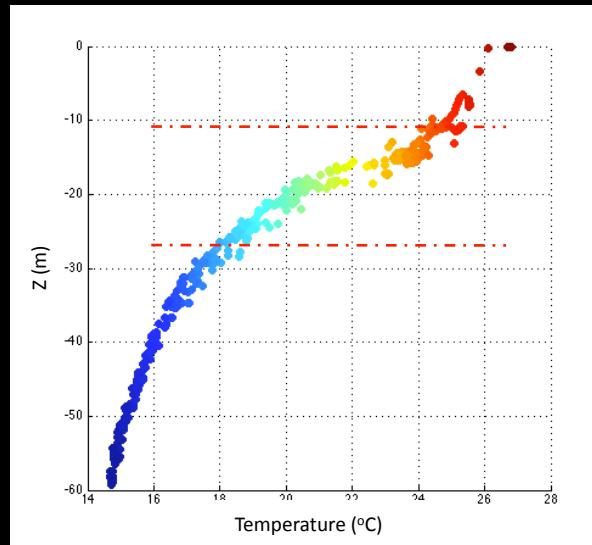


# Autonomous Adaptive Environmental Feature Tracking via Autonomous Underwater Vehicles

## - Tracking the Thermocline -



Stephanie Petillo  
MIT/WHOI Joint Program

MIT Laboratory for Autonomous Marine Sensing Systems

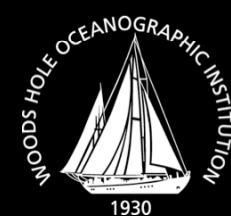
Arjuna Balasuriya & Henrik Schmidt  
MIT Laboratory for Autonomous Marine Sensing Systems



