# Postdoc position: Ocean Bottom Noise Shazam Signal processing & data science applied to marine seismology data 2022–2023, France, Brittany, Brest

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- Project: ANR BRUIT-FM, Compréhension, prévention et utilisation du bruit sismologique en fond de mer (PI: Wayne Crawford)
- Postdoctoral offer details and updates

## Context

Marine seismology has made tremendous technological advances in the past decades: data recorded at the seafloor by ocean bottom seismometers (OBSs) are becoming widely available (*e.g.* IRIS consortium https://ds.iris.edu/ds/nodes/dmc/data/types/waveform-data/). An OBS is a multicomponent instrument able to continuously record pressure and earth motion. There are two types of OBSs: shortperiod instruments for recording high-frequency motions, and long-period instruments for acquiring a wider range of motions (*cf.* INSU-IPGP national OBS facility https://parc-obs.insu.cnrs.fr/). With both instruments, OBSs record a superposition of a broad variety of signals generated by solid earth, ocean wave, biologic, ship sources and noise. These signals can be very different in amplitude, duration and frequency content. However, they can also overlap in those domains, making them hard to isolate from each other. That is why OBS data cannot yet be fully exploited by the seismological community, as they require more advanced processing and identification techniques.

The multidisciplinary ANR project BRUIT-FM (PI: Wayne Crawford) aims at identifying and exploiting OBS-recorded signals. Its goal is to catalogue the diversity of signal sources, understand their contributions to local and global seismic noise and to enhance specific signals of interest by removing others. The project emphasizes on three main axes:

- i understanding the generation of ocean-wave induced seismic noise,
- ii characterizing the seafloor soundscape at frequencies higher than 1 Hz,
- iii improving signals' separation and noise removal at seafloor stations.

The project gathers experts in Seismology, Acoustics, Oceanography and Signal Processing from French Research Organisms or laboratories (IPGP, Ifremer, SHOM, UBO, ESIEE/IFPEN, GIPSA-Lab, ENSTA), one industrial partner (iXblue) developing the technology of a rotational seismometer and international experts from GEOB3N (Spain) and LDEO (USA).

### Subject

This postdoctoral position funded by the BRUIT-FM project primarily aims at developing signal processing and machine learning techniques to classify and separate signals recorded by OBSs and to enhance earthquake waveforms and microseismic noise. It devotes to a better exploitation of non-seismological signals for defining a seafloor soundscape. Hence the moniker "Ocean Bottom Noise Shazam", from the famous music retrieval/identification application (Wan03).

A first step will be focused on characterizing the main features of signals recorded by OBSs in time, frequency, time-frequency/scale (GDP09), multisensor domains to define specific patterns. Targeted signals to isolate/remove are in the low frequency spectrum (<1 Hz):

- i compliance noise generated by ocean waves characterized by a frequency content below 0.04 Hz dependent on the water depth (CW00);
- ii amplitude-varying noise induced by bottom currents much larger on horizontal components but that can leak on the vertical sensor when the seismometer is tilted (CW00; BFR15; JGA<sup>+</sup>19).

The ANR BRUIT-FM will also focus on detecting different sources, varying in time and space, constituting the seismic noise related to primary and secondary microseisms in this part of the frequency spectrum (MSS19).

In the high frequency spectrum (> 1 Hz), earthquake signals can be polluted by:



Figure 1: Seafloor seismometer spectra. Green region is the "soundscape" band. Top: Pressure. Thick lines are relatively high, thin relatively low values. Bottom: Acceleration. Red line: horizontal channels; black lines; vertical. Dashed black line is cleaned spectra (CW00). Grey background: Global seismometer noise bounds (Pet93; WM19). Spectral lines derived from (BSDO97; CSB06; Web98; MAW08; Hil09).

- i marine mammal vocalizations such as chirp-like signals emitted by fin whales (KN21) or chorus footprint (BDBB18), which may overlap with seismic signals while sharing a same frequency content (Figure 2),
- ii ship noise characterized by sparse frequency peaks (TBD+20).

The second step will dealing with exploiting the above features/patterns, global communications schemes, and sensor fusion to develop efficient algorithms for adaptive signal separation and noise removal. A first approach would consist in using adaptive template subtraction obtained by recording, modelling or learning signals of interested, following the methodology from (VLRH<sup>+</sup>12). Shaping filters will first be developed, in a complex domain (Fourier, spectrogram, wavelet (GDP09)), to perform an optimization of matched template adaptation in amplitude, time and frequency. In addition, frontier techniques will be explored such as broad source separation methods relying on very-limited modelling assumptions (*e.g.* sparsity in (NSD14)). The latter could be used to account for non-stationnary noise floor drifts in a time-frequency or time-scale domain. If suitable, deconvolution or restoration from the template database could be devised (CCDP20). The performance of developed approaches will be quantified by using reference algorithms such as the transfer function method first introduced by (CW00) for removing compliance signal and tilt noise that will be revisited by Martin Schimmel during the project based on improved data selection and segmentation (SSL<sup>+</sup>21). Additional insights could be borrowed from recent work on marime mammal communication and deep learning ((VML21) or Project CETI, Cetacean Translation Initiative, https://www.projectceti.org/).

#### **Contact** information

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- Location: Ifremer, Centre de Brest
- Duration: 16 months
- Starting date: Spring/Summer 2022

# Application

• Candidate profile: PhD with strong interest in spectral analysis, adaptive filtering, machine learning, with a taste of physics. Languages: C/C++, Python/Matlab or similar



Figure 2: Fin whale vocalization overlapping with a seismic signal in time and frequency.

• Send resume, motivation letter (specific to this offer) and useful information (publication list, relevant papers) to supervisors (naming pattern: LASTNAME\_Firstname-Resume.\* or LAST-NAME\_Firstname-Letter.\*)

#### References

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