

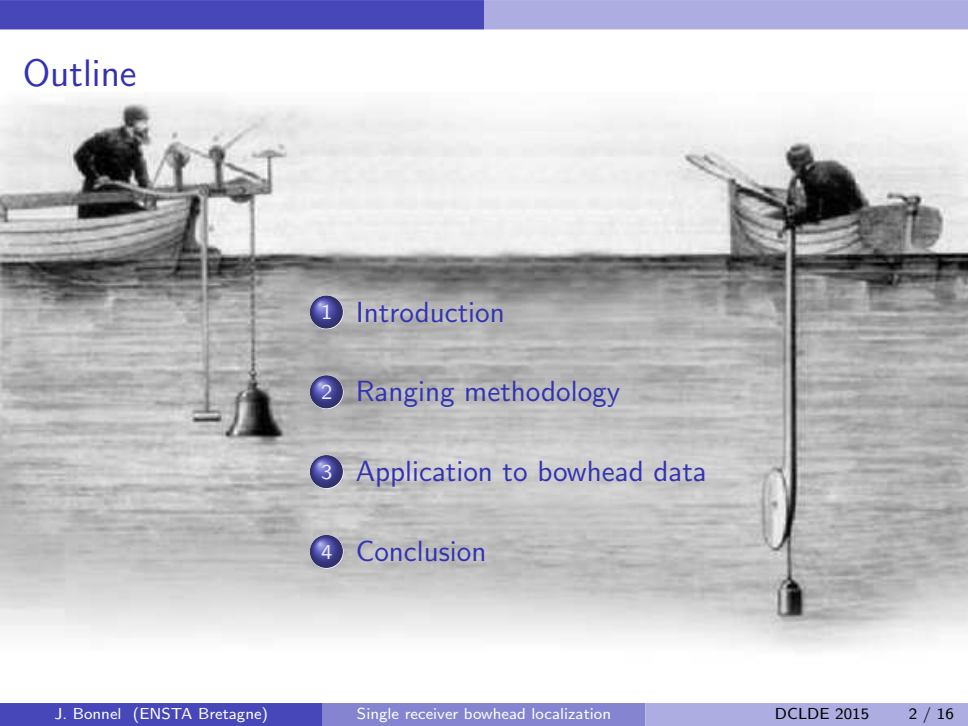
Range estimation of bowhead whales in shallow Arctic waters using a single hydrophone

J. Bonnel¹, A. Thode², S. Blackwell³, K. Kim³, M. Macrander⁴



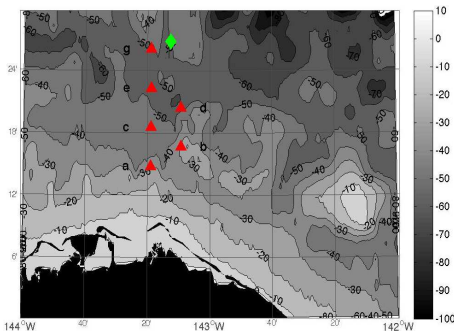
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Outline

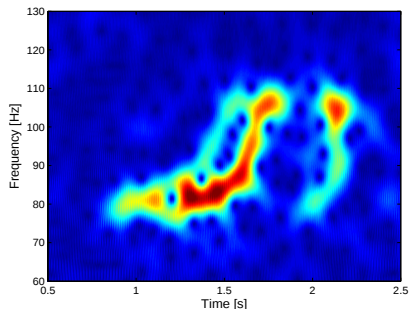
- 
- 1 Introduction
 - 2 Ranging methodology
 - 3 Application to bowhead data
 - 4 Conclusion

Context

- Bowhead whale vocalization (0-400Hz) in the Beaufort Sea
- Shallow water ($\sim 50\text{m}$) $\Rightarrow$ modal propagation ($N_{\text{modes}} \lesssim 5$)
- Modes contain information about propagation : environment, source
- Objective : range (and depth) estimation using a single hydrophone



Environment, VLA (green) and
DASARs (red)



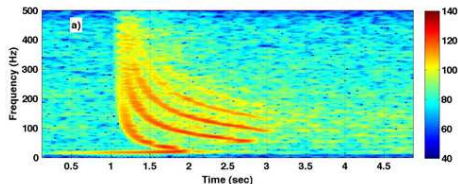
A bowhead whale vocalization

Modal propagation

- Low frequency propagation in shallow water is described by normal mode theory

$$Y(f) = |S(f)| e^{j\phi_s(f)} \sum_{m=1}^N \frac{\psi_m(z_s, f) \psi_m(z, f)}{\sqrt{rk_{rm}(f)}} e^{jrk_{rm}(f)}$$