Massachusetts Institute of Technology

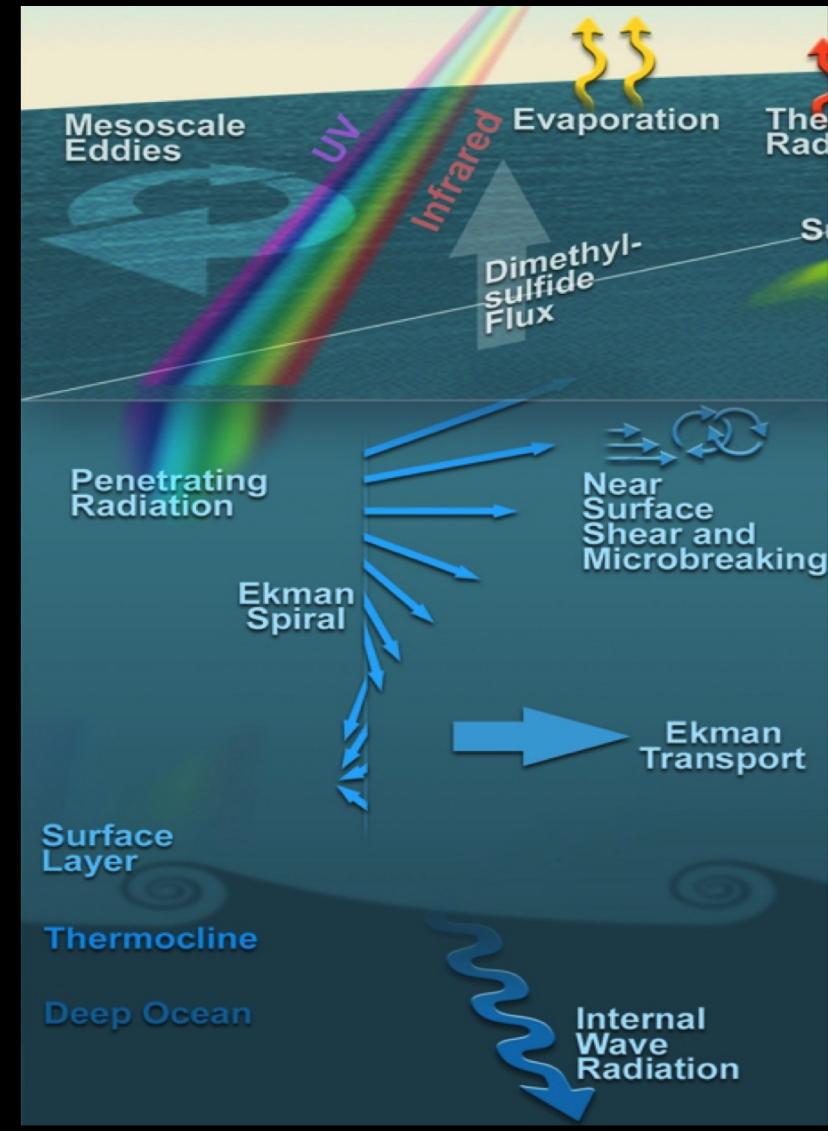
MOOS-DAWG 2010

MIT – Cambridge, MA – 25 August, 2010



# Background & Motivation: *The Missing Piece*

- Bridge Science and Engineering
- Incorporate real-time instrumental (e.g., CTD) data into adaptive sampling behaviors on board AUVs
  - Track oceanographic features
    - Thermoclines, haloclines, pycnoclines
    - Sound speed
    - O<sub>2</sub> & Cl concentrations, fluorescence
    - Light attenuation
    - Fronts
    - Currents

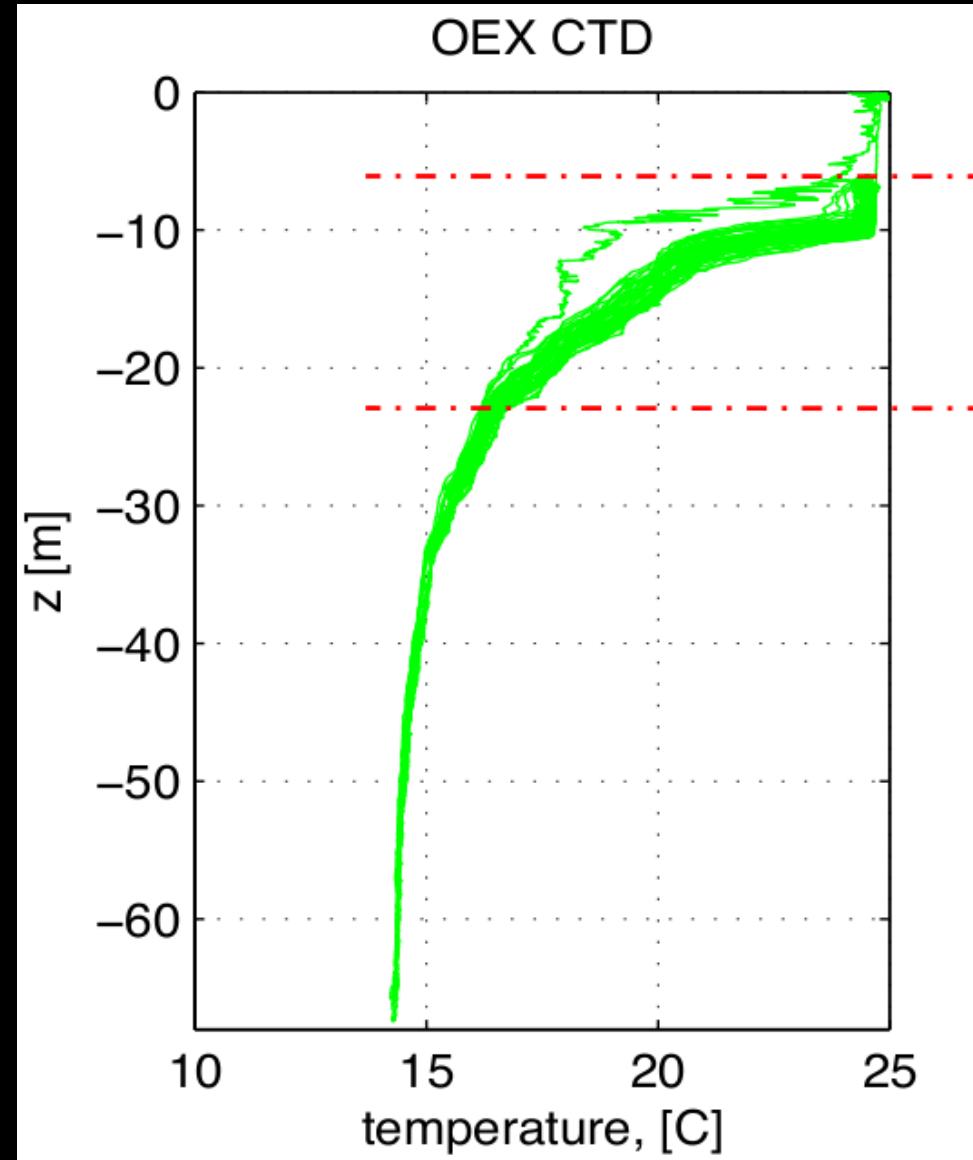


Oceanographic Features<sup>1</sup>

# Background & Motivation:

## *What is a Thermocline?*

- Thermally stratified body of water...
- Warmer surface water
- Middle layer in which temperature decreases rapidly with depth
- Cold deep water

