

Deep learning applied to underwater acoustic data

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Marine Environmental Research Infrastructure for Data Integration and Application Network



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- Consortium of ocean researchers, computer scientists, and data managers from across Canada
- ~18 full-time staff
- 3-year grant from CFI* (2017-2020)
- Provide the ocean research community with tools to discover, access, analyze, and visualize marine acoustic data

* Canada Foundation for Innovation

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Data ...

discovery

we are building a data discovery service that is listing existing ocean acoustic data making the data findable, accessible, and reusable

analysis

we develop analytical tools e.g. for modeling underwater sound propagation and for detecting and classifying sound sources

visualization

we provide tools for visualizing acoustic data and mapping the noise in the oceans



The MERIDIAN **metadata standard** has been aligned with already existing international standards. Our standard is based on the Integrated Ocean Observatory System (IOOS) Metadata Convention for Passive Acoustic Records (v. 1.0) and Darwin Core to represent biological information.

Adopting and co-creating metadata standards U Removing barriers to finding and accessing data

Soundscape Atlas

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MERIDIAN is developing an interactive tool for modeling and visualizing underwater acoustic data in multiple dimensions (time, space, frequency, source^{*}, etc)



* anthrophony, geophony, biophony, ...

Soundscape Atlas







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Bringing cutting-edge techniques from Computer Science to Ocean Science



Deep Learning

Applications of Deep Learning:

- Sound detection and classification
- Model underwater noise intensity and propagation from ship tracking data (AIS)
- Compression of acoustic data







Acoustic detection and classification

We are using Deep Neural Networks to develop tools for the detection and classification of marine mammals and fish.

These tools aim to automatically extract and classify sounds of interest from large acoustic data sets or from streaming data produced by survey equipment.



Acoustic detection and classification





Data sets





- C. Taggart @ Dal
 - Whales (humpback, right, fin, sei)
 - o 30,000 identified calls
- F. Juanes and A. Riera @ UVic
 - Arctic Cod (in captivity)
 - 38 identified calls

Working on obtaining more data sets ...



Whale song

frequency





NOISE/ARTIFACT



Cod grunt





frequency

Riera et al. Sounds of Arctic cod, J. Acoust. Soc. Am. 143 (5), 2018

Deep learning techniques

Object Detection

You Only Look Once (YOLO) Redmon et al. 2016 <u>http://pjreddie.com/yolo/</u>



Synthetic training data

Generative Adversarial Networks (GAN) Shrivastava et al. 2016 <u>https://arxiv.org/abs/1612.07828</u>

Unlabeled Real Images







Action segmentation and detection

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Temporal Convoluted Network (TCN) Lea et al. 2017 https://arxiv.org/abs/1611.05267

50 Salads



Training



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Workshops (Starting in August)

Hacky hour (Starting in September)



Conclusion





MERIDIAN'S VISION IS TO ENHANCE CANADA'S LEADERSHIP IN THE OCEAN DATA INTEGRATION, MANAGEMENT AND ANALYSIS BY CREATING A WORLD-CLASS INFRASTRUCTURE. BASED ON HUMAN RESOURCES AND COMPUTING, TO INCREASE THE DATA'S VALUE AND VISIBILITY ACROSS BORDERS.







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Thank you!

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