- Modal phase $= rk_{rm}(f)$
 - ▶ defines travel time
 - ▶ position in the spectrogram
 - ▶ allows range r estimation
- Modal amplitude $\propto \psi_m(z_s, f)$
 - ▶ energy (color) in the spectrogram
 - ▶ allows depth z_s estimation



Example : airgun signal

- 1 Introduction
- 2 Ranging methodology
 - Passive localization scheme
 - Modal filtering
 - Detailed example
- 3 Application to bowhead data
- 4 Conclusion

Passive localization scheme

- Localization scheme
 - ① Modal filtering using warping
 - ② Range inversion using filtered modes
- Modal filtering using warping
 - ▶ idea : transform the signal so that modes become separated
 - ▶ aim : warped modes = cw tones (horizontal lines in the spectrogram)
 - ▶ how : non-linear resampling
- Range inversion : classical backpropagation methodology (phase only)
 - ▶ source IF is obtained as a by-product
- Range/depth inversion : Matched Mode processing
- Geoacoustic inversion is required for each call
 - ▶ environment is modeled as a Pekeris waveguide with unknown seabed
 - ▶ inversion is performed over range r and seabed soundspeed c_b

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Warping ?

- What warping sounds like

- ▶ Recorded off Australia [Play Sound](#)
- ▶ After warping [Play Sound](#)

- How it is done

Warping requires a physical model to adjust the non-linear sampling

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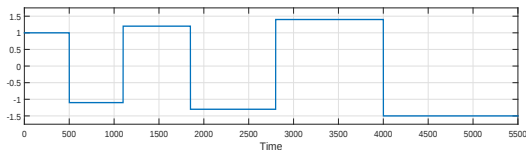
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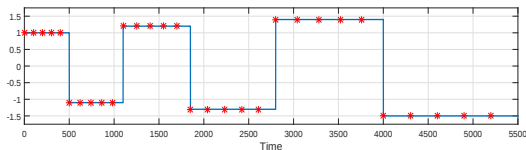
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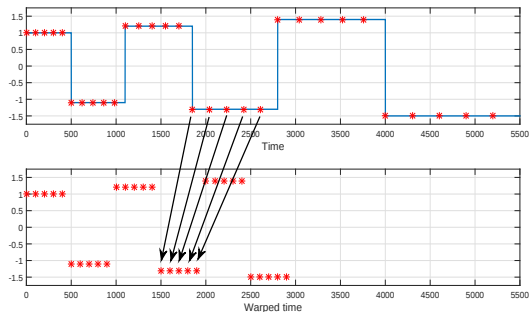
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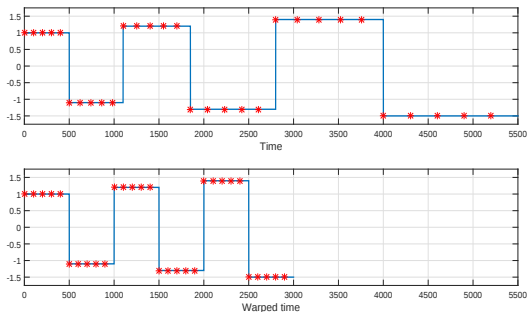
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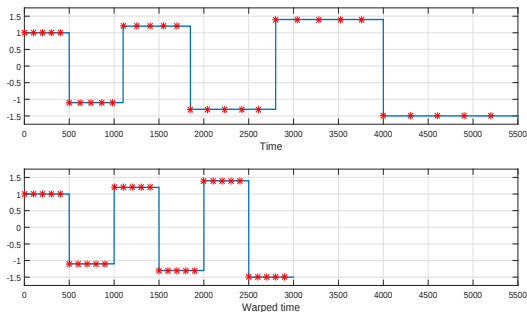
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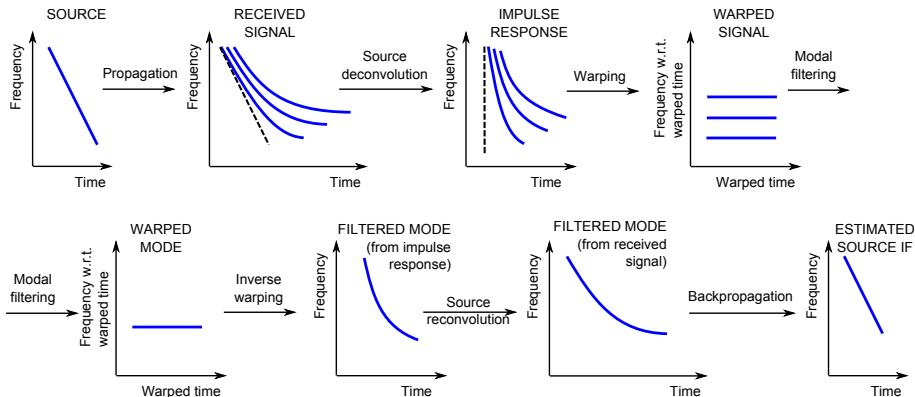