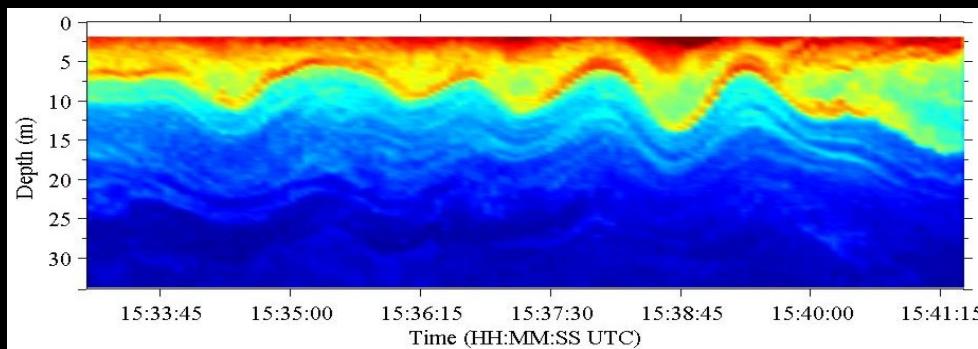


Thermocline region between dotted lines

# Background & Motivation:

## *Thermocline Tracking*

- Example and proof-of-concept of autonomous adaptive environmental feature tracking
- Present in most large bodies of water
- Most AUVs are equipped with a CT or CTD sensor
- Widely studied in the oceanographic community
  - Acoustic communications
  - Biology - phytoplankton, plankton and plankton-eating fish
  - Physical oceanography - surface mixing, internal waves



Internal Waves<sup>2</sup>



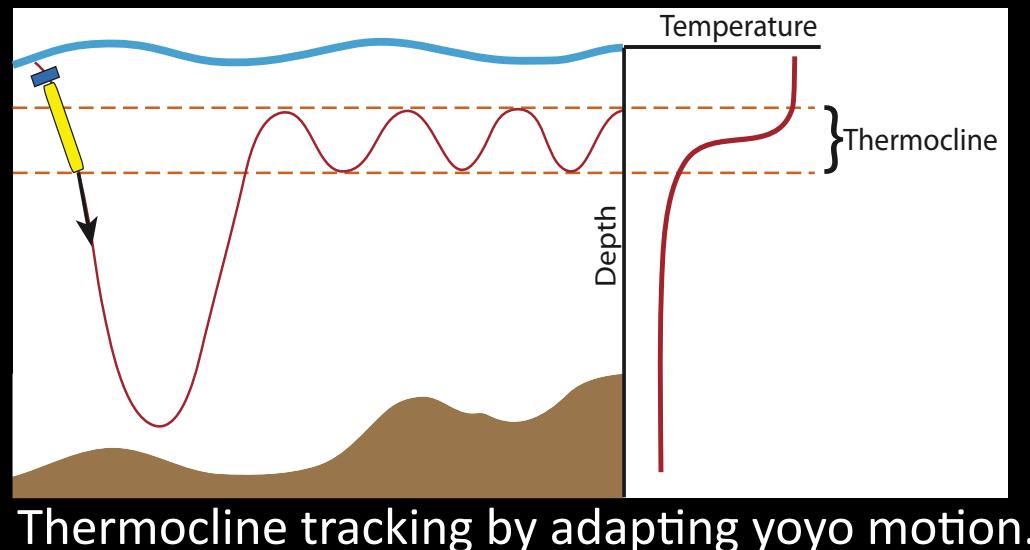
CTD<sup>1</sup>

<sup>1</sup>[www.seabird.com](http://www.seabird.com)

<sup>2</sup>[myweb.dal.ca/kelley/SLEIWEX](http://myweb.dal.ca/kelley/SLEIWEX)

