no systematic bias in the locations. The mean error in 221 water velocity was indistinguishable from zero, showing that its estimation was also not biased. The mean 222 absolute horizontal location error was  $\frac{2.31}{2.3}$  m, with a standard deviation of  $\frac{1.22}{2.2}$  m. 95% of the absolute horizontal station location errors were less than 4.58 4.6 m. There was no relationship observed 224 between station drift (i.e., i.e., the distance between the synthetic OBS station and the drop point) and the 225 location error, indicating that as long as stations settle within the survey bounds they will be well located. A corollary to this observation is that location estimates should not be biased by incorrectly recorded drop 227 locations. 228 We observed a strong trade-off between water velocity and depth, which was responsible for the somewhat 229 larger standard error in station depth estimates, which was 9.6 m. This uncertainty is likely of negligible 230

We observed a strong trade-off between water velocity and depth, which was responsible for the somewhat larger standard error in station depth estimates, which was 9.6 m. This uncertainty is likely of negligible concern for most OBS practitioners, but if precise depths are important then a survey geometry that includes more tracks towards and away from the station would be preferable (in addition to verification using acoustic echo-sounders that implement precise water-velocity profiles from XBT data ).

#### 3.2 Application to Pacific Array deployment

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We applied the location algorithm to acoustic surveys carried out during the Young Pacific ORCA (OBS
Research into Convecting Asthenosphere) deployment in the central Pacific ocean during April and May of
2018 (Gaherty et al., 2018). The OBS array comprised 30 SIO broadband instruments each equipped with
a Model ITC-3013 transponder and deployed from the R/V Kilo Moana in water depths of ~4400-4800 m.
Acoustic surveys were carried out using an EdgeTech 8011M Acoustic Transceiver command and ranging
unit, attached to a hull-mounted 12 kHz transducer. The relatively calm seas allowed for ideal survey
geometry at almost all sites, with a ship speed of <8 knots at a maximum radius of ~1.3 Nm.

An example station inversion, as well as the graphical outputs of the location software, is shown in 242 Figures 6-8. Ship velocity is estimated from the survey data by differencing neighboring survey points. In theory, this could be used to correct Doppler shifts (Figure 6e) in travel time (as in the synthetic tests), but 244 we found that this correction did not substantially improve data fit for real stations and so did not apply it to this data set, although it is included as an option in the location codes. The small RMS data misfit of 246 ~1.6 ms attests to the quality of the survey measurements and the appropriateness of our relatively simple location algorithm (Figure 6d). The southwestwards drift of ~340 m (Figure 7) demonstrates that ocean 248 currents can substantially displace the final OBS location from their surface drop point. The F-test 95% 249 confidence bounds are 5 6 m in the horizontal directions and 10 12 m in depth (Figure 8). an accurate 250 GPS-transponder offset correction). 251

The 30 stations in this array drifted an average distance of 170 m. The mean data RMS misfit was 1.96 ms and the estimated 95th percentile horizontal location error based on the bootstrap analysis was 1.13 m. The water depth estimated by the inversion was systematically shallower than that measured using the shipboard multibeam instrument, differing by an average value of 18.6 m. Assuming the multibeam depths, which are computed using a water sound speed profile that is validated daily by XBT measurements, are correct, this discrepancy indicates that the inversion systematically overestimates sound speed slightly.

Without accurate seafloor corroboration from an ROV, it is not possible to directly verify the locations of stations within the Pacific ORCA array. However, we obtain indirect support for the success of the location algorithm by considering the drift of all stations within this array (Figure 9). Taken together, the direction and magnitude of drift depicts a pattern of clockwise rotation with a minimum diameter of ~500 km. This pattern is consistent with a meso-scale cyclonic gyre, with a direction, location, and approximate size that is consonant with large-scale patterns of geostrophic flow observed in this location roughly within the time frame of the deployment (see Figure S1, available in the electronic supplement to this article). The fact that we are able to discern this pattern from our estimated locations is a testament to the accuracy of the OBSrange algorithm. This observation also raises the intriguing possibility of using OBS instruments as adhoe depth-integrated flow meters for the oceans.

#### 3.2 Comparison to previous tools

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We compared our location algorithm with a tool developed by engineers at Scripps Institution of Oceanography (SIO) that has previously been is commonly used to locate OBS on the seafloor. This unpublished tool, hereafter referred to as SIOgs, performs a grid search in x-y holding z fixed at the reported drop-point depth and assuming a water velocity of 1500 m/s and turn-around time of  $\frac{13}{14}$  ms. The grid search begins with grid cells of  $100\times100$  m and iteratively reduces their size to  $0.1\times0.1$  m. In contrast to our algorithm, SIOgs does not account for: 1) the  $\delta T$  (Doppler) correction Doppler correction ( $\delta T_{\rm dopp}$ ) due to the changing ship position between sending and receiving, 2) the ellipsoidal shape of the Earth when converting between latitude longitude latitude-longitude and x-y, 3) a known GPS-transponder offset, 4) variations in z and  $V_p$ , and 45) automated identification and removal of low-quality travel-time data. Furthermore, SIOgs provides no information about uncertainty or resolution of model parameters.

To quantitatively compare our algorithm with SIOgs, as well as the importance of the  $\frac{4-5}{2}$  additional 279 features that our algorithm includes, we performed 8-9 separate inversions of a synthetic dataset for a 280 PACMAN survey geometry with 1 Nm radius and 4 ms of Gaussian noise added to the travel-time data 281 (Figure 3). For the synthetic experiment, the instrument drifted 447 m from the drop point, settling to 282 5050 m depth with a water velocity of 1520 m/s and turn-around time of 14 ms. Relative to the GPS, the 283 transponder was located 10 m closer to the ship's bow and 10 m further starboard (a maximum offset of 284 ~14 m). We inverted using the complete OBSrange algorithm (inversion 1 in Figure 3) as well as several variants where parameters were damped or removed to assess their importance; details of the inversions 286 including the starting models are given in table 1. Our algorithm estimated the horizontal position of the 287 instrument to within  $\sim 1.5$  m of the true location with a mean data RMS misfit of 4.23.7 ms, while SIOgs 288 (inversion 8) located it ~42 m from the true position with an RMS of 22.819.7 ms, far beyond the 95% F-test 289 contour (Figure 3a). Our algorithm recovered the true depth and water velocity to within 53 m and 1 m/s 290 , respectively, even when assuming an incorrect turn-around time of 13 mson average, respectively. 291

