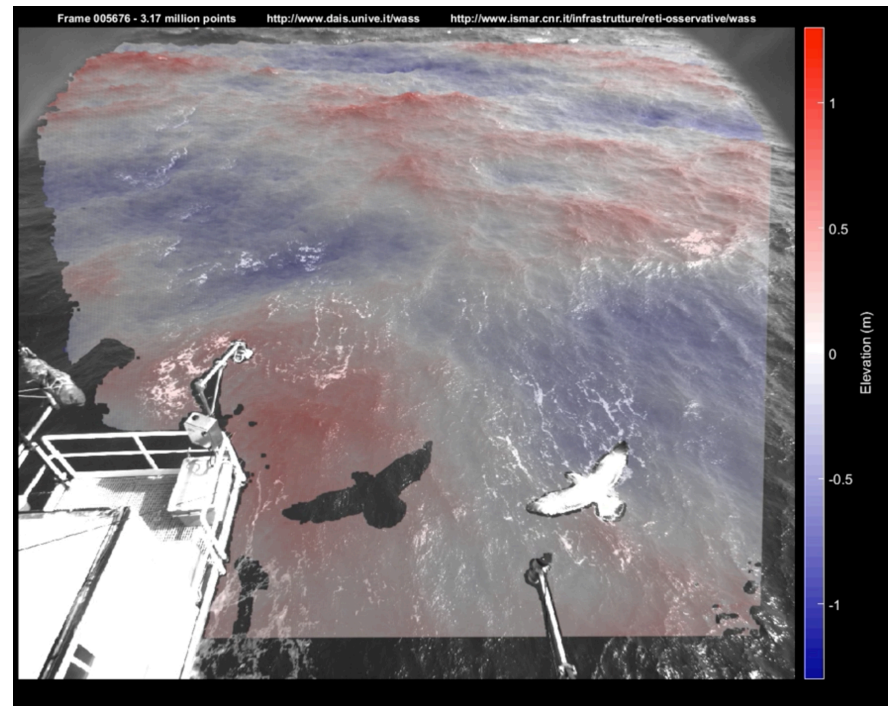


Characterizing the signature of a spatio-temporal wave field (in situ stereo imaging observations)

Alvise Benetazzo (ISMAR-CNR, Italy), **Filippo Bergamasco** (UNIVE, Italy), F. Barbariol, A. Torsello, L. Cavaleri, and many users



Università
Ca' Foscari
Venezia



OVERVIEW (from meeting keywords)

→ Providing (some) sea truths for satellite and model data

- Significant wave height
- Directional spectrum shape
- Mean square slope
- Wave-ice interaction
- Wave-wave interaction
- Wave-current interaction
- Rogue waves

OVERVIEW

STEREO 3D IMAGING FOR SEA WAVES

- Features, present and future

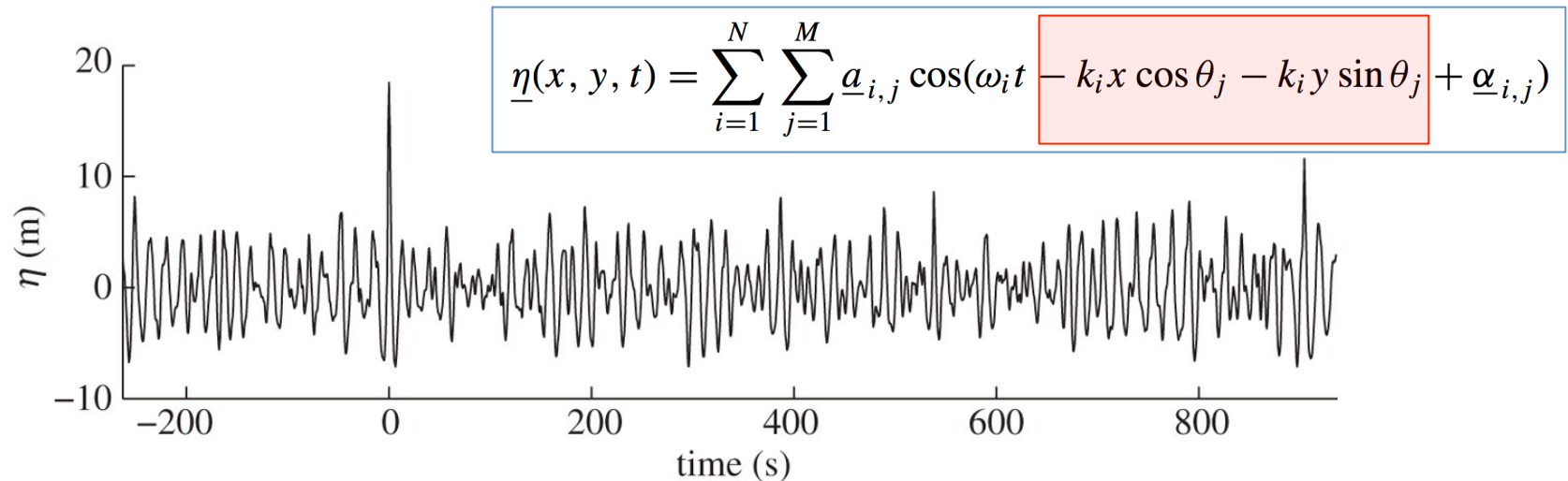
APPLICATIONS

- Characterization of the spatio-temporal wave field

Why are we interested in *in situ* 3D observation for wave studies?

Spectral and statistical properties of wind waves are historically inferred from buoys or wave gauges installed at **fixed locations** at sea

> They can acquire elevation time-series at a single point only: $\eta(t)$



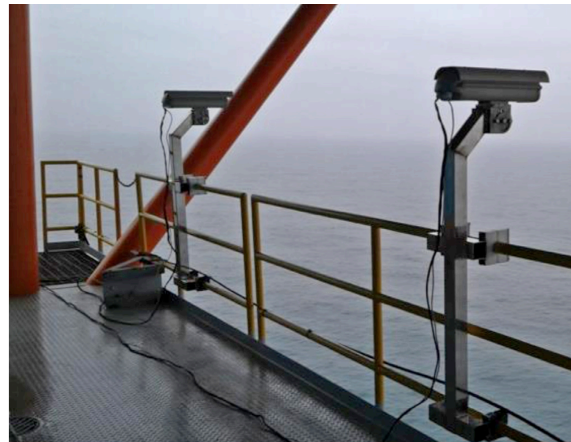
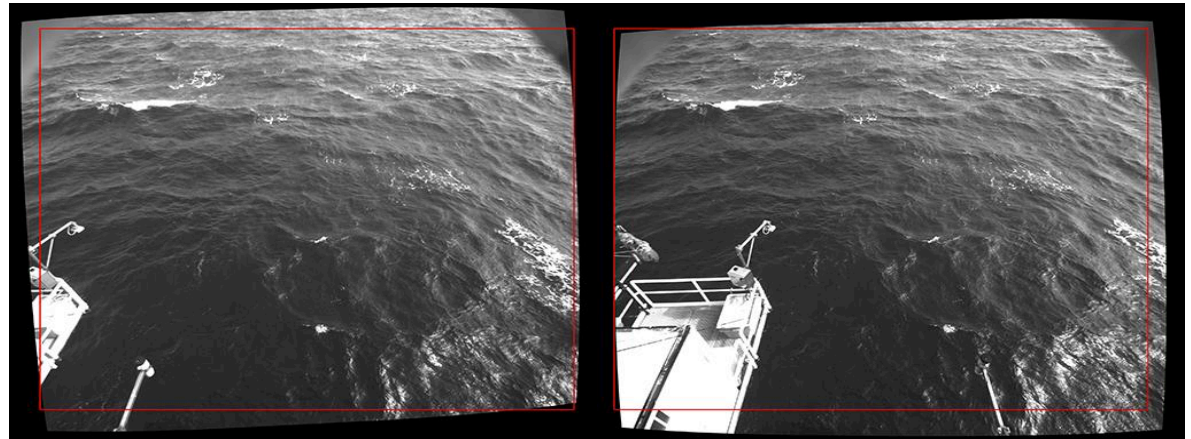
→ A single **time series** can not describe accurately the complete **space-time** wave dynamics and the **directional distribution**

Stereo wave imaging

This gap can be filled by **vision-based** 3D measurement systems

INPUT

Stereo images →

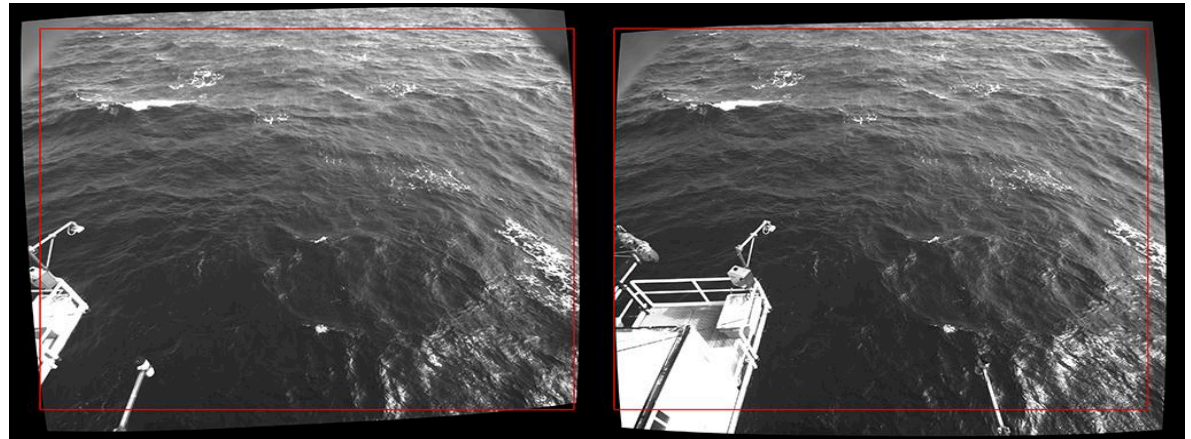


Stereo wave imaging

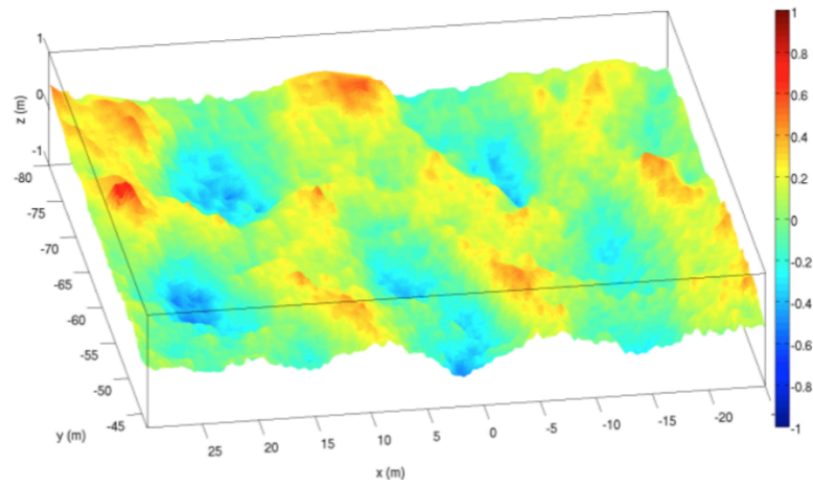
This gap can be filled by **vision-based** 3D measurement systems