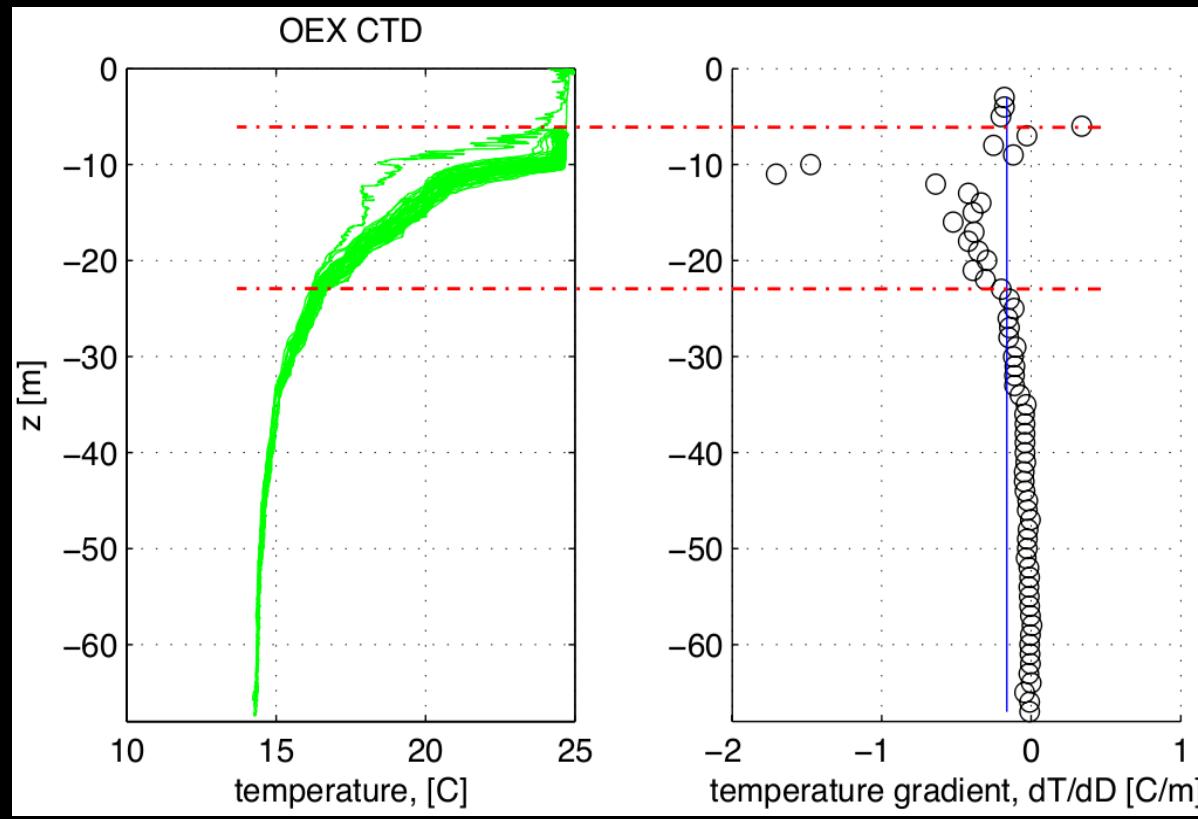
# Autonomous Adaptive Feature Tracking (AAFT): *Problem Definition*

- Vehicle moving through the water column in time and space
- Where is the thermocline (or any feature)?
  - Based on *just* the environmental information the AUV collects and processes *on board*
- Completely autonomous (MOOS-IvP)
- Quantitatively define thermocline



# Autonomous Adaptive Feature Tracking (AAFT): *Thermocline Definition*

- Quantitative
  - The depth range over which the vertical derivative of temperature,  $dT/dz$ , exceeds a threshold value