The SIOgs tool was very susceptible to anomalous travel-time data, which are a common occurrence in real survey data and are thought to result from out-of-plane acoustic reflections or multiples of earlier pulses. Inversion SIOgs no QC (9) included a single anomalous travel-time measurement 20004000 ms from its true value, causing the station to be mislocated by  $\sim 130320$  m with a travel-time residual RMS of  $\sim 193383$  ms. We found that if several such erroneous travel-time data are included in the SIO inversion, a horizontal location misfit on the order of  $\sim 1000$  m can result. Although such outliers can be manually discarded, they could potentially be overlooked. As mentioned, our method includes a quality control step based on travel-time residuals of the starting location that removes such anomalous residuals with magnitudes > 500 ms (default value in the code).

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Inversions using our method OBSrange inversions that did not solve for z and/or  $V_p$  resulted in the largest instrument location errors. With depth held constant at 5000 m (Fix-Zinversion 6), the instrument was mislocated by  $\sim 8.57.5$  m and water velocity underestimated by  $\sim 14$  m/s. Similarly, with  $V_p$  held constant (Fix- $V_p$ inversion 5), the instrument was located  $\sim 911$  m from its true position, and the estimated depth was  $\sim 7072$  m too shallow. In the case where both depth and water velocity were held constant (XY-only inversion)

7), we observed a location misfit of  $\sim$ 40 m, similar to that of the SIOgs tool (8). The strong trade-off between depth and water velocity means that one cannot be confidently recovered without also solving for the other, and failing to solve for one (or both) results in larger location errors.

In addition to showing the full potential of OBSrange, we demonstrate the importance of accounting 309 for Earth's ellipsoidal shape when converting latitude and longitude to x-y (inversion 3). The travel-time 310 residuals of SIOgs (Figure 3b) display both a static shift from 0 ms as well as an azimuthal dependence. 311 The shift of approximately -20 ms is a combination of the incorrectly assumed station depth, water velocity, 312 and turn-around time and and water velocity and accounts for most of the data misfit. The azimuthal 313 variation observed in the travel-time residuals of SIOqs is due to both the incorrect horizontal location of 314 the instrument as well as the failure to account for Earth's ellipsoidal shape when converting from geographic 315 coordinates to x-y. Failing to account for the ellipsoid produces a 2-theta azimuthal pattern in the residuals that becomes increasingly strong as survey radius increases and at lower latitudes. For this synthetic test 317 with a survey radius of 1 Nm ( $\sim$ 1852 m) at 7.5 $\sim$ 6°S, the ellipsoid produced a  $\sim$ 10 m apparent maximum apparent horizontal shift to the northern and southern ship positions. The of  $\sim 10$  m (see Figures S3, available 319 in the electronic supplement to this article). The resulting 2-theta ellipsoid anomaly had a peak-to-peak 320 amplitude travel-time anomaly had an RMS of ~5.5 ms 2.2 ms with a mean of 1.3 ms, indicating that 321 failing to account for the ellipsoid leads to small biases that map directly into z and Vp. Correcting for this 322 anomaly slightly improved our the ability to accurately recover station depth and water velocity; however, 323 it did not significantly effect the the affect the horizontal location estimate, owing to the roughly symmetric 324 survey pattern—(i.e., the perturbation to travel times are nearly symmetric with respect to ship azimuth in 325 Figures S3-S4). For non-symmetric surveys, including those with a strong back-azimuthal variation in good 326 acoustic returns, the horizontal location bias that results horizontal location biases resulting from improper 327 ellipticity corrections is likely to be more significant. may be more significant. 328

Failing to account for the relative offset in shipboard GPS and transponder (with transponder located 329  $\sim$ 14 m from the GPS toward the front-right of the ship) leads to biased z and  $V_p$  estimates (inversion 330 4). Instrument depth and water velocity are underestimated by  $\sim 28$  m and  $\sim 8$  m/s, respectively. The 331 difference in transponder-to-instrument and GPS-to-instrument two-way travel times is nearly constant with 332 ship azimuth for the PACMAN configuration (see Figure S5, available in the electronic supplement to this 333 article) with a mean of  $\sim 3.4$  ms. This constant travel time offset is primarily mapped into z. Because the transponder is almost always further away than the GPS from the instrument, this results in a z estimate 335 that is too shallow. Similarly, if the transponder had been located at the back-left of the ship, then it would have been closer than the GPS to the instrument and z would be estimated too deep. This suggests that in 337 principle, the GPS-transponder offset could be solved for; however, in practice there is significant trade off between GPS-transponder offset, depth, and water velocity such that it would be difficult to resolve unless z and  $V_p$  are known. The horizontal uncertainties are still small ( $\sim 3$  m), even without this correction applied.

The "Doppler" corrections ( $\delta T - \delta T_{\text{dopp}}$  in equation (6)) applied to the two-way travel times provided 342 only a very small improvement to the estimated horizontal instrument locations ( $\sim 3.52.7$  m improvement 343 in mean horizontal location and  $\sim 2.52.0$  m reduction in  $r_{xy}$  RMS misfit). The see inversion 2). Because 344 this correction term is calculated from the ships radial velocity with respect to the instrument, it is small 345 (magnitudes < 1.6 ms) for the circular portions of the survey and relatively large ( $\sim 6$  ms) for the radial 346 segments. Only a small portion of the PACMAN survey occurs along the radial direction (Figure 2a) and 347 therefore, these corrections tend to have a small effect on model recovery. In practice, the effectiveness of 348 these corrections depend strongly on the accuracy precision of the shipboard GPS as well as its position relative to the acoustic receiver. Their accuracy also depends on the ability to reconstruct the ship 's radial 350 an accurate reconstruction of ship velocity, which can be difficult to achieve if large swaths of the survey fail to return soundings. 352