INPUT

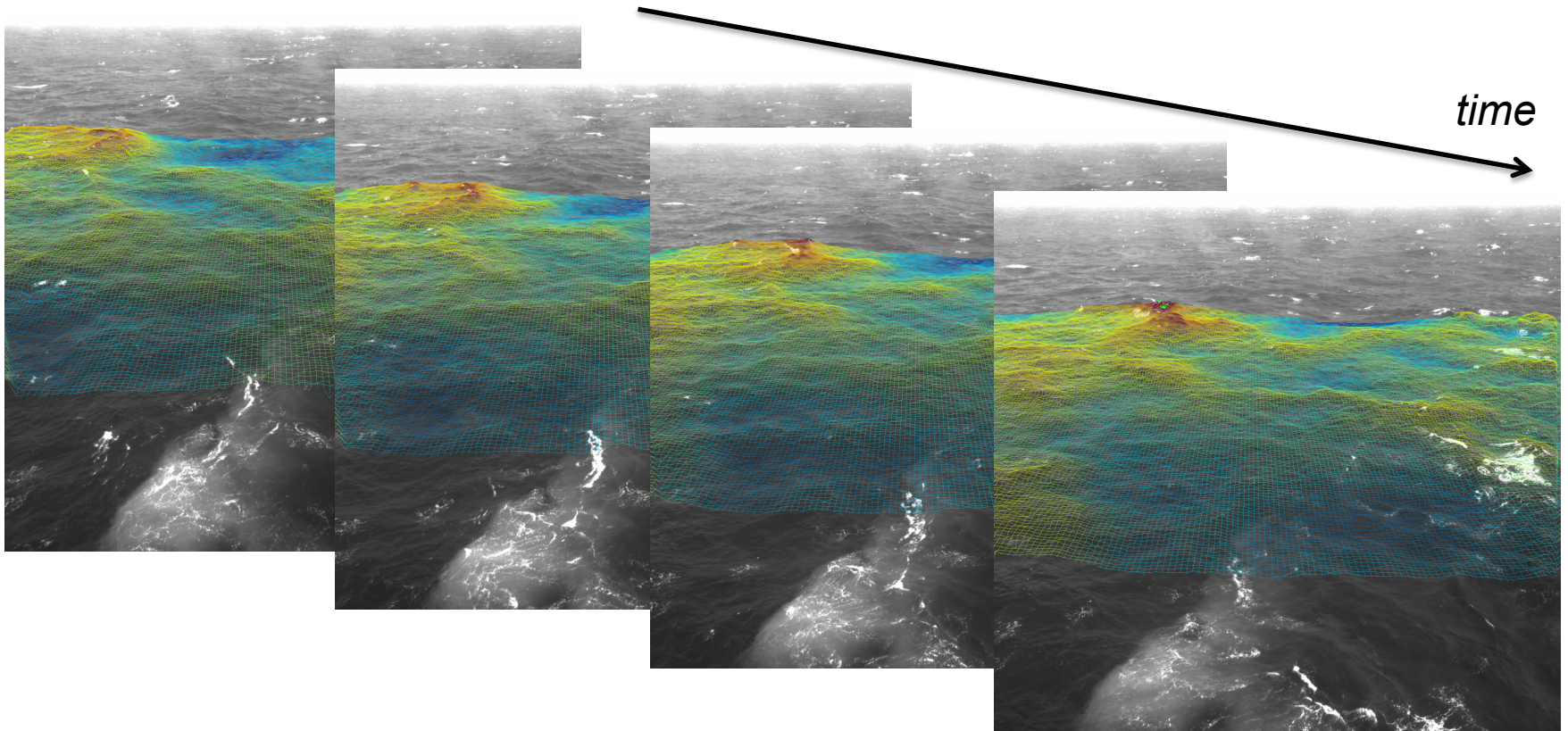
Stereo images →



OUTPUT $\eta(x, y)$ →



3D stereo measurement in time



We are able to measure the **space-time** evolution of the wave field in an **area** $\sim 200 \text{ m} \times 200 \text{ m}$ over time (**10-15 Hz**)

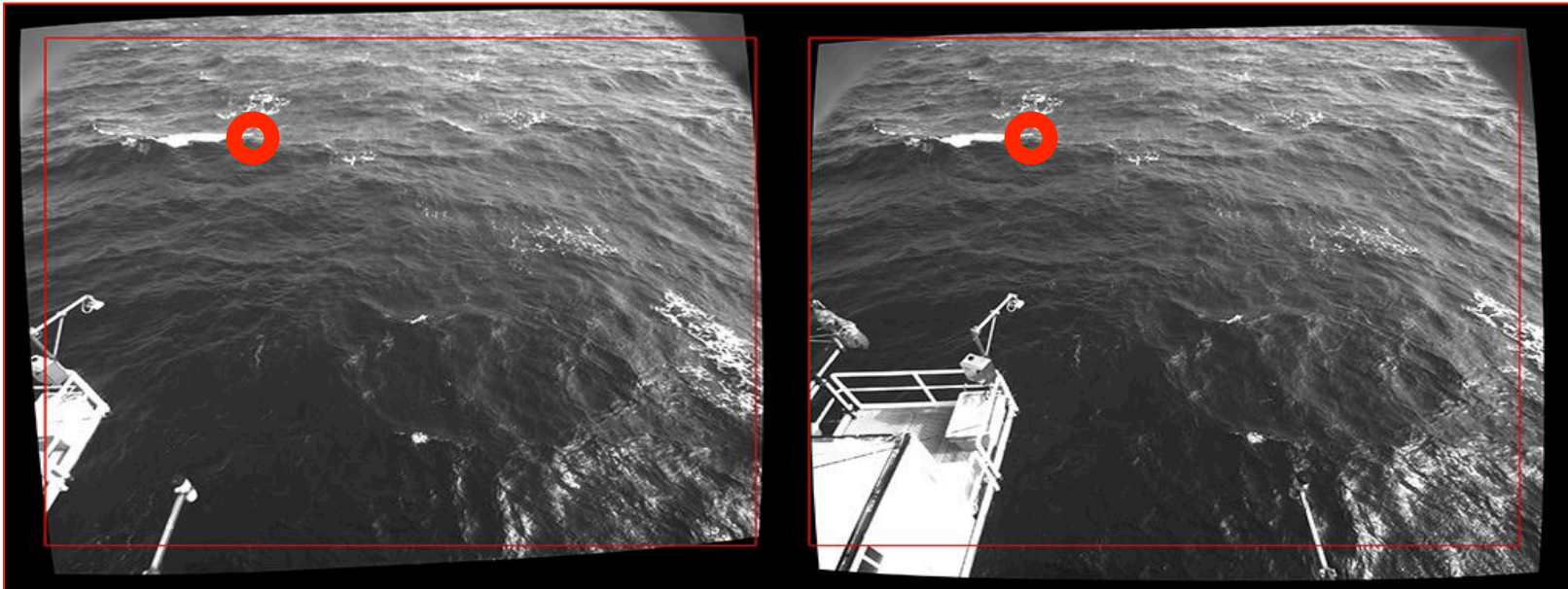
Acqua Alta oceanographic tower (Venice, Italy)



Stereo-vision: principle of operation

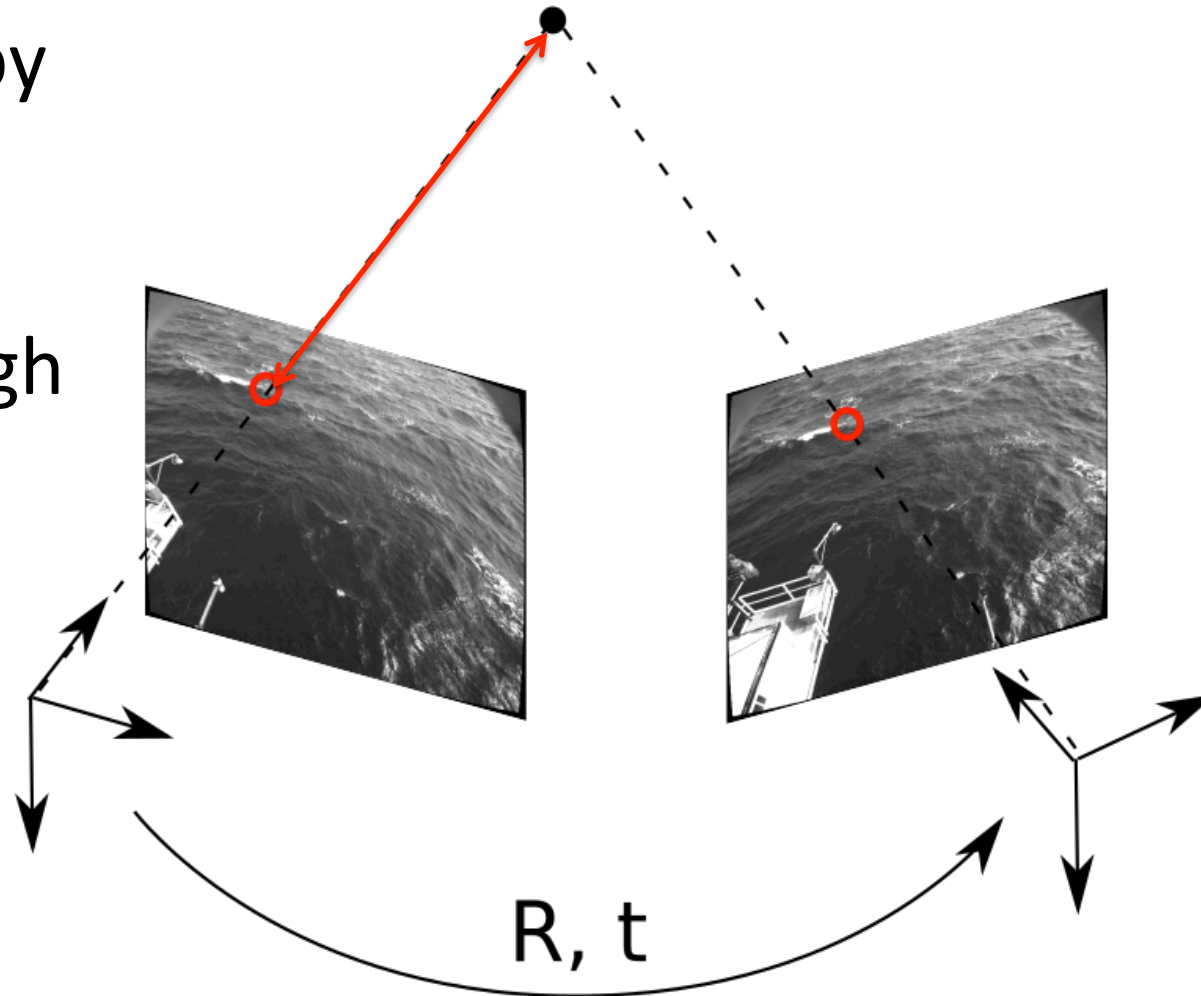
Let's assume we are able to:

1. Identify **corresponding points** in two images



Stereo-vision: principle of operation

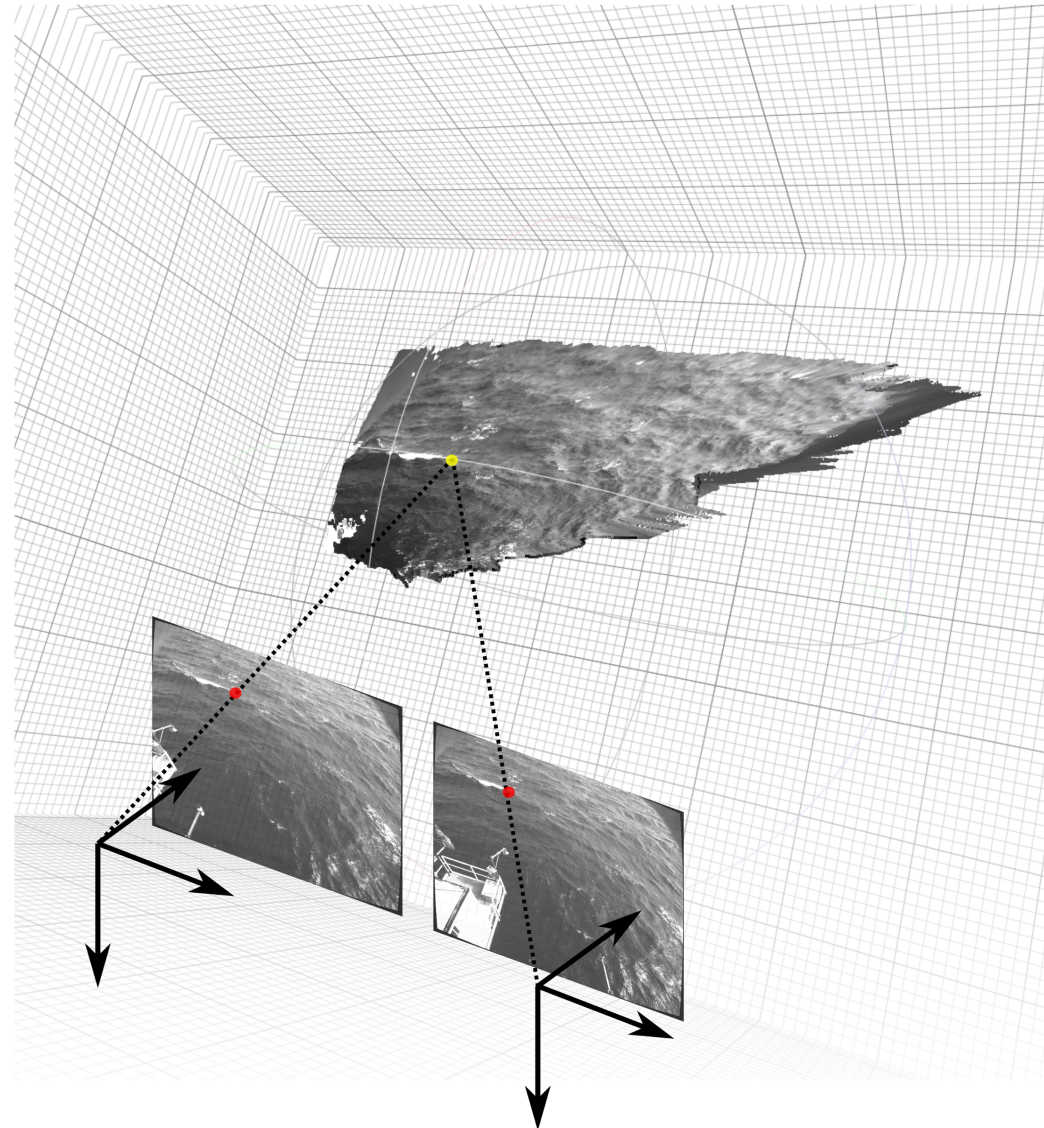
Depth of each point can be estimated by intersecting (triangulating) 3D rays passing through the corresponding points and the optical centers



Stereo-vision: principle of operation

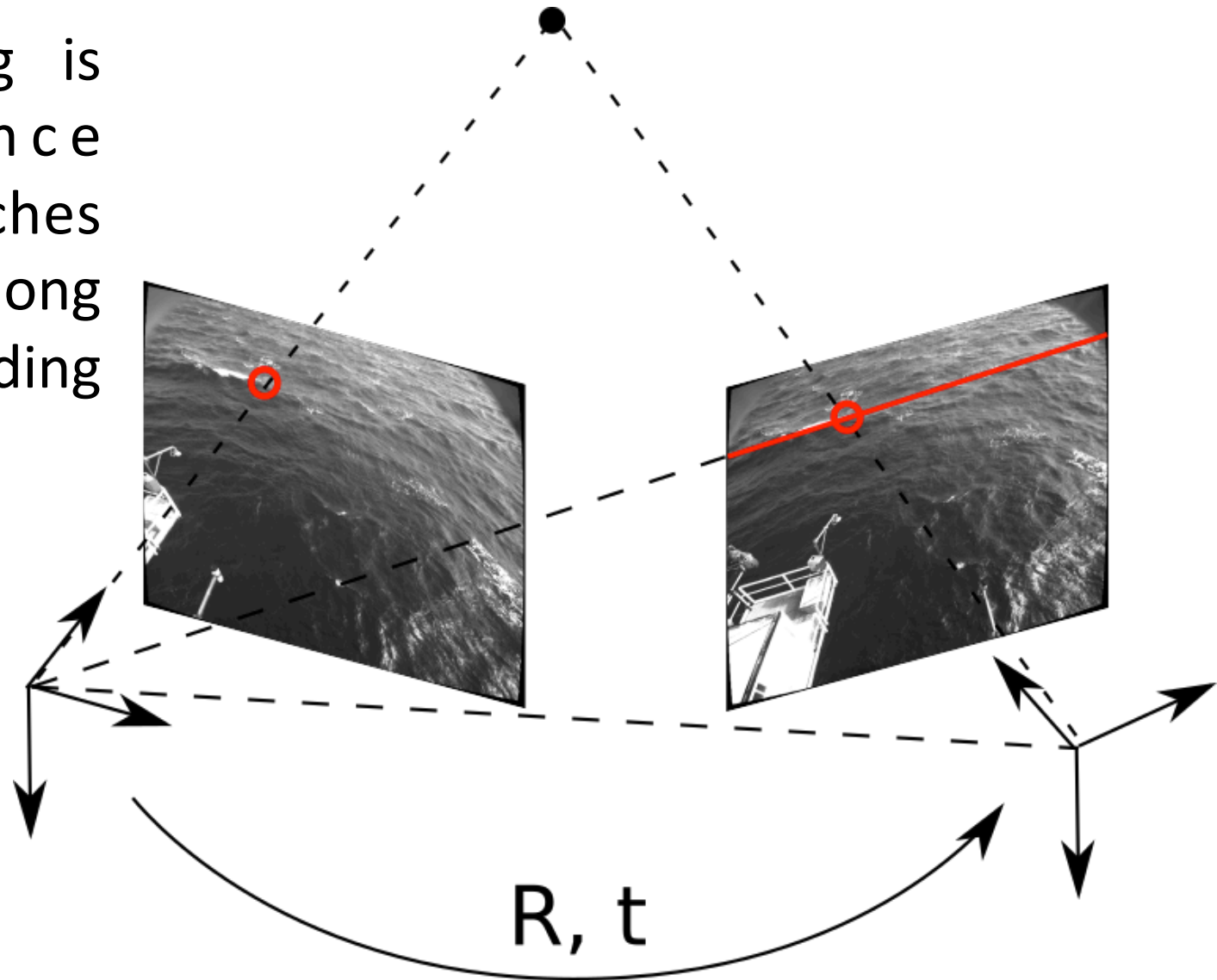
Problems

1. How to **match** points efficiently (robust and fast)?
2. How to accurately **calibrate** the system?
 - Intrinsic
 - Extrinsic (R, \mathbf{t})



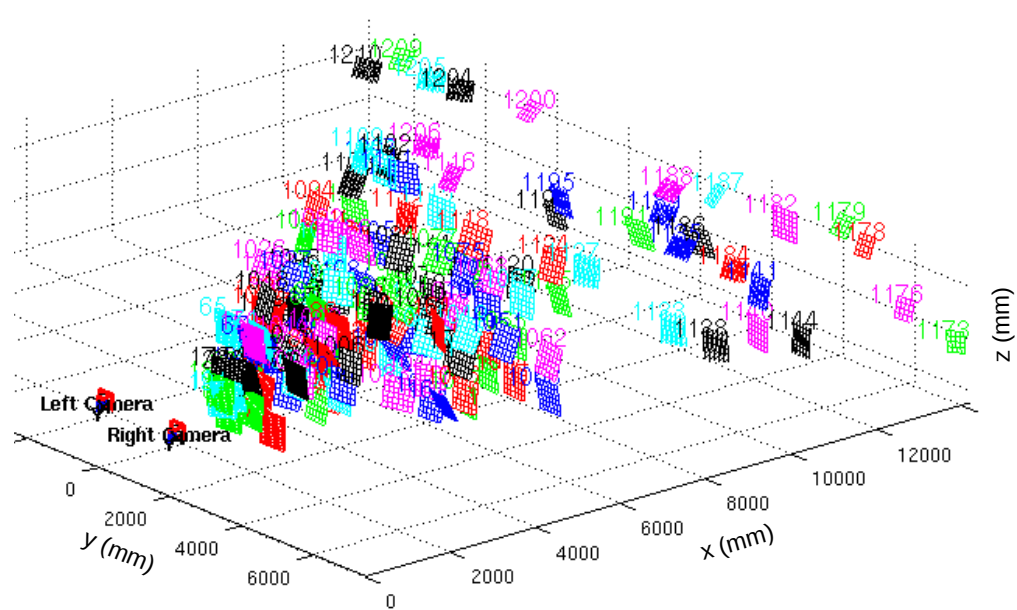
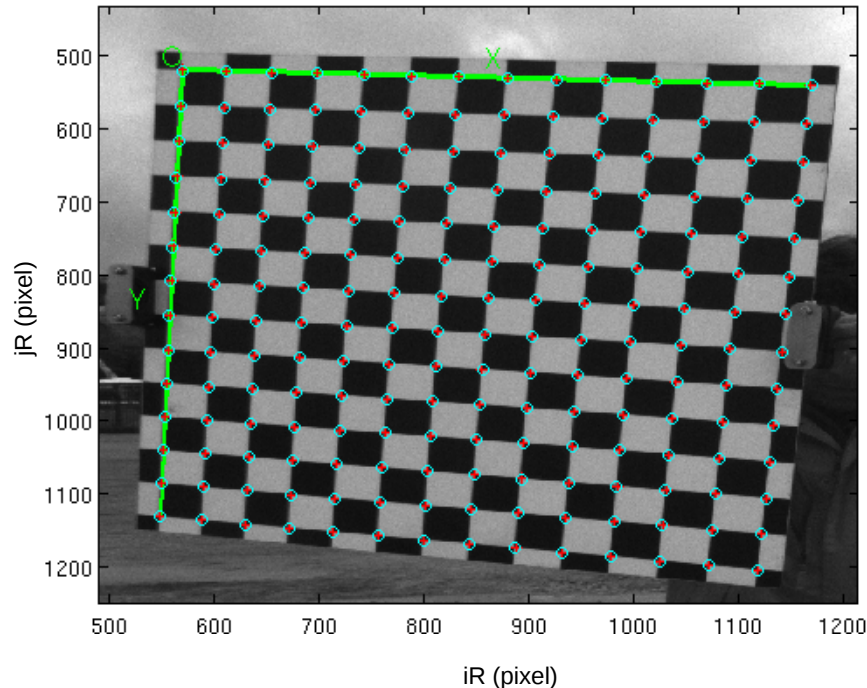
Matching corresponding points

Stereo-matching is **efficient** since potential matches can be found along each corresponding **epipolar lines**



Camera (intrinsic) calibration

- A **known object** (usually a planar chessboard) is imaged by the stereo rig in multiple poses to recover its **geometrical** properties.



Previous experiences

- [1] Chase, J.L *et al.* The directional spectrum of a wind generated sea as determined from data obtained by the Stereo Wave Observation Project *Department of Meteorology and Oceanography and Engineering Statistics Group* **03**, 267 (1957).
- [2] Sugimori, Y., A study of the application of the holographic method to the determination of the directional spectrum of ocean waves. *Deep-Sea Research and Oceanographic* **22**, (1975).
- [3] Holthuijsen, L. H., Observations of the directional distribution of ocean-wave energy in fetch-limited conditions. *Journal of Physical Oceanography* **13**, 191–207 (1983).
- [4] Shemdin, O. H., Tran, H. M., & Wu, S. C. Directional measurement of short ocean waves with stereophotography. *Journal of Geophysical Research: Oceans* **93**, 13891–13901 (1988).
- [5] Banner, M. L., Jones, I. & Trinders, J. c. Wavenumber spectra of short gravity waves. *Journal of Fluid Mechanics* **198**, 321–344 (1989).

**... lack of Computer Vision techniques and
Computing power...**

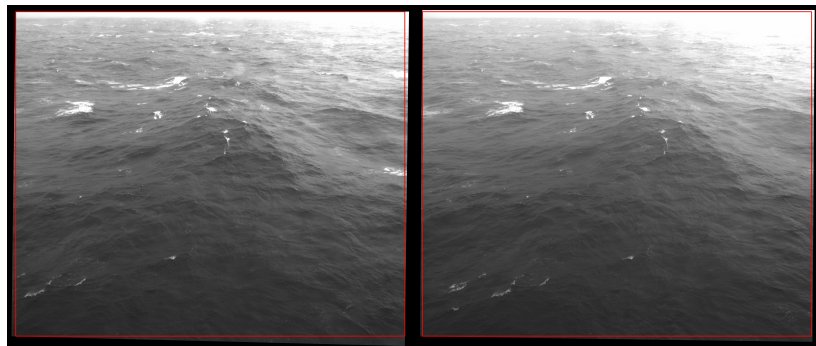
The WASS pipeline

In the past years, we proposed state-of-the-art methods in this field, contributing to the diffusion of the topic among the oceanographic community

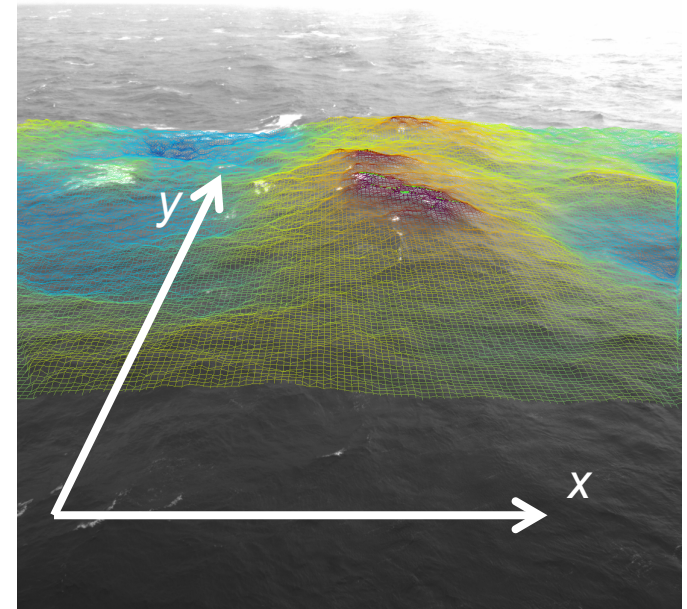
1. Stereo camera ***extrinsic calibration*** (R, t) from sea images
2. Point cloud ***filtering*** and mean sea-plane ***alignment***
3. Reconstruction ***errors*** varying the geometrical configuration of the stereo system
4. Reconstruction from ***moving*** vessels

WASS (Wave Acquisition Stereo System)

INPUT



WASS computes



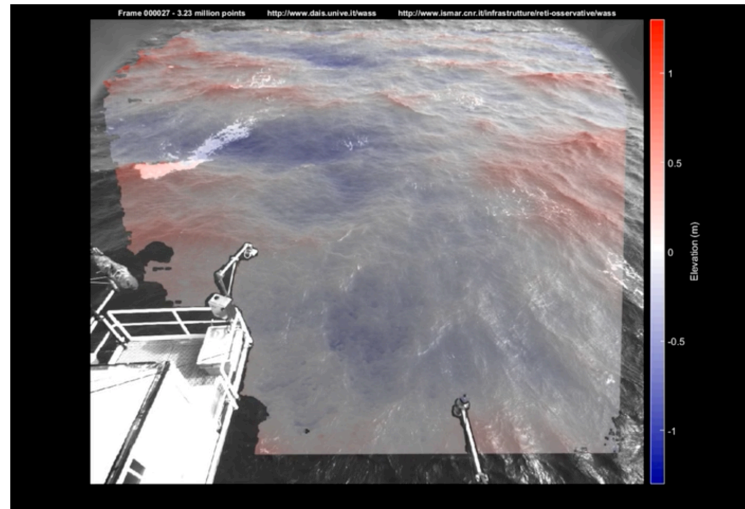
- ① Stereo frames (synch. < 1 ms)
- ② Camera intrinsic parameters
 - Focal length
 - Principal point
 - Lens distortion coefficients (calibrated in the lab)

- ① Stereo extrinsic parameters (R, \mathbf{t})
- ② Mean-sea-plane coefficients
- ③ 3D wave field $\eta(x, y)$ for each stereo pair

<http://www.dais.unive.it/wass> (Bergamasco et al., 2017. C&G)

Welcome to the WASS project

WASS (Waves Acquisition Stereo System) is an optimized stereo processing pipeline for sea waves 3D reconstruction.



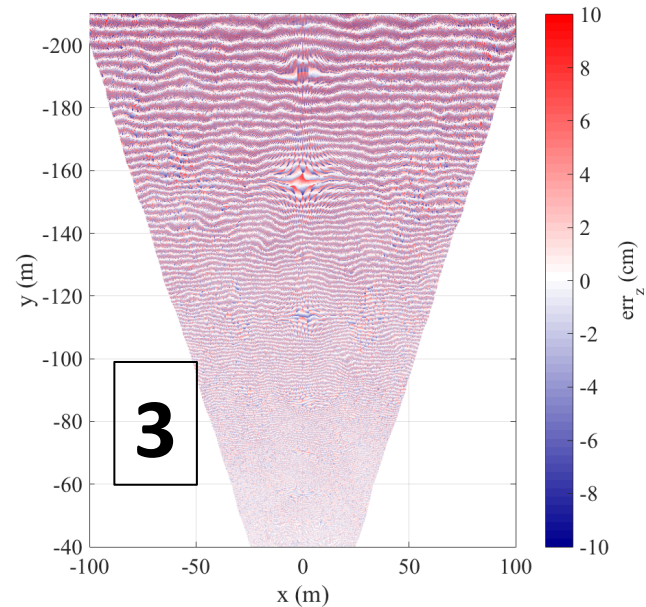
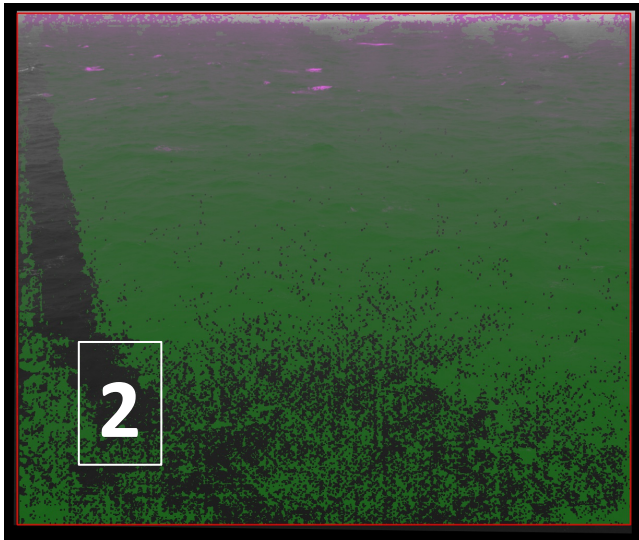
WASS was developed by [Filippo Bergamasco](<http://www.dsi.unive.it/~bergamasco/>) as a joint-collaboration between [Università Ca' Foscari di Venezia](<http://www.unive.it>) and [CNR ISMAR](<http://www.ismar.cnr.it>). It is a result of more than 3 years of active research with [Alvise Benetazzo](<http://www.ismar.cnr.it/people/benetazzo-alvise>) (CNR-ISMAR) in the field of vision-based 3D surface reconstruction of sea waves.



The first **open-source** software for sea-waves 3D reconstruction

Kinds of measurement error

1. **Calibration Error:** error in estimating **camera** parameters
2. **Matching Error:** uncertainty in the determination of the **corresponding** pixels for each image pair (dark, bright areas)
3. **Quantization Error:** reconstruction is **quantized** along the image scanlines producing characteristic patterns along the **y-axis**



We can simulate and **evaluate** the expected reconstruction **accuracy** given a stereo setup

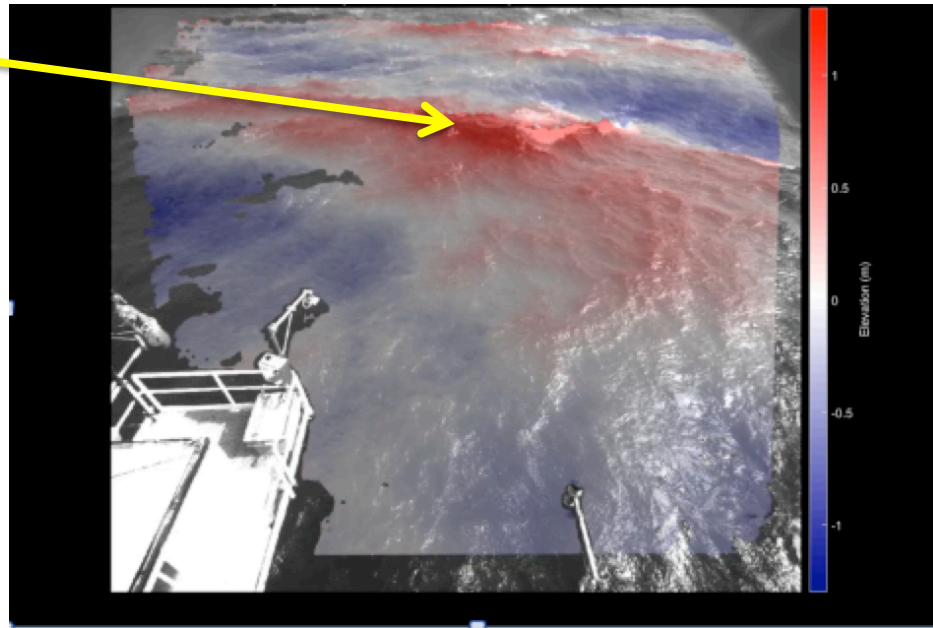
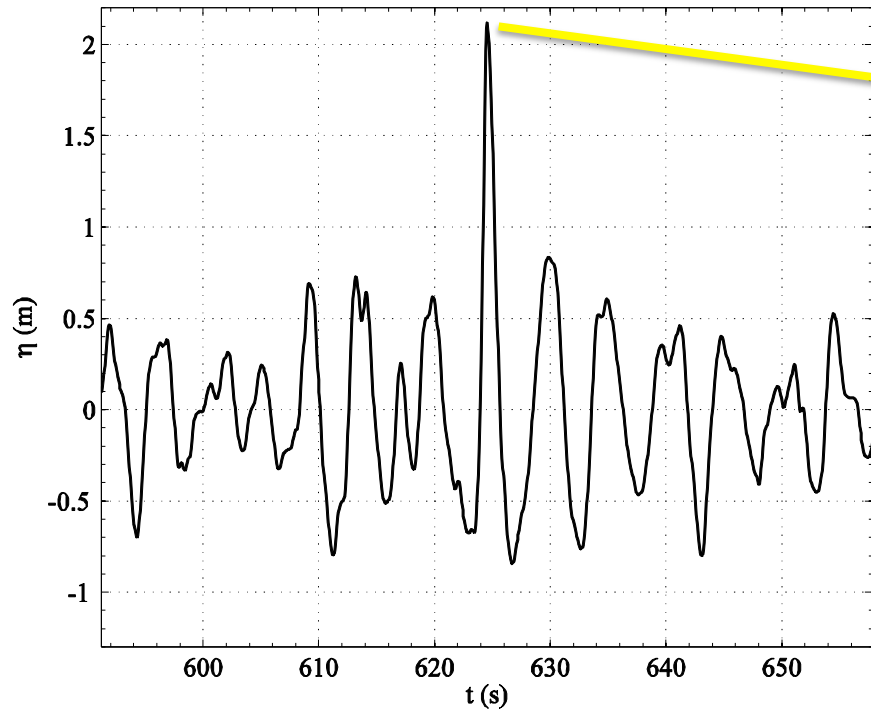
Latest Applications