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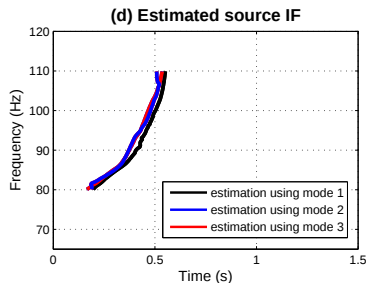
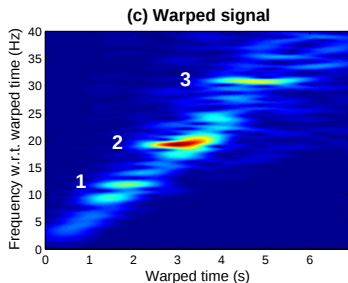
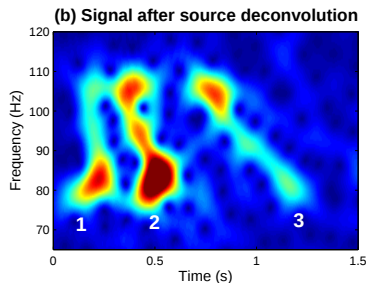
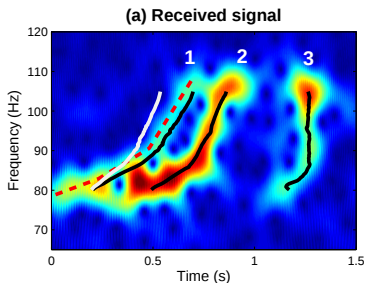
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Modal filtering using warping



Deconvolution and warping parametrization only need to be accurate enough to allow mode filtering. Inverse steps allow full signal recovery.

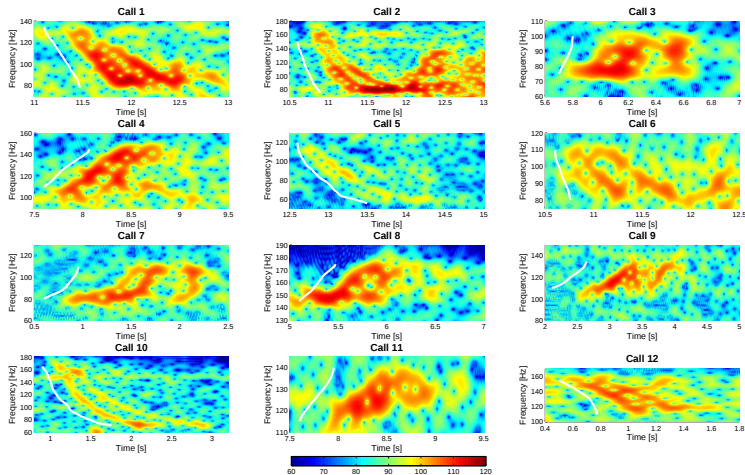
Example with real data



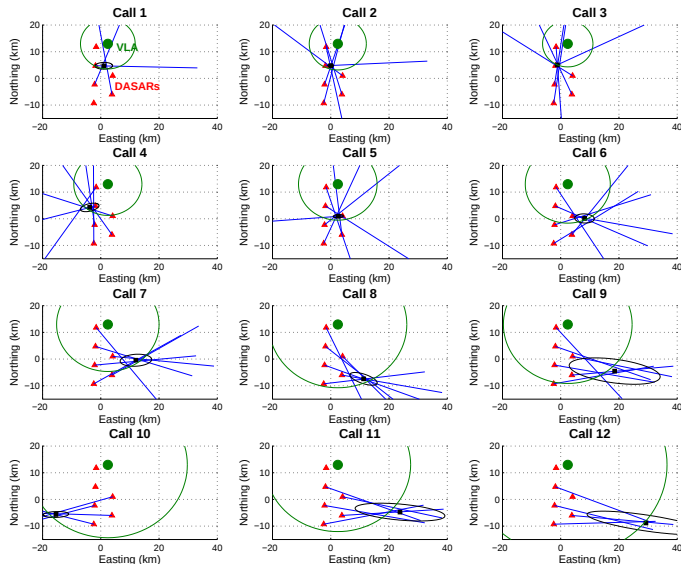
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 - Results
 - Depth estimation
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Dataset