#### 3.3 Exploration of survey pattern geometries

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In order to evaluate which survey patterns are optimal for accurately locating instruments on the seafloor, 354 we conducted 17-19 synthetic surveys of varying geometry and size. For these tests, we attempted to mimic 355 real-world experimental uncertainty as closely as possible. Each parameter  $(x, y, z, V_p)$  was treated as a 356 Gaussian random variable with a predetermined mean and standard deviation (see Section 3.1 for means 357 and standard deviations). Additionally,  $\tau$  was varied with a mean value of 13 ms and standard deviation of 358 3 ms to simulate uncertainty in this assumed parameter. For each survey configuration, we applied the full 359 OBSrange algorithm (including corrections for Doppler and GPS-transponder offset) to 10,000 realizations drawn from these distributions in order to fully explore the limits of each survey type. The GPS-transponder 361 offset is the same as in the previous section (sim14 m). Synthetic data were calculated in the same way as in previous sections with  $\sim 20\%$  of the data points randomly removed. To further simulate realistic data 363 loss due to "shadowing" effects associated with topography obstructing the acoustic propagation path, we removed three sectors of data with random central azimuth and half-width standard deviation of 20° for 365 each realization (excluding *Line* surveys). All survey points <100 m from the drop point were retained. The 366 precise uncertainties and optimal survey sizes as determined in this section are specific to an average water 367 depth of 5000 m and scale down at shallower depths. Additional tests at 500 m and 2000 m average water 368 depth are shown in Figures S7–S8 in the electronic supplement and demonstrate that uncertainties generally decrease with decreasing water depth, and thus uncertainties stated in this section represent upper bounds for the algorithm.

The resulting RMS misfits for each model parameter and survey type are shown in Figure 4a-c. The 372 most well-resolved parameter for all survey types is the horizontal location of the instrument on the seafloor,  $r_{xy}$ . With the exception of Line and 1.5 Nm Circle surveys, all survey types resolve horizontal location to 374 within 10050 m. The *Line* surveys fail to resolve the instrument location along the direction orthogonal 375 to the ship track (RMS  $\sim$ 700 m) but succeed in resolving its location parallel to the line (RMS  $\sim$ 4 m). 376 This is also shown in plots of model resolution (Figure 5), where model parameter y is unresolved for a 377 ship track parallel to the x-direction. The PACMAN survey with radius greater than 0.75-1 Nm performs 378 (sim 9-12 km) and the 1 Nm *Diamond* survey perform best with horizontal RMS misfits of <54 m. Although 379 the PACMAN and Diamond surveys perform nearly equally well in our synthetic test, we prefer the former since its quasi-circular pattern results in a smaller Doppler correction (i.e., the ship remains at a nearly 381 constant radius from the instrument for most of the survey). The PACMAN survey recovers the horizontal location to within 10 m even for a survey with radius of 0.5 Nm. 383

Horizontal misfit decreases as survey radiusincreases instrument location is important for most applications, 384 and its precision increases with survey radius. However, larger surveys require more time at each site and 385 thus -are undesirable. The improvement in misfit with increasing survey radius size saturates at large ra-386 dius, and the this diminishing return can be quantified by a trade-off parameter,  $\lambda$ , defined as the product 387 between survey radius total survey length and horizontal misfit,  $\delta r_{xy}$  (Figure 4d). The ideal survey radius 388 corresponding size for recovering horizontal location corresponds to a minimum in this parameter occurs at. 389 which occurs at  $\sim 0.75$  Nm radius for the PACMAN survey geometry. The decrease in horizontal misfit at 390 5000 m depth. The saturation of horizontal misfit improvement with increasing radius for PACMAN surveys is given shown by  $\nabla r_{xy}$  in Figure 4e (see also Figure \$256, available in the electronic supplement to this 392 article). The rate of horizontal misfit improvement with increasing radius quickly approaches zero beyond a 393 radius of 0.75–1 Nm. 394

Depth and water velocity are best resolved by the PACMAN geometry with radius  $\geq 1$  Nm, recovering z essentially equally well resolved by most survey geometries with uncertainties of 10-15 m and  $V_P$  to within 10 m and 32-3 m/s, respectively. Due to strong trade offs, both depth and water velocity are poorly resolved by the , depending on survey size. This excludes Line, Circle as well as small (, and <0.5 Nm ) 0.75 Nm PACMAN surveys, which exhibit strong  $z-V_P$  trade-offs. This trade-off can be seen in the resolution and correlation matrices for the Circle (Figure 5). The radial portions of the PACMAN survey are key for successfully resolving the  $z-V_P$  trade-off. The Line survey poorly estimates depth (RMS  $\sim$ 200 m) but resolves water velocity to within  $\sim$ 5 m/s.

The The radial portions of the survey patterns are key for successfully resolving the z-V<sub>P</sub> trade-off, as
evidenced by the poor performance by Circle surveys. The 1 Nm radius Cross, Diamond, PACMAN survey
performs best overall, recovering horizontal position, depth, and water velocity to within 3 m, 10 m, and
Triangle survey geometries recover x, y, z, and V<sub>p</sub> similarly well and are comparable in performance to
PACMAN of radius-3 m/s, respectively.

### 408 3.4 Application to PacificArray deployment

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We applied the location algorithm to acoustic surveys carried out during the Young Pacific ORCA deployment 409 in the central Pacific ocean during April and May of 2018 (Gaherty et al., 2018). The QBS array comprised 410 30 SIO broadband instruments each equipped with a Model ITC-3013 transponder and deployed from the 411 R/V Kilo Moana in water depths of ~4400-4800 m. Acoustic surveys were carried out using an EdgeTech 412 8011M Acoustic Transceiver command and ranging unit, attached to a hull-mounted 12 kHz transducer. 413 A GPS-transponder offset is not known, and therefore no correction is applied. The relatively calm seas 414 allowed for ideal survey geometry at almost all sites, with a ship speed of ≤8 knots at a maximum radius of  $\sim 1.3 \text{ Nm}$ . 416 An example station inversion, as well as the graphical outputs of the location software, is shown in 417 Figures 6-8. Ship velocity is estimated from the survey data by differencing neighboring survey points. In 418 theory, this could be used to correct Doppler shifts (Figure 6c) in travel time (as in the synthetic tests), but 419 we found that this correction did not substantially improve data fit for real stations and so did not apply 420 it to this data set, although it is included as an option in the location codes. Furthermore, the ray-bending 421 corrections,  $\delta T_{\rm bend}$ , are negligible (<0.01 ms) at these water depths (see Figures S1–S2, available in the 422 electronic supplement to this article) and change the estimated horizontal location, depth, and water velocity 423 by less than 0.2 m, 0.5 0.75 Nm. Of these alternative survey configurations, the Diamond performs best. However, for the same radius of 1 Nm, the PACMAN survey yields the lowest RMS misfits, outperforming 425 all other geometries tested. Therefore, the PACMAN survey pattern with radius 0.75-1 Nm is the optimal geometry for accurately locating instruments on the seafloor. Even with  $\tau$  varying from the assumed value 427 of 13 ms, we were able to resolve all parameters with high precision, suggesting that the inversion is robust to uncertainties in turn-around time less than, m, and 0.3 m/s, respectively; thus, we choose not to apply 420 the ray-bending correction here. The small RMS data misfit of  $\sim 3$  ms. 1.6 ms attests to the quality of 430 the survey measurements and the appropriateness of our relatively simple location algorithm (Figure 6d). 431 The southwestwards drift of  $\sim 340$  m (Figure 7) demonstrates that ocean currents can substantially displace 432

the final OBS location from the surface drop point. The F-test 95% confidence bounds are 5-6 m in the

horizontal directions and 10–12 m in depth (Figure 8).

The 30 stations in this array drifted an average distance of 170 m. The mean data RMS misfit was 1.96
ms and the estimated 95th percentile horizontal location error based on the bootstrap analysis was 1.13
m. The water depth estimated by the inversion was systematically shallower than that measured using the
shipboard multibeam instrument, differing by an average value of 18.6 m. Assuming the multibeam depths,
which are computed using a water sound speed profile that is validated daily by XBT measurements, are
correct, this discrepancy indicates that the inversion systematically overestimates sound speed slightly (see
Section 4).

Without accurate seafloor corroboration from an ROV, it is not possible to directly verify the locations of 442 stations within the Pacific ORCA array. However, we obtain indirect support for the success of the location 443 algorithm by considering the drift of all stations within this array (Figure 9). Taken together, the direction and magnitude of drift depicts a pattern of clockwise rotation with a minimum diameter of  $\sim 500$  km. This 445 pattern is consistent with a meso-scale cyclonic gyre, with a direction, location, and approximate size that is consonant with large-scale patterns of geostrophic flow observed in this location roughly within the time 447 frame of the deployment (see Figure S10, available in the electronic supplement to this article). The fact 448 that we are able to discern this pattern from our estimated locations is a testament to the accuracy of the 449 OBS range algorithm. This observation also raises the intriguing possibility of using OBS instruments as ad 450 hoc depth-integrated flow meters for the oceans. 451

#### 452 4 Discussion

A reliable tool for accurately locating instruments on the seafloor is paramount, given the growing number of ocean bottom deployments. We present the first such open-source OBS locator code that is freely available to the scientific community. One of the primary features of the tool is its ability to provide robust confidence bounds on the 3D instrument position on the seafloor, which will inform recovery cruise efforts as well as provide accurate station metadata, which essentially all seismic analyses rely on. Furthermore, this article represents the first systematic exploration of survey geometries that we are aware of, which will help streamline future OBS deployments.

The At  $\sim 5000$  m water depth, most survey geometries recover depth and average sound speed velocity equally well. However, the *PACMAN* survey geometry with a radius of  $\sim 1$  Nm is optimal for accurately recovering sufficiently recovers all model parameters in the synthetic tests (Figure 4), including the depth-water velocity trade-off. Typical horizontal locations errors for such a configuration are on the order of z and  $V_p$ to within 10 m and 3 m/s, respectively, and horizontal location to within  $\sim 43$  m. A radius of 0.75 Nm

is sufficient for accurate horizontal location locations (to within  $\sim 54$  m) but with increased RMS error 465 uncertainty in instrument depth and water velocity. However, the smaller 0.75 Nm radius survey reduces the total survey duration by  $\sim 25\%$  compared to the 1 Nm survey ( $\sim 38$  min compared to  $\sim 50$  min for 467 an average ship velocity of 8 kn). If depth /and water velocity estimates are of lesser importance and/or time is limited, the smaller 0.75 Nm radius may be desirable. A survey radius larger than 1 Nm is likely 469 not warranted, requiring more ship time at each site for little improvement in misfit. Additionally, failed acoustic returns are more likely to occur at greater distances from the instrument, resulting in data gaps 471 which will negatively impact the inversion. Some ship captains prefer only to steam along straight lines; in 472 such cases, the *Diamond* survey with 1 Nm radius is a viable alternative, given its comparable performance 473 to the PACMAN geometry (Figure 4a-c). The radial legs of the survey where the ship travels toward and 474 away from the instrument are crucial for resolving the depth-velocity trade-off. For this reason, the Circle 475 configuration cannot independently resolve depth and water velocity and should be avoided. 476

The Line geometry warrants additional discussion as it is commonly used for locating OBS during 477 active-source experiments because it is often the fastest method, simplest pattern. Parallel to the line, the 478 instrument location is resolved quite well (to within ~4 m). However, the instrument location perpendicular 479 to the line cannot be resolved. This is evident from the resolution matrix as well as the synthetic bootstrap 480 tests. However, parallel to the line the instrument location is resolved quite well (to within ~4 m). The 481 instrument depth is also poorly resolved with RMS of  $\sim 200$  m. In order to resolve both horizontal dimen-482 sions and depth, an alternative survey geometry with a range of ship-track azimuths should (or even two 483 perpendicular lines crossing the instrument, such as the Cross or Hourglass geometry) may be used. 484

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Optimal survey size scales down with decreasing water depth. Figures S7–S8 in the electronic supplement show the synthetic tests from Section 3.3 at 2000 m and 500 m. The optimal survey radius shrinks to 0.5 Nm at 2000 m water depth and 0.25 Nm at 500 m depth, respectively. Uncertainties decrease with decreasing water depth at the preferred survey radius as well as overall. This decrease in optimal survey size with decreasing water depth reduces the importance of the ray-bending corrections at shallow depth. Deviations from the straight ray approximation occur most strongly in shallow water at large offsets, especially if there is an abrupt drop in velocity at the thermocline (see Figures S1, available in the electronic supplement to this article). However, at 0.25 Nm offset for 500 m water depth the perturbation to the travel time is only ~0.06 ms, significantly lower than experimental noise, even with the presence of a significant thermocline.