How rogue waves look like in 3D



- Maxima at different locations on the xy -space
- Missed by local instruments (e.g., buoys)

Rogue waves in Space and Time



- ➔ Individual, rogue wave is isolated in time (...it seems to appear out of nowhere...) but coherent in space-time
- ➔ Likelihood and shape of rogue waves

(Benetazzo et al., 2015; Benetazzo et al., 2017)

Crest speed of high waves

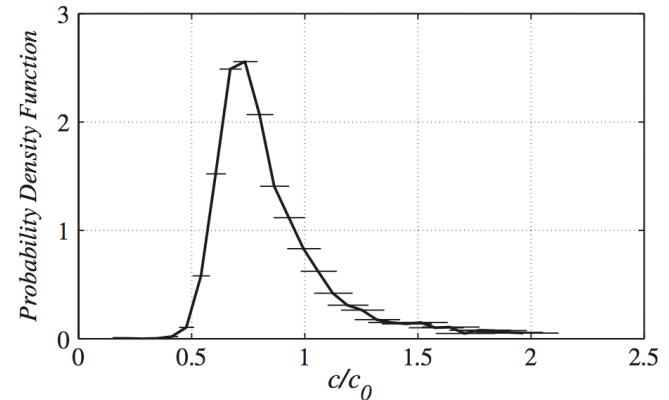
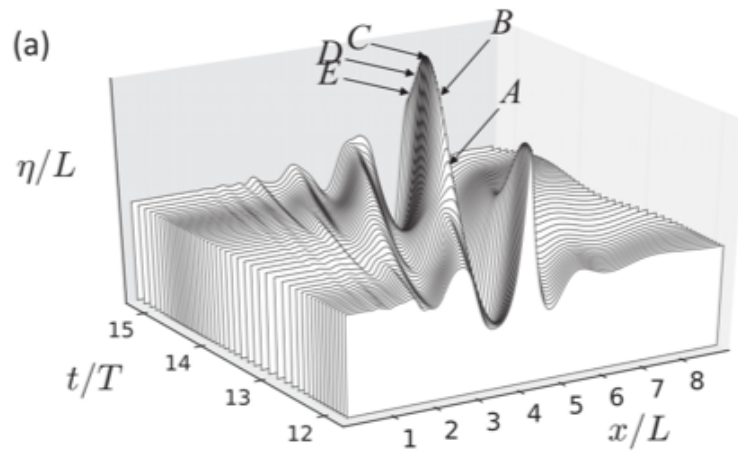


FIG. 3. Probability density function of normalized crest speed c/c_0 for all crests transitioning through a maximum local crest steepness, from a 35-minute WASS stereo-video sequence from an ocean tower. Note, the tall peak at $c/c_0 \sim 0.75$. Local standard error bounds are indicated.

Linking Reduced Breaking Crest Speeds to Unsteady Nonlinear Water Wave Group Behavior

M. L. Banner,^{1,*} X. Barthelemy,^{1,2} F. Fedele,³ M. Allis,² A. Benetazzo,⁴ F. Dias,⁵ and W. L. Peirson²

¹*School of Mathematics and Statistics, The University of New South Wales, UNSW Sydney, NSW 2052, Australia*

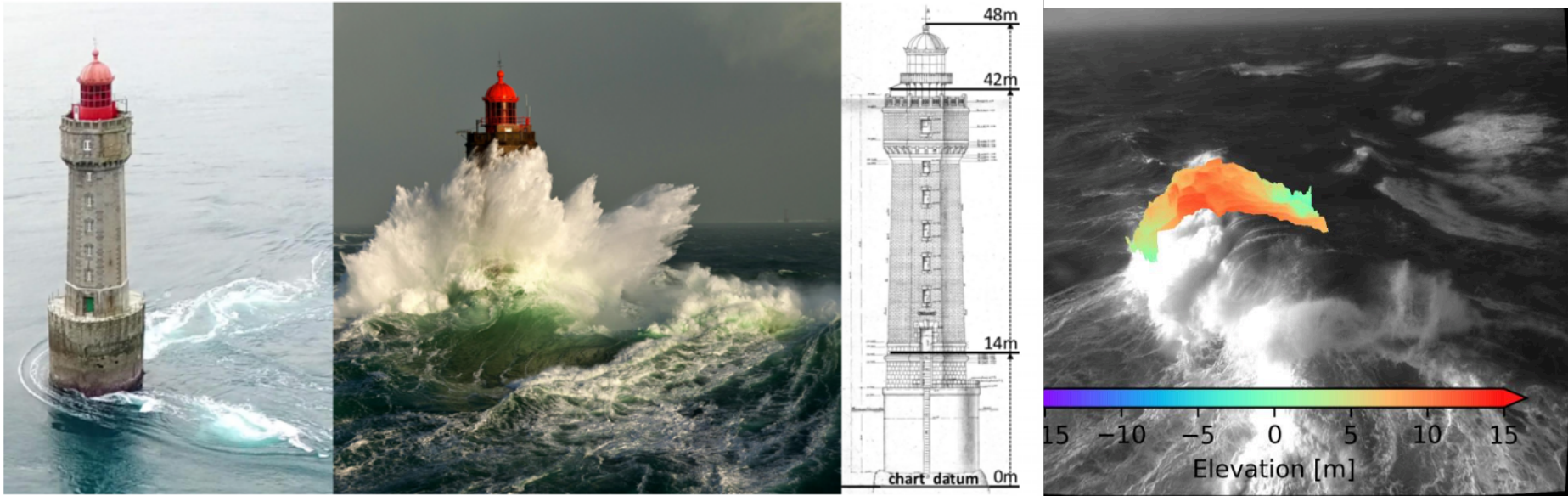
²*Water Research Laboratory, School of Civil and Environmental Engineering, The University of New South Wales, Manly Vale, New South Wales 2093, Australia*

³*School of Civil and Environmental Engineering, and School of Electrical and Computer Engineering, Georgia Institute of Technology, Atlanta, Georgia 30332, USA*

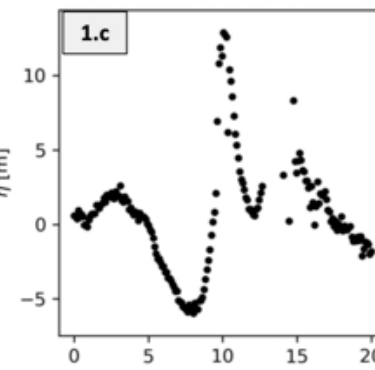
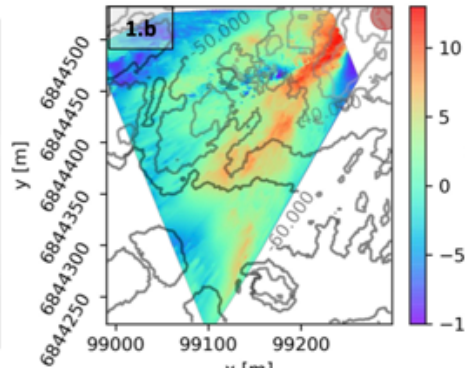
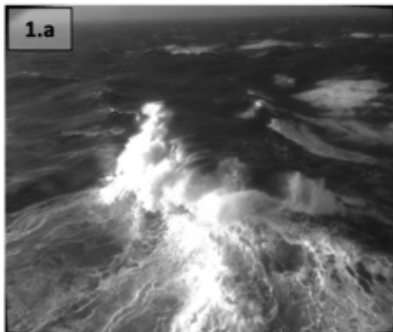
⁴*Institute of Marine Sciences, National Research Council (CNR-ISMAR), Venice 30122, Italy*

⁵*UCD School of Mathematical Sciences, University College Dublin, Belfield, Dublin 4, Ireland*

Wave load on marine structures



2018-01-03T09:42:08.699



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TRANSACTIONS A

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Research



Article submitted to journal

Subject Areas:
heritage structure, extreme waves,
lighthouse

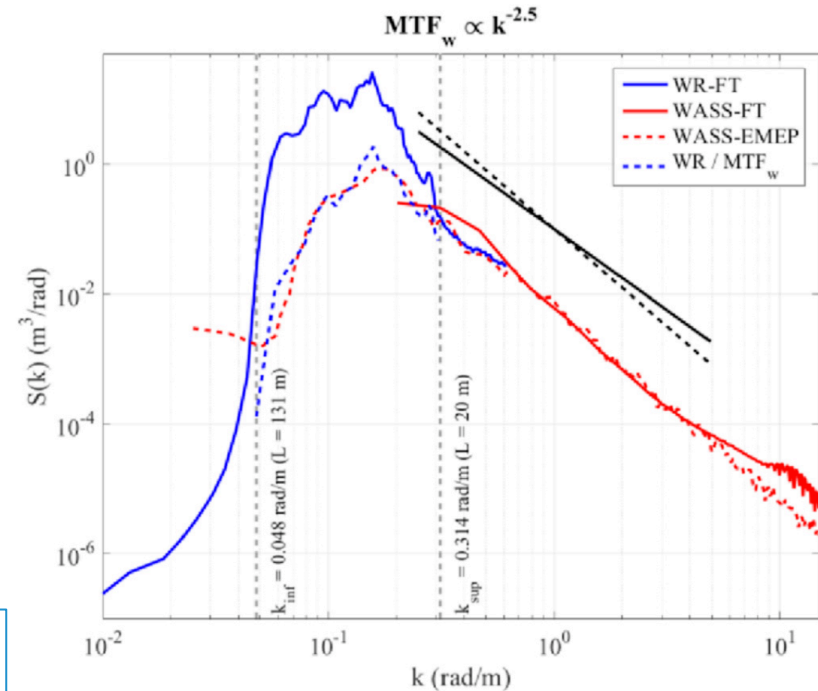
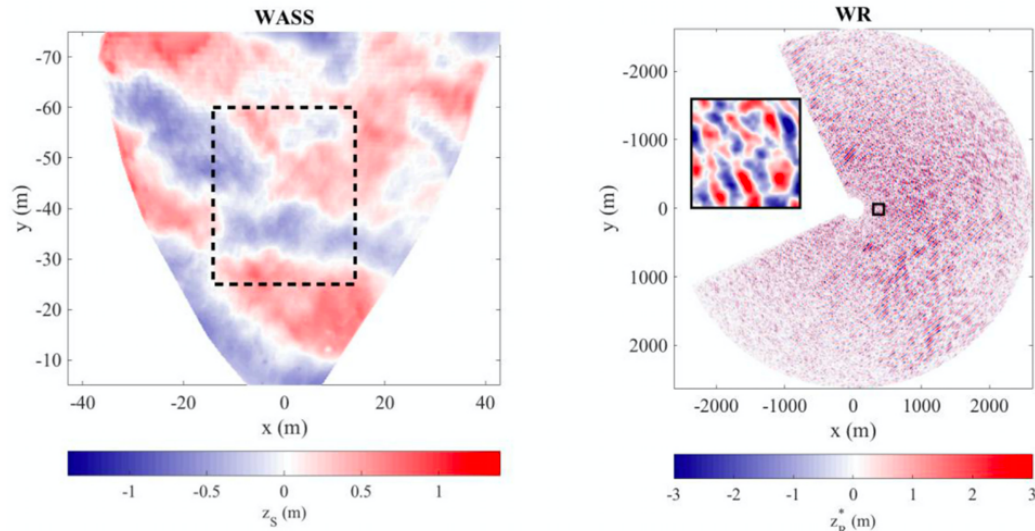
Keywords:
extreme wave, wave breaking, wave
loading

La Jument Lighthouse: a real
scale laboratory for the study
of giant waves and of their
loading on marine structures

J.-F. Filipot¹, P. Guimaraes², F. Leckler², J.
Hortsmann³, R. Carrasco³, E. Leroy⁴, N.
Fady⁴, M. Prevosto⁵, V. Roeber⁶, A.
Benetazzo⁷, C. Raoult², M. Franzetti⁸, A.
Varing¹, N. Le Dantec⁴

¹France Energies Marines, Plouzané, France, ²Shom,
Brest, France, ³HZG, Geestacht, Germany, ⁴Cerema,
Plouzané, France, ⁵Ifremer, Plouzané, France ⁷CNR,
Venice, Italy, ⁸IUEM-LGO, Plouzané, France

Stereo/x-band radar data fusion



Contents lists available at [ScienceDirect](https://www.sciencedirect.com)

Ocean Engineering

journal homepage: www.elsevier.com/locate/oceaneng

Stereo imaging and X-band radar wave data fusion: An assessment

Alvise Benetazzo^{a,*}, Francesco Serafino^b, Filippo Bergamasco^c, Giovanni Ludeno^d,
Fabrice Ardhuin^e, Peter Sutherland^e, Mauro Sclavo^a, Francesco Barbariol^a

^a Institute of Marine Sciences, Italian National Research Council (ISMAR-CNR), Venice, Italy

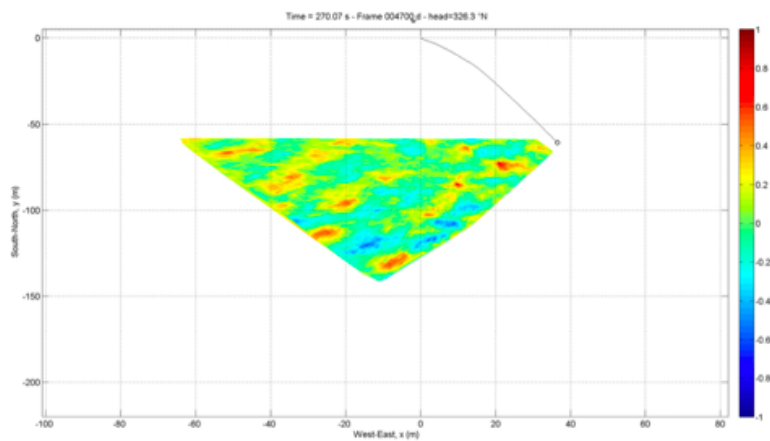
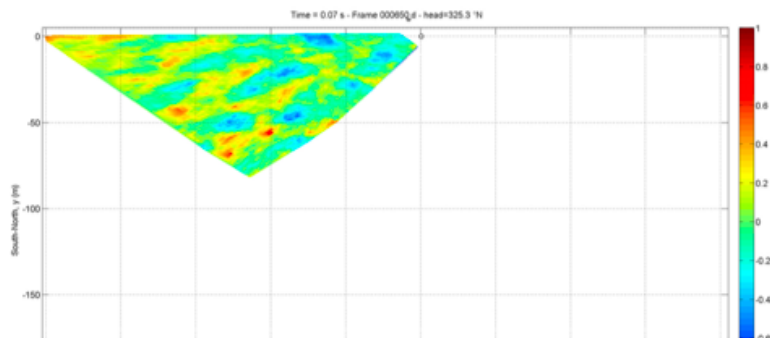
^b Institute of Biometeorology, Italian National Research Council (IBIMET-CNR), Florence, Italy

^c DAIS - Università Ca' Foscari, Venice, Italy

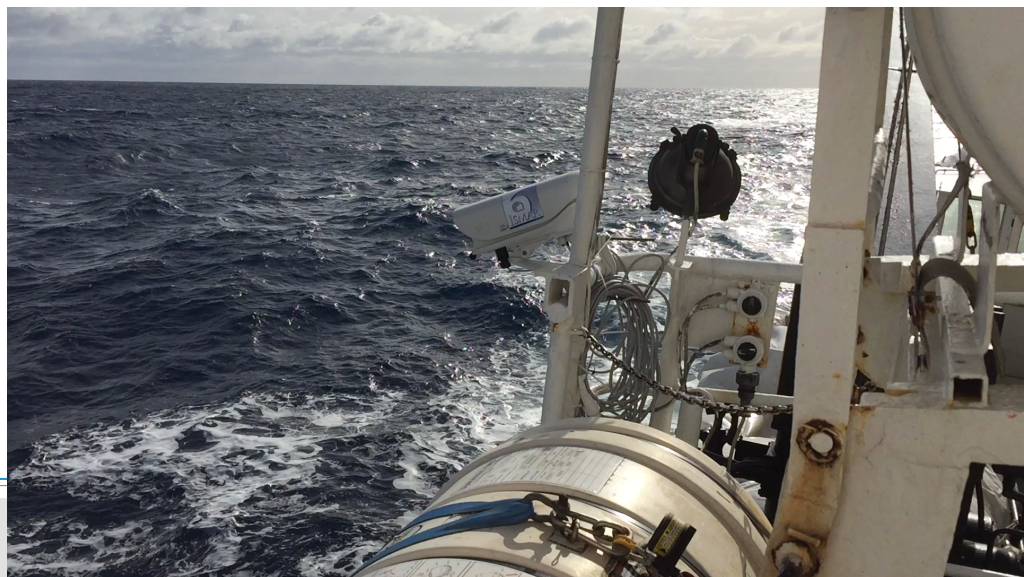
^d Institute for Electromagnetic Sensing of the Environment, Italian National Research Council (IREA-CNR), Naples, Italy

^e Laboratoire d'Océanographie Physique et Spatiale (LOPS), Univ. Brest, CNRS, Ifremer, IRD, Brest, France

From a moving ship



→ Coupling with an **IMU** for the 6-DOF motion



Contents lists available at ScienceDirect

Coastal Engineering

journal homepage: www.elsevier.com/locate/coastaleng

Stereo wave imaging from moving vessels: Practical use and applications

Alvise Benetazzo ^{a,*}, Francesco Barbariol ^a, Filippo Bergamasco ^b, Andrea Torsello ^b, Sandro Carniel ^a, Mauro Sclavo ^a

^a Institute of Marine Sciences, Italian National Research Council (ISMAR-CNR), Venice 30122, Italy

^b DAIS - Università Ca' Foscari, Venice, Italy

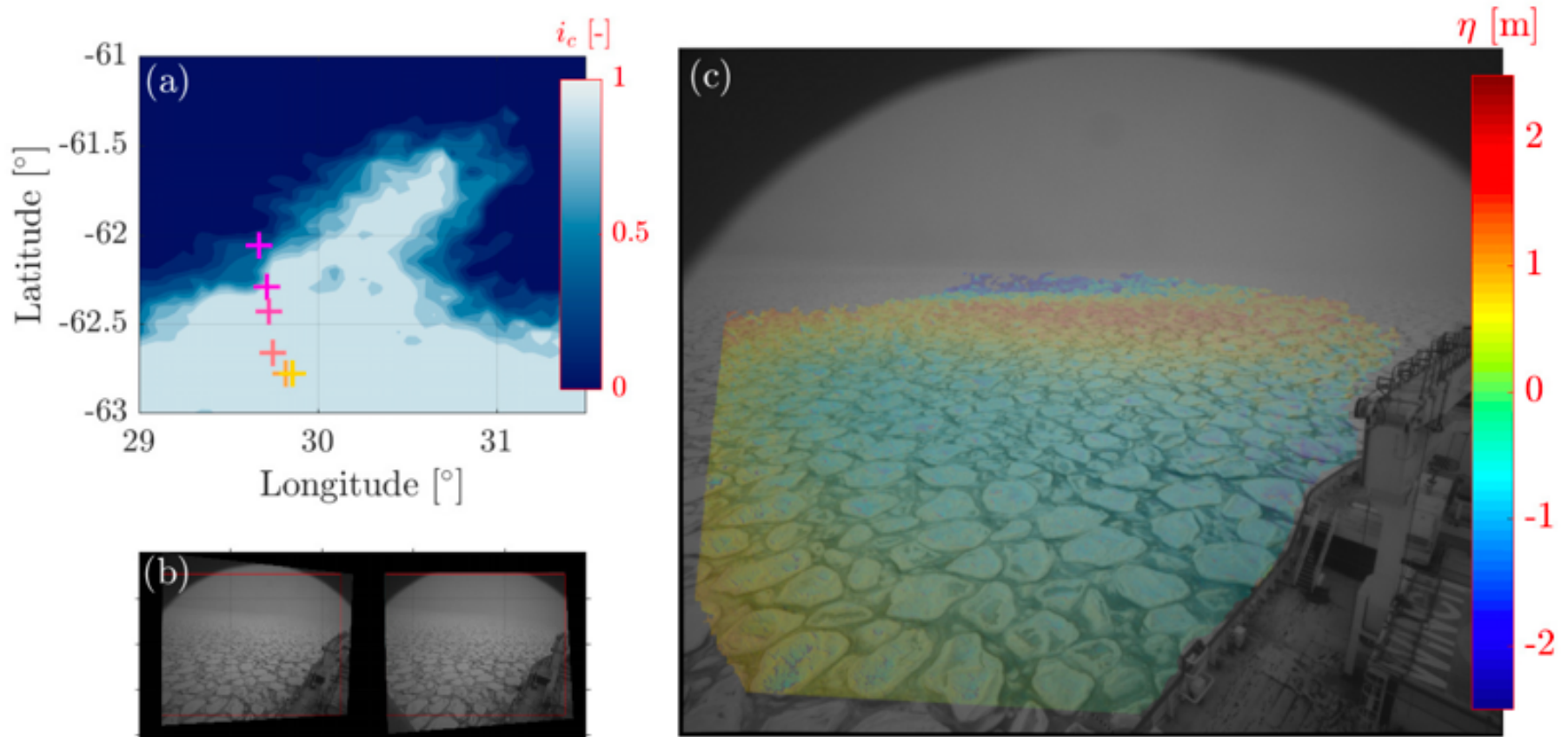
Sharp-Crested Breaking Surface Waves Observed from a Ship-Based Stereo Video System

MICHAEL S. SCHWENDEMAN AND JIM THOMSON

Applied Physics Laboratory, University of Washington, Seattle, Washington

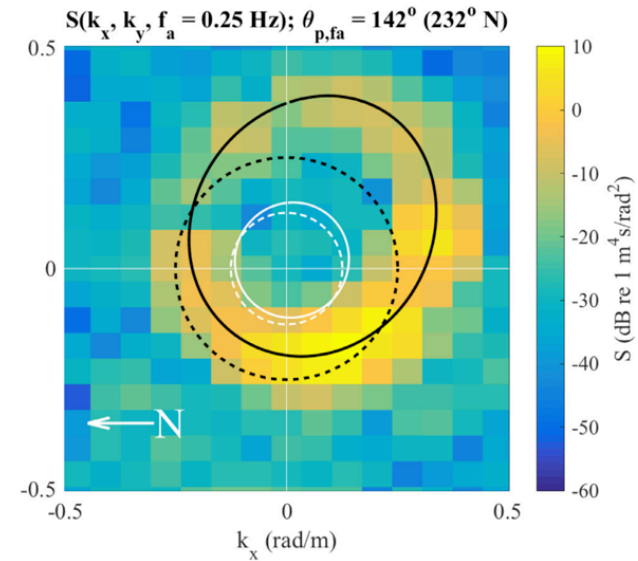
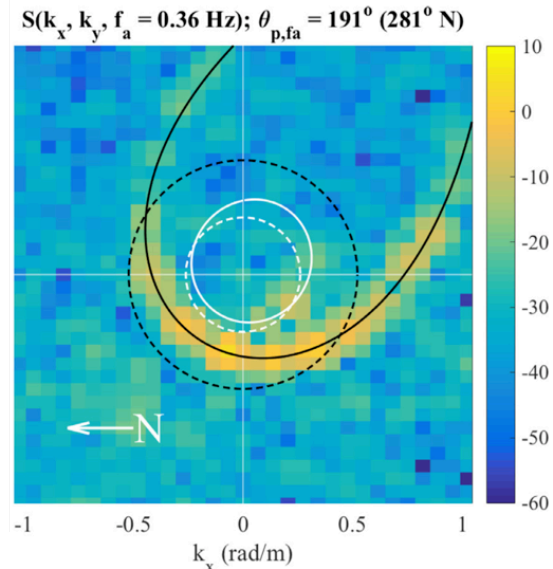
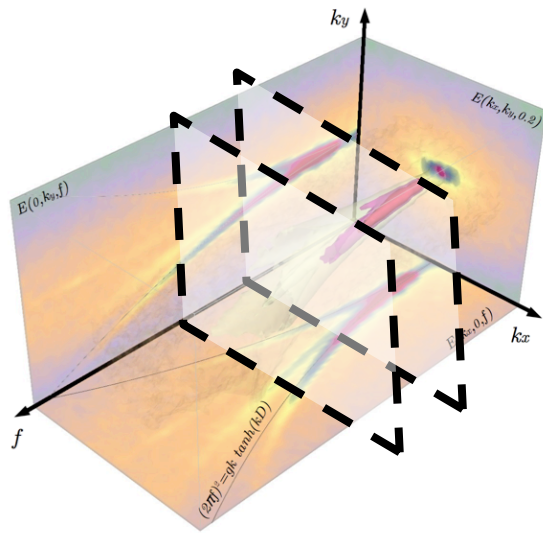
(Manuscript received 9 August 2016, in final form 24 January 2017)

Wave dissipation in the MIZ



➔ Wave fields (from 3D) and sea-ice concentration (from images)

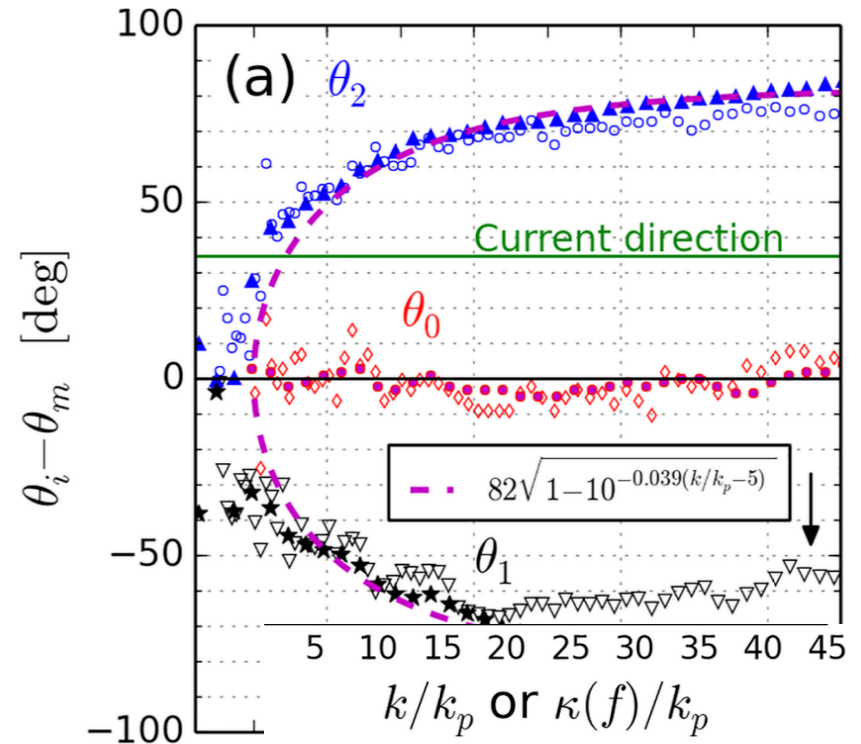
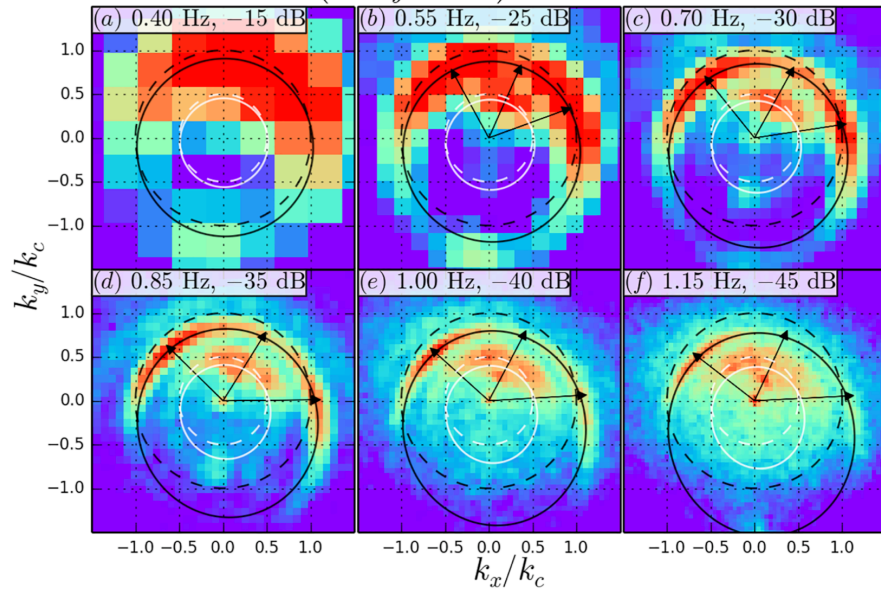
Wavenumber-Frequency 3D spectrum



- Oceanic near-surface current (via Doppler shift)
- Energy of linear / nonlinear modes
- Directionality of short waves

Bi-modal distribution of short-wave energy

$$E(k_x, k_y, f = f_c) \text{ [dB re m}^4 \text{ s]}$$



Ocean Sci., 14, 41–52, 2018
<https://doi.org/10.5194/os-14-41-2018>
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Ocean Science

Note on the directional properties of meter-scale gravity waves

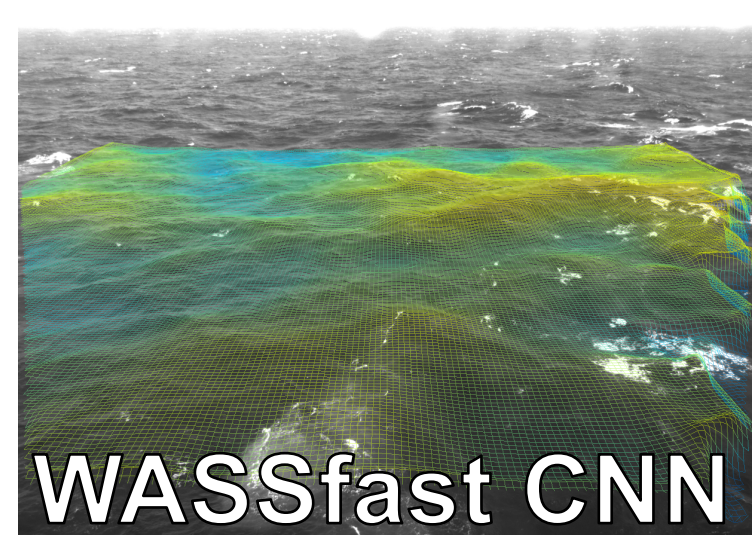
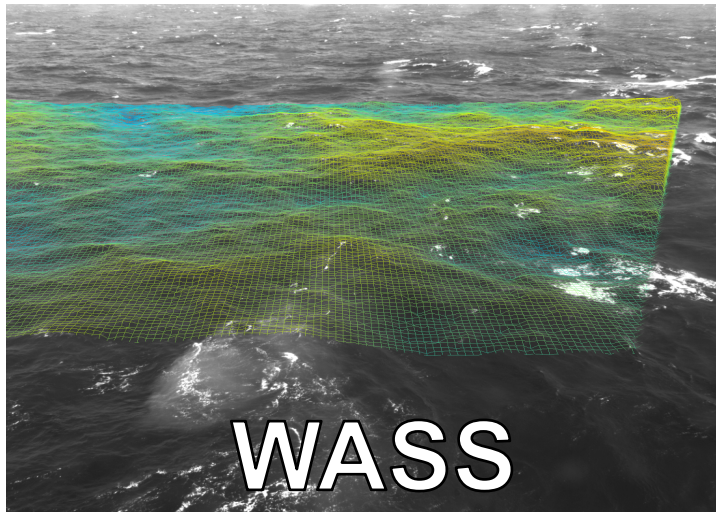
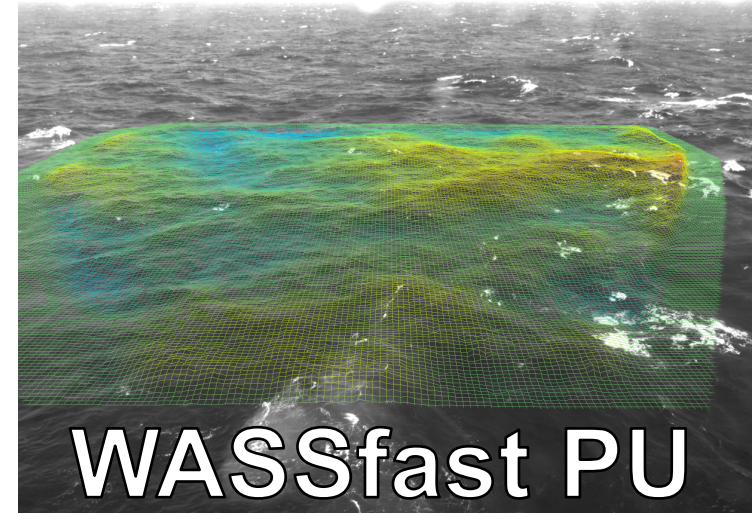
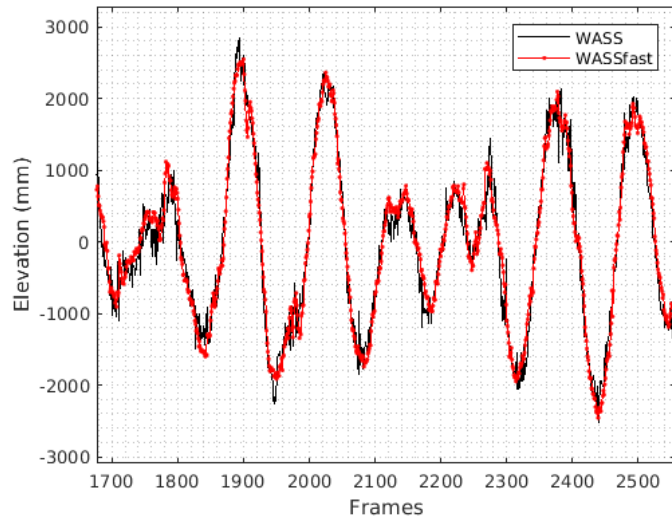
Charles Peureux¹, Alvise Benetazzo², and Fabrice Ardhuin¹

¹Laboratoire d'Océanographie Physique et Spatiale, Univ. Brest, CNRS, Ifremer, IRD, 29200 Plouzané, France

²Institute of Marine Sciences, Italian National Research Council, Venice, Italy

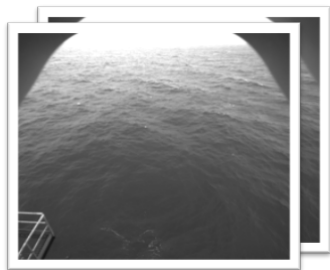
Present research: WASSfast

WASS computes a 3D wave field from stereo pair in ~ 1 min (half of the time is spent for *gridding* from the point cloud)