Analysis of 12 calls with various bandwidths, durations, structure (fast/slow up/down sweeps), SNR, and modal resolution



Localization results



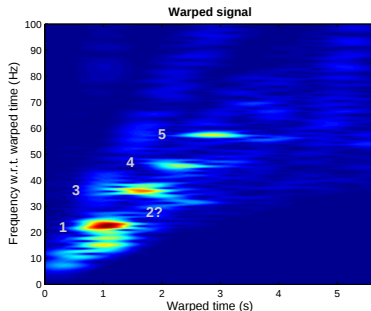
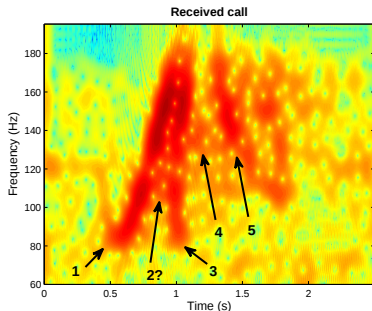
Detailed results

Call parameters			Single receiver inversion				DASAR localization	
n°	time	SNR (dB)	ΔF (Hz)	modes	$\hat{r}$ (km)	$\hat{c}_b$ (m/s)	DASARs	$\hat{r}$ (km)
1	14 :48 :21	15	85-120	1-2-3	9.4 ± 1.8	1870	b-c-e	8.3 ± 1.3
2	14 :58 :10	12	85-115	1-2-3	9.8 ± 1.0	1830	a-b-c-d-e-g	8.5 ± 0.5
3	02 :08 :16	23	75-90	1-2-3	8.7 ± 1.3	1950	a-b-c-d-e-g	8.7 ± 0.2
4	14 :40 :28	18	110-130	1-2-3	11.7 ± 1.0	1710	a-b-c-d-e-g	10.7 ± 0.9
5	01 :46 :22	6	65-115	1-2-3	13.5 ± 2.0	1580	a-b-c-d-e-g	11.9 ± 0.6
6	15 :14 :21	9	85-105	1-2-3	14.6 ± 0.9	1820	a-b-c-d-e-g	14.1 ± 1.8
7	10 :50 :14	8	85-100	1-2-3	17.6 ± 1.7	1830	a-b-c-d-e-g	16.5 ± 3.0
8	15 :14 :15	15	150-175	1-3	23.7 ± 1.2	1550	a-b-c-d-e-g	22.2 ± 2.4
9	09 :50 :37	15	110-130	1-2-3	22.1 ± 1.8	1840	a-b-c-d-e-g	23.8 ± 6.6
10	02 :27 :31	7	40-140	1-2	27.3 ± 2.2	1940	a-b-c-d	25.7 ± 1.5
11	09 :51 :02	13	120-130	1-2-3	25.0 ± 1.6	1880	a-b-c-d-e	27.8 ± 5.7
12	10 :57 :48	7	120-145	1-2	34.1 ± 0.7	1570	a-b-c-e	34.5 ± 5.0

- single receiver range estimates are consistent with DASAR estimates
- no direct link between range and SNR
- no physical meaning to the seabed sound speed estimates
- estimated source IFs different from received signals

Depth estimation : preliminary results

- Modal filtering $\Rightarrow$ matched mode processing (MMP)
 $\Rightarrow$ range and depth estimation
- Warping $\Rightarrow$ opportunity for single receiver MMP
- Example on an "easy" call



- Results ($\hat{r} = 7.7$ km, $\hat{z}_s = 33$ m) consistent with MFP estimation using a VLA (15 hydrophones)

Conclusion

- Bowhead whale ranging using a single receiver
- Modal filtering using warping
 - ▶ robust to uncertain knowledge of waveguide environment, experimental geometry and source signal
 - ▶ allows modal filtering at "short" range
 - ▶ allows source ranging and estimation of the source IF
- Existing dataset can be revisited. However
 - ▶ several manual iterations
 - ▶ source = monotonic FM sweep
 - ▶ at least two propagating modes
- Continuing work
 - ▶ automation
 - ▶ source depth and source level estimation
 - ▶ **depth discrimination** $\Rightarrow$ **discrimination between Right whales and Humpback whales**

Thanks!!! Any questions???