Observations of instrument drift from seasurface to seafloor are byproducts of the location algorithm if instrument drop points are precisely recorded. Figure 9 highlights both the precision of the *OBSrange* algorithm as well as the potential for using instrument drift as an oceanographic observation. A clockwise rotation pattern is observed in instrument drift is observed across the Young Pacific ORCA network that is consis-

tent with a large cyclonic mesoscale feature, providing novel point measurements of depth-integrated flow 498 through the water column that could be used to calibrate models of the vertical shear (Ryan Abernathey, pers. comm.). Although there are certainly higher resolution methods of measuring shallow-most characteristics 500 of the water column, such as using an acoustic Doppler current profiler (ADCP), observations tracking from the surface to seafloor may still prove useful. With the further proliferation of seafloor data providing 502 503 broader spatial and temporal sampling, measurements data such as these could be used to estimate verify models of vertical structure of the full water column. Furthermore, the The network-wide depth-averaged 504 water velocity is  $\sim 1505$  m/s with standard deviation  $\sim 4.5$  m/s, consistent with the regional decadal average 505 for the month of April (~1509 m/s) from the 2009 World Ocean Database Atlas database (see Data and 506 Resources). 507

Accounting for a relative offset between the shipboard GPS and transponder may be important for 508 correctly resolving depth and average sound speed for some combinations of survey geometry and GPS-transponder 509 offset. The synthetic test in Section 3.2 shows that if the transponder and GPS are offset by  $\sim 14$  m and 510 the survey pattern is such that the transponder is systematically positioned further than the GPS from 511 the instrument by  $\sim 2.5$  m (in 3-dimensions), z may be underestimated by as much as  $\sim 28$  m. This bias 512 may explain the ~18.6 m shallowing of stations at Young Pacific ORCA compared to depths reported by 513 the shipboard multibeam, where a GPS-transponder offset was not known and no correction was applied. 514 Figure S9 in the electronic supplement shows results for the same synthetic tests from Section 3.3 without the 515 GPS-transponder correction applied. While the PACMAN survey still performs best at recovering horizontal 516 location, it poorly recovers depth and water velocity. However, anti-symmetric patterns (i.e. having both 517 clockwise and counter-clockwise segments and ship tracks toward and away from the instrument) such as 518 Hourglass and Cross2 accurately recover z and  $V_n$  by effectively canceling the offset anomaly along the anti-symmetric legs. The precise affect that an unaccounted for GPS-transponder offset will have on travel 520 times is entirely dependent on the specific configuration of the GPS-transponder offset relative to the chosen 521 survey pattern. For example, if the GPS and transponder were located at the front and back of the ship, 522 respectively, the circular legs of the survey would be unbiased, with large biases along the radial legs. If the 523 GPS-transponder offset cannot be determined before an experiment and accurate depth and sound speed are 524 desired, an anti-symmetric survey pattern with clockwise/counter-clockwise and radial towards toward/away 525 from the instrument may be used with a slight reduction in horizontal precision.

We find that the Doppler travel-time corrections only slightly improve RMS misfit improve RMS travel-time misfit by only  $\sim 0.3$  ms ( $\sim 7\%$  reduction) for the synthetic tests test (Figure 3) and do not improve RMS misfit for the real data. However, the test shows a reduction in horizontal errors of  $\sim 2$  m ( $\sim 40\%$ ) when using the correction, and therefore, we include the Doppler correction as an option in the code. One possible

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reason why the corrections fail to improve the travel-time misfit for real data may simply be the inability 531 to accurately estimate ship velocity resulting from poor GPS spatial precision and/or poor spatial-temporal spatiotemporal sampling along the ship tracks, especially when large data gaps are present. Additionally, 533 the algorithm does not include a travel-time correction to account for a possible offset in the GPS receiver and the acoustic transponder relative to the instrument (i.e. it is assumed that they are colocated). Let 535 us consider a worst-case scenario where the GPS and transponder are at opposite ends of the ship and one is closer to the instrument by ~30 m. For a 1 Nm radius survey with the instrument at 5 km depth, the 537 travel-time difference due to the separation would be ~14 ms. However, for quasi-circular geometries such 538 as The PACMAN, this timing error will be static around the perimeter of the circle effecting primarily 539 the depth and water velocity; Thus, it should not significantly effect the estimated horizontal instrument 540 <del>location.</del> survey pattern is quasi-circular and therefore the Doppler correction is quite small (<2 ms) along the majority of the survey (Figure 6c). 542

#### 543 5 Conclusion

We present OBSrange, a new open-source tool for robustly locating OBS on the seafloor. Two-way travel 544 times—Acoustic ranging two-way travel-time data between the ship and OBS are inverted for horizontal 545 instrument position, instrument depth, and depth-averaged water velocity, sound speed. Our algorithm can account for travel time perturbations due to ship motion between sending and receiving, ray bending through 547 the water column, and a static offset between the GPS and transponder. Uncertainties are calculated for all four parameters using bootstrap resampling, and an F-test grid search provides a 3D confidence ellipsoid 549 around the station. The tool is validated using a synthetic travel-time dataset yielding typical horizontal location errors on the order of ~4 m for 5000 m water depth. Various survey geometries are explored 551 through synthetic tests, and we find that the PACMAN survey configuration with is most successful at 552 recovering horizontal location, even with an unaccounted for GPS-transponder offset. Optimal survey radius 553 depends on water depth and desired precision ranging from 0.75-1 Nm at 5000 m water depth to ~1 Nm 554 radius is the optimal geometry for robustly recovering the true instrument position while minimizing the 555 trade-off between depth and water velocity 0.25 Nm at 500 m depth. The Circle configuration is unable 556 to resolve depth and water velocity and should be avoided. The Line survey pattern, commonly used in short-period OBS deployments, recovers instrument location parallel to the line but has no resolution in 558 the orthogonal direction. If instrument depth and/or water velocity are of particular importance, a survey pattern such as PACMAN is desirable, which contains long ship tracks toward and away from the instrument. 560 If GPS-transponder offset is uncertain and cannot be measured, the Cross2 or Hourglass patterns provide the best resolution of depth and water velocityare of lesser importance and/or time is restricted, a PACMAN survey of radius ~0.75 Nm is sufficient for resolving horizontal position to ~5 m. The tool is applied. We apply the tool to the 2018 Young Pacific ORCA Young Pacific ORCA deployment yielding an average RMS data misfit of 1.96 ms and revealing a clockwise-rotation pattern in the instrument drifts with a diameter of ~500 km that correlates with a cyclonic mesoscale feature. This observation further demonstrates the precision of OBSrange and suggests the possibility of utilizing instrument drift data as an oceanographic tool for estimating depth-integrated flow through the water column.