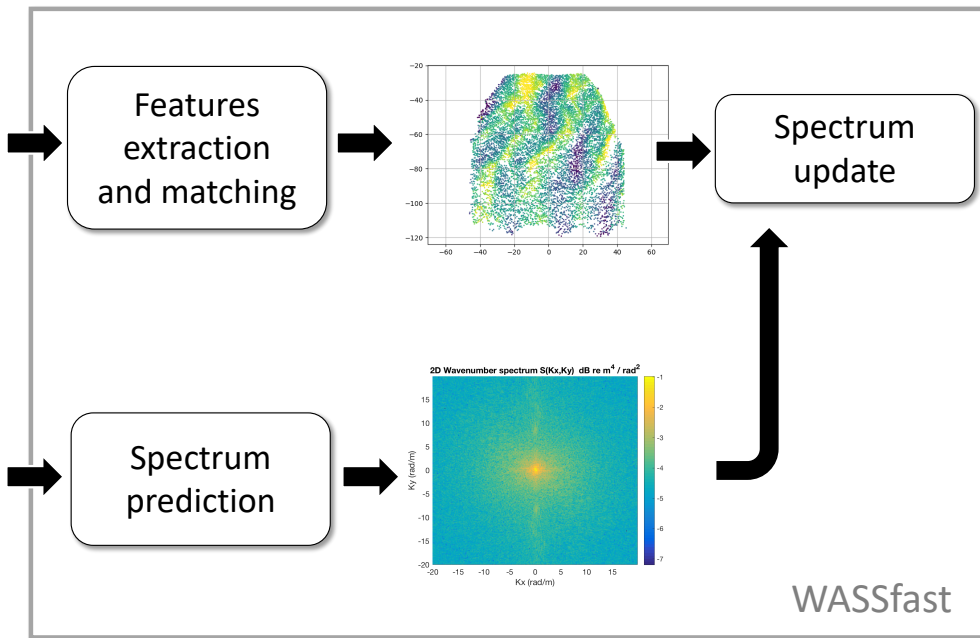
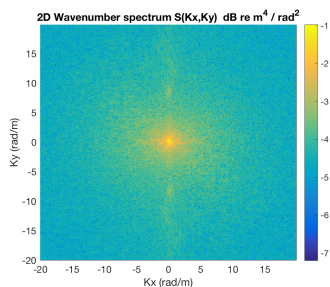


WASSfast

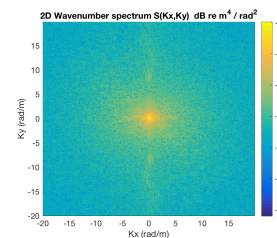
Stereo frames
at time t



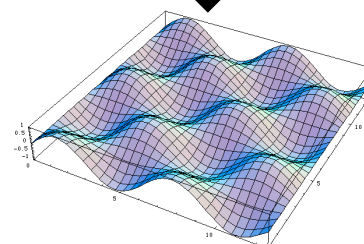
Estimated spectrum
at time $t-1$



Estimated spectrum
at time t



2D FFT



Surface at time t

WASSfast: spectrum update

Two alternative approaches

- 1. PU:** A constrained minimization procedure working in the Fourier wavenumber domain
 - Slower, more accurate
- 2. CNN:** A learning-based Convolutional Neural Network to perform “depth completion” based on physical priors
 - Extremely fast, slightly less accurate in the high frequencies, still under heavy testing...

WASS vs. WASSfast

- Reconstructs a dense point cloud (approx. **3E6 points** per stereo pair on a 5mpix camera)
- Frames are processed in parallel and no temporal relation is considered
- Gridding is a separate step implemented as a general scattered surface interpolation
- **Highly accurate**, well tested
- Approx. **30 sec** per stereo frame processing time
- Reconstructs a sparse point cloud for each frame (**10K** on average)
- Frames are processed sequentially, the dispersion relation is used to optimize a time-evolving 3D surface
- Gridding is interleaved with point reconstruction
- **Less accurate**, designed for real-time processing
- **Up to from 0.5 fps (PU) to 5 fps (CNN) on modern GPUs**

Low-cost WASS with smartphones / GoPro®

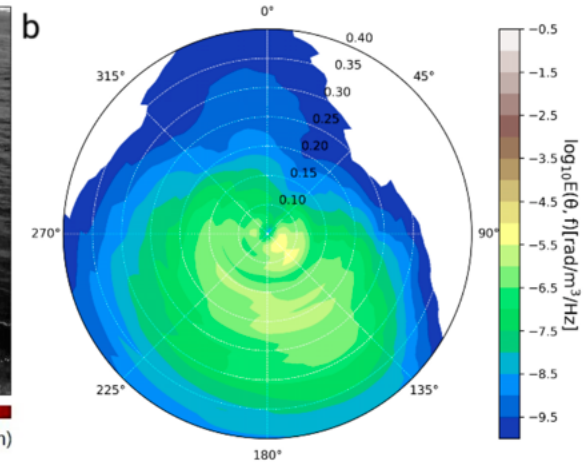
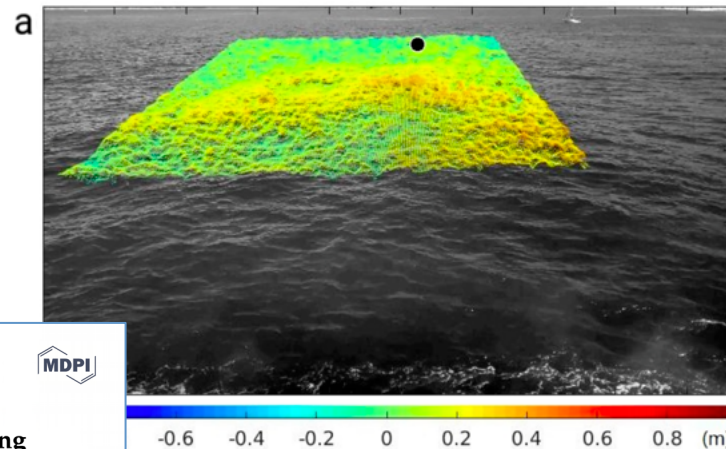


Appendix A

The following two codes were written in *Python* and *praat* programming language respectively and were applied to synchronize video data acquired by the smartphones as described in the Section 3.1—*Frame synchronization*.

wass_sync.py

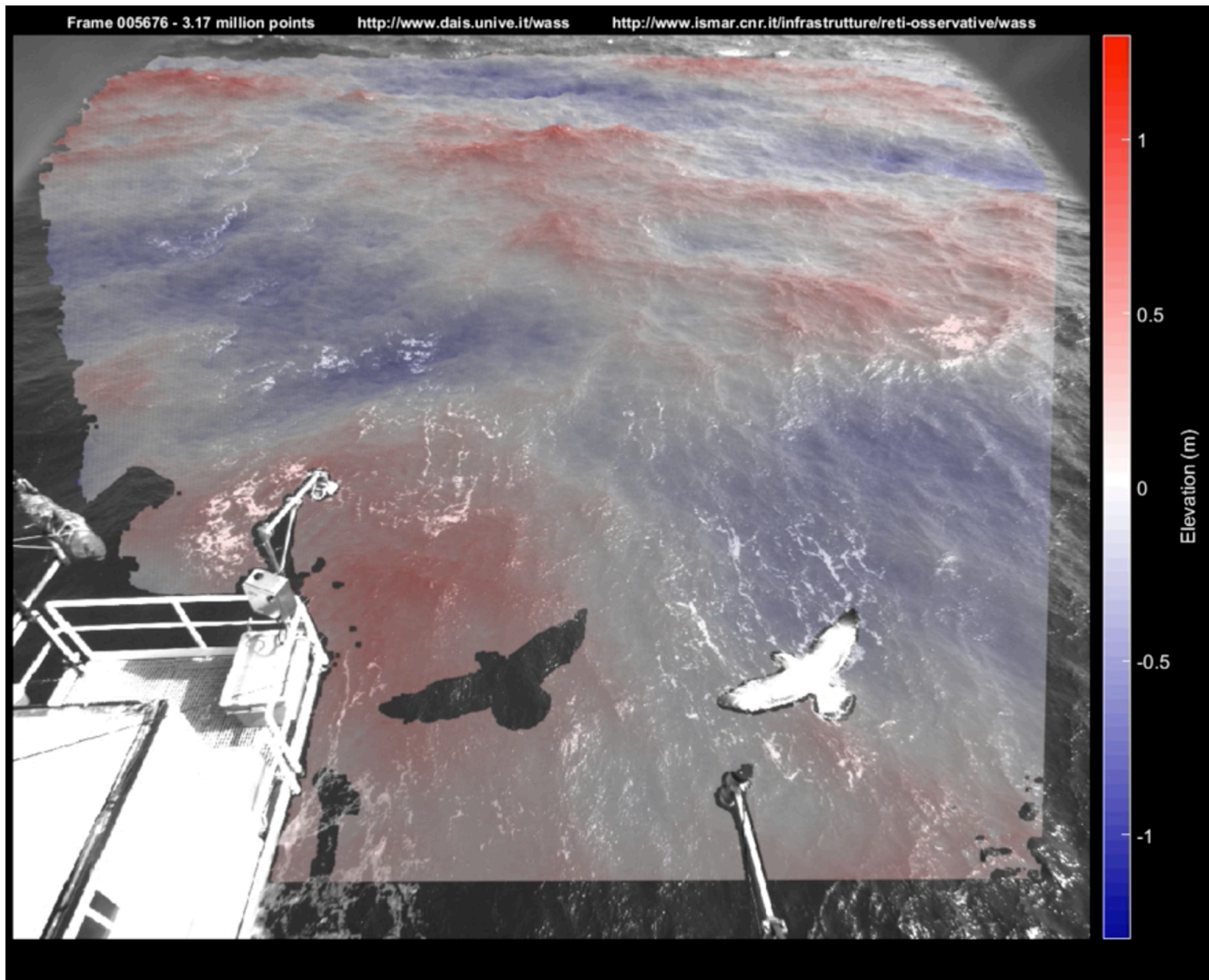
```
'''
author: matheus vieira
needs: Python 2 or 3 / ffmpeg software / Praat software
- set video path (pathname)
- video files (cam0.mp4, cam1.mp4)      inside video path
- path called 'cam0'                    inside video path
- path called 'cam1'                    inside video path
- crosscorrelate.praat file              inside video path
'''
```



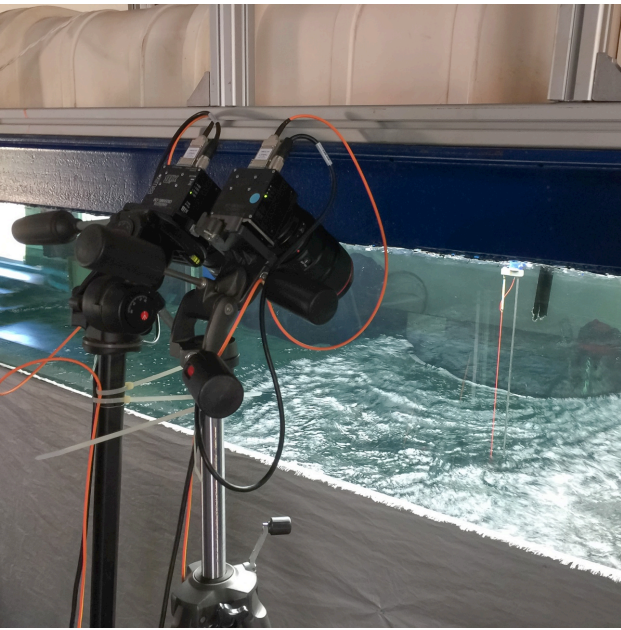
Take home message

- Stereo wave imaging allows to measure the surface wave field in space and time with good accuracy
- No assumptions on the underlying wave mechanics
- Fitting ships of opportunity (code not available yet)
- Limitations
 - Coverage
 - Need of a superstructure (with power supply)
 - Huge amount of data (less with WASSfast)

Many thanks for your attention!



Paddle- and wind-wave tank (Qingdao, P.R. China; FIO)



Paddle- and wind-wave tank (Qingdao, P.R. China; FIO)