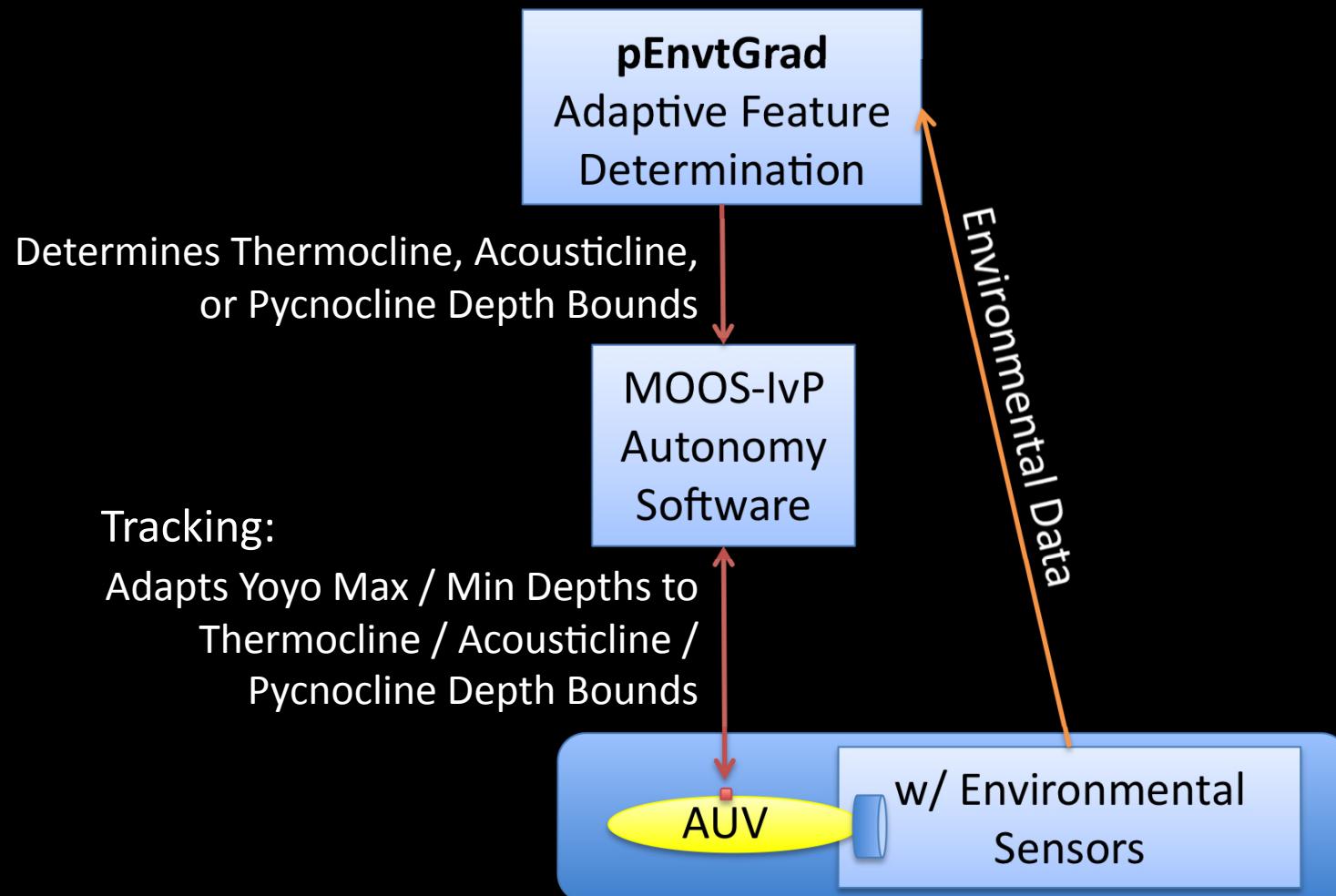
Thermocline region between dotted lines

# AAFT: *MOOS Implementation*

- pEnvGrad (process: Environmental Gradient)
  - Environmental gradient determination process
    - used with adaptive yoyo (toggle depth) behavior
  - Quantitatively defines and detects
    - Thermocline
    - Acousticline
    - Pycnocline