## 569 6 Data and Resources

The complete OBSrange code is available in both MATLAB and Python at [insert IRIS SeisCode link]. All
2018 Young Pacific ORCA survey data are available upon request by contacting the author J.B. Russell.
Geostrophic flow and dynamic sea level measurements are provided by Copernicus Marine Environment Monitoring Service (CMEMS) at http://marine.copernicus.eu/services-portfolio/access-to-products/?option=com\_csw&view=det
(last accessed October 2018). Ocean sound speed profiles compiled from the 2009 World Ocean Database
Atlas database by Brian Dushaw are available at http://staff.washington.edu/dushaw/WOA/ (last accessed
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Table 1: Details of the synthetic tests in Figure 7.—3 for a PACMAN survey of radius 1 Nm and 5050 m instrument depth. Final model parameters for OBS range inversions are the average of 1000 bootstrap iterations. Parameters that are held fixed during the inversion are denoted in italics and their final values omitted. Parameters x and y are displayed as distance from the drop location.

mitted. Taramet		Doppler	ellipsoid	GPS	remove		x	$\mathbf{y}$	${f z}$	$V_{ m p}$
Model Name	method	correction	correction	correction	bad data		(m)	(m)	(m)	(m/s)
(1) OBSrange	OBSrange	Yes	Yes	Yes	Yes	initial	0	0	-5000	1500
						final	199	-399	-5047	1519
						true	200	-400	-5050	1520
						RMS	1.9	2.2	9.9	2.7
(2) No Doppler	OBSrange	No	Yes	Yes	Yes	initial	0	0	-5000	1500
						final	200	-396	-5041	1518
						true	200	-400	-5050	1520
						RMS	1.9	4.6	12.4	3.4
(3) No Ellipsoid	OBSrange	Yes	No	Yes	Yes	initial	0	0	-5000	1500
						final	200	-399	-5055	1522
						true	200	-400	-5050	1520
						RMS	1.9	2.8	10.9	3.1
(4) No GPS	OBSrange	Yes	Yes	No	Yes	initial	0	0	-5000	1500
						final	198	-398	-5022	1512
						true	200	-400	-5050	1520
						RMS	2.8	3.4	30.1	8.8
(5) Fix- $V_p$	OBSrange	Yes	Yes	Yes	Yes	initial	0	0	-5000	1500
						final	192	-393	-4977	-
						true	200	-400	-5050	1520
						RMS	8.2	7.6	73.3	20.0
(6) Fix-Z	OBSrange	Yes	Yes	Yes	Yes	initial	0	0	-5000	1500
						final	194	-395	-	1506
						true	200	-400	-5050	1520
						RMS	5.8	5.4	50.0	13.6
(7) XY-only	OBSrange	Yes	Yes	Yes	Yes	initial	0	0	-5000	1500
						final	177	-367	-	-
						true	200	-400	-5050	1520
						RMS	26.0	34.6	50.0	20.0
(8) SIOgs	Grid Search	No	No	No	Yes	initial	0	0	-5000	1500
						final	177	-365	-	-
						true	200	-400	-5050	1520
						RMS	23.4	35.0	50.0	20.0
(9) SIOgs no QC	Grid Search	No	No	No	No	initial	0	0	-5000	1500
						final	508	-498	-	-
						true	200	-400	-5050	1520
						RMS	307.7	97.7	50.0	20.0

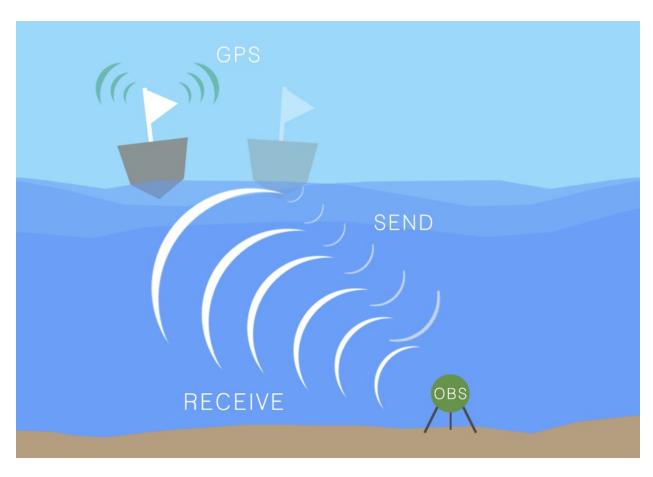


Figure 1: Schematic of the acoustic ranging procedure. A 12 kHz acoustic pulse is sent from ship to OBS. After a time  $\tau$ , the OBS returns the acoustic signal to the ship at its new position. The difference in these send- and receive-times is referred to as the "Doppler" correction,  $\delta T$ . From this schematic, it is clear that only ship tracks traveling toward or away from the instrument will result in a non-zero  $\delta T$ .

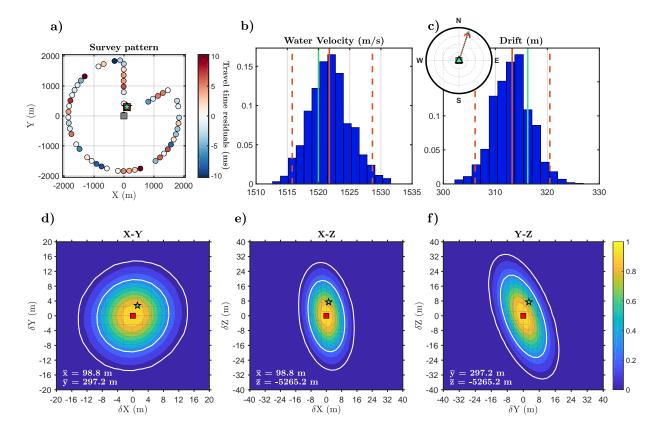


Figure 2: Test of location algorithm using synthetic data . A comparison of calculated for a station at 5000 m depth using the true input values (green star and lines PACMAN geometry. a) with the inverted model parameters (red circle The PACMAN survey pattern colored by travel-time residuals. The gray and red solid lines) demonstrates that squares represent the drop location , depth, and water velocity are extremely well recovered final inversion, and the estimated uncertainties on these parameters are consonant with the actual misfit respectively. Top three plots show slices through The green star denotes the F-test surface, contoured by probability true location. Bottom two plots show b-c) Bootstrap histograms from a bootstrap analysis with 95th percentile values indicated by dashed red lines and the true value in green. Inset shows the direction of true (green dashed) and estimated (red) drift with respect to the starting location. d-f) Slices through the F-test surface with white lines showing 68% and 95% confidence. Symbols are the same as a). Comparison of the true input values with the inverted model parameters demonstrates that the location, depth, and water velocity are extremely well recovered, and the estimated uncertainties on these parameters are consonant with the actual misfit.

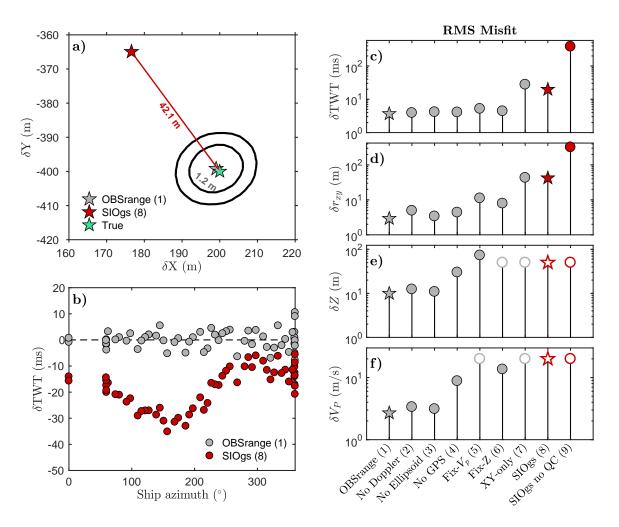


Figure 3: Synthetic test of OBSrange performance (gray symbols) compared with the SIO tool (red symbols) for a PACMAN survey of radius 1 Nm at 5050 m depth. a) Map view comparing the OBSrange and SIO SIOgs inverted instrument locations with the true location in green. Black contours show the 68% and 95% confidence from the OBSrange F-test. b) Two-way travel time (TWT) residuals for both methods as a function of ship azimuth from the true station location. c) TWT and d-f) model parameter RMS misfits for 8-the 9 inversions, where closed symbols represent parameters that are solved for in the inversion and open symbols are parameters that remain fixed throughout the inversion. The horizontal instrument location misfit is given by  $\delta r_{xy} = \sqrt{\delta x^2 + \delta y^2}$ . Stars in c-f mark the inversion results shown in a) and b). See table 1 for details of each inversion.

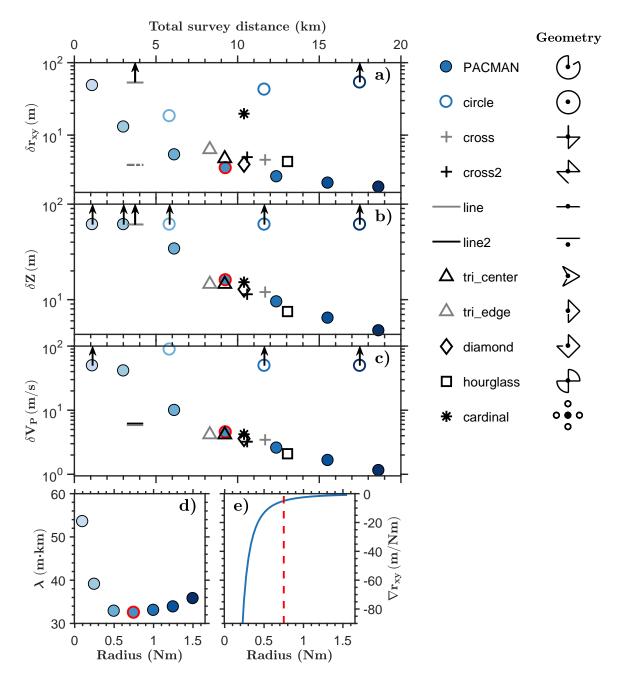


Figure 4: a c) RMS model parameter misfits for Test of 10,000 synthetic survey realizations of various survey geometries and sizes for an instrument at a nominal depth of 5000 m. Blue filled circles represent PACMAN surveys ranging from 0.1–1.5 Nm. Circle surveys (blue open circles) are of radius 0.5 Nm, 1 Nm, and 1.5 Nm. All other surveys (black and gray symbols) are for 1 Nm radius. The "optimal" PACMAN survey is circled in red (see d). a-c) RMS model parameter misfits for each survey with varying radii respect to total survey length: PACMAN, Circle, Cross, Line, Triangle, Diamond, Line Hourglass, and Triangle Cardinal where Cardinal comprises multiples pings overhead and at 4 cardinal points. Each survey geometry is shown to the left right of its respective legend entry. Horizontal instrument location misfit is again given by  $\delta r_{xy} = \sqrt{\delta x^2 + \delta y^2}$ . Open stars Dashed lines for the line tests Line surveys denote misfit in the direction running parallel to the line (x-direction for these tests). Symbols plotted off-axis are denoted with arrows. d) Quantification of diminishing improvement as radius of PACMAN survey is increased, where  $\lambda$  is the product between survey radius and  $\delta r_{xy}$ . The lowest (ideal) "optimal" value of  $\lambda$  occurs at a radius of 0.75 Nm (circled in red). e) Change in the rate of improvement of horizontal location misfit with increasing PACMAN survey radius  $(\nabla r_{xy})$ , where the red dashed line indicates minimum  $\lambda$  (see Figure S6, available in the electronic supplement to this article). Improvements in horizontal misfit become negligible small as radius increases beyond 0.75–1 Nm.