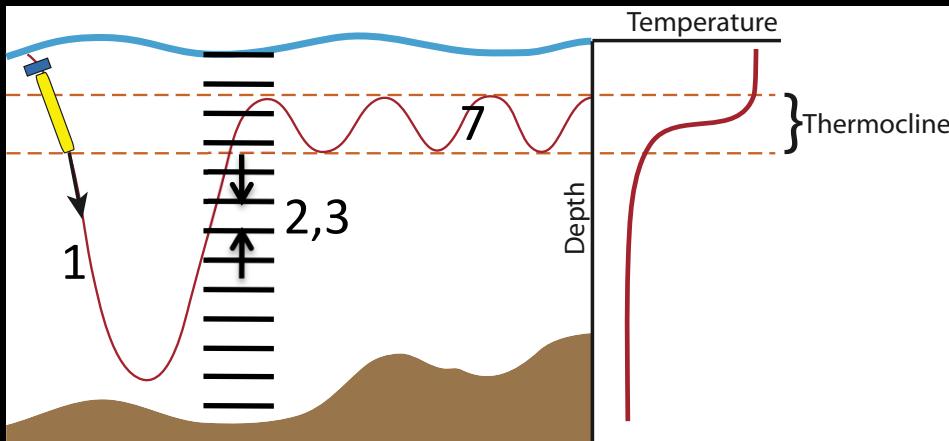
# AAFT: *Implementation, cont.*



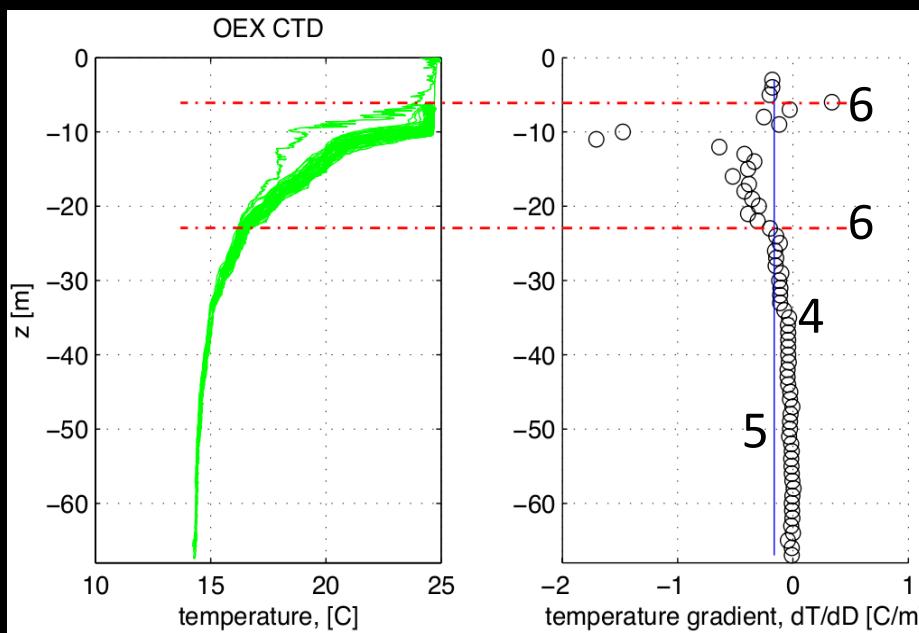
# AAFT:

## *pEnvGrad*

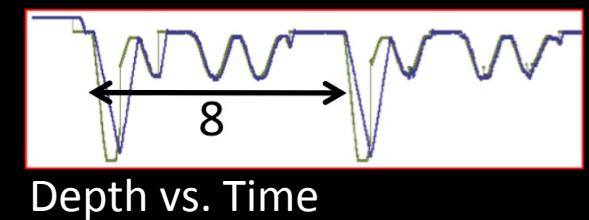
- Track Gradients: Temperature, Sound Speed, Density -



- 1) Initial yoyo
- 2) Create depth “bins”
- 3) Average T in bin
- 4) Vertical derivative ( $\Delta T/\Delta z$ ) over adjacent bins ‘o’



- 5) Threshold – Average  $\Delta T/\Delta z$  over water column
- 6) Determine thermocline range ( $\max |\Delta T/\Delta z|$ ) ‘-----’
- 7) Track! – adjust yoyo limits continuously
- 8) Periodic reset



# AAFT: *MOOS(-IvP) Interface*

- Pros
  - Autonomy and Acomms interfaces already implemented, and continuously improving
  - Use a Toggle Depth behavior with pEnvGrad to perform an adaptive yoyo through the water column
  - Multi-AUV collaboration possible
- Cons
  - Lack of a real database in MOOS
    - prevents incorporation of spatial and temporal scales into oceanographic feature determination

# GLINT '09

## *Field Experiment*

- 13-14 July, 2009
- Adaptive Env't. missions
  - MIT
  - NATO Undersea Research Centre (NURC), La Spezia, Italy
- NURC OEX AUV running MOOS & MOOS -IvP
- Development, simulation & testing of pEnvtGrad
- Track acousticline