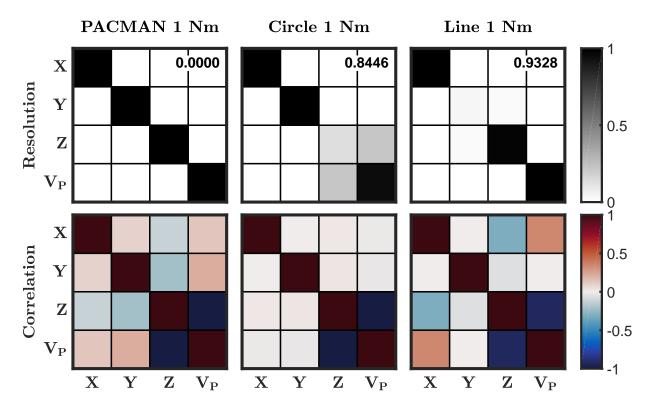


Figure 5: Model resolution and correlation matrices for 3 survey configurations of radius 1 Nm: (left) PACMAN, (center) Circle, and (right) Line. The Line survey is parallel to the x-direction. spread( $\mathbf{R}$ ) is listed at the top right of each resolution matrix. A spread of zero signifies good model resolution for all parameters.

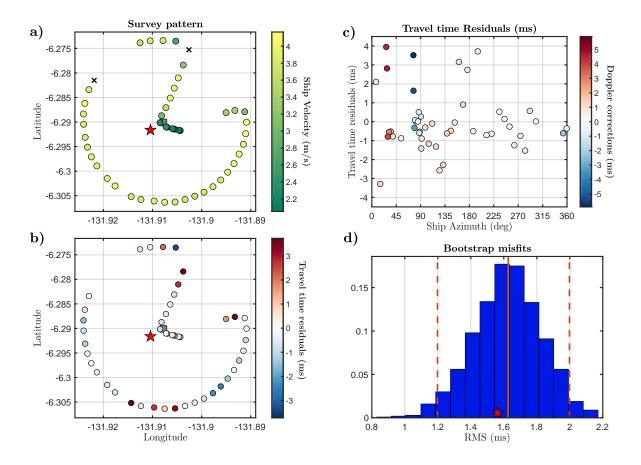


Figure 6: Example inversion at station EC03 in the 2018 Young Pacific ORCA deployment. a) Map view of acoustic survey; colored circles are successful acoustic range measurements, black crosses are bad measurements rejected by automatic quality control (greater than 500 ms from predicted travel time), grey gray square is drop location, red star is final location. b) Map view of data residuals based on travel times computed using bootstrap mean station location. c) Data residuals plotted as a function of azimuth, colored by the computed Doppler correction (not used in this inversion). d) Histogram of data RMS from the bootstrap; the RMS of the final model is shown as a red star.

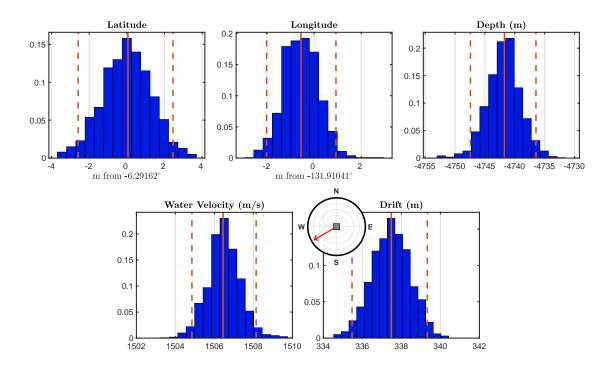


Figure 7: Histograms of model parameters from the bootstrap inversion of station EC03 in the 2018 Young Pacific ORCA deployment. Red solid line shows mean value, while dashed lines indicate 95th percentiles. Latitude and longitude are plotted in meters from the mean point, for ease of interpretation. The inset plot shows the mean drift azimuth from the drop location (grey gray square).

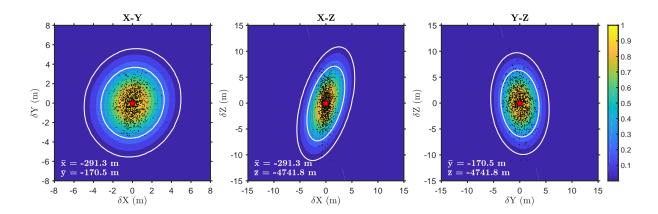


Figure 8: Three orthogonal slices through the F-test probability volume for station EC03 in the 2018 Young Pacific ORCA deployment, contoured by probability of true station location relative to the best fitting inverted location  $(\bar{x}, \bar{y}, \bar{z})$ , indicated by the red star. White contours show 68% and 95% contours. Black dots show individual locations from the bootstrap analysis (Figure 7).

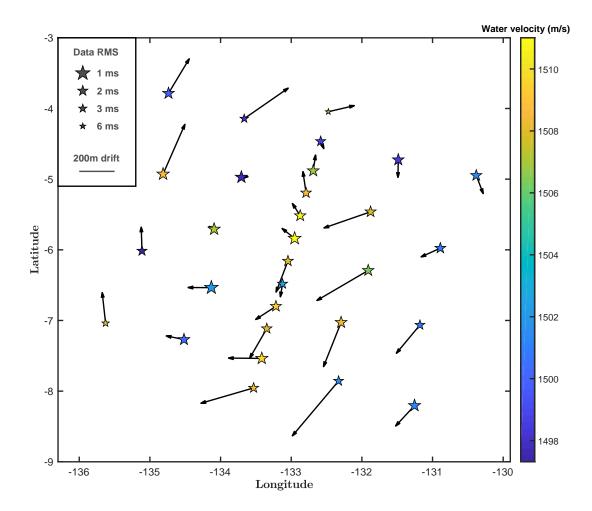


Figure 9: Pacific ORCA deployment, showing drift directions and magnitudes of each OBS instrument relative to their drop points, as well as the water velocity at each location. Note that drift arrows are not to geographic scale. The systematic clock-wise pattern of drift within the water column resembles a meso-scale cyclonic feature moving through this region approximately during the deployment (see Figure S1, available in the electronic supplement to this article). Station symbol sizes are inversely scaled to acoustic travel time data misfit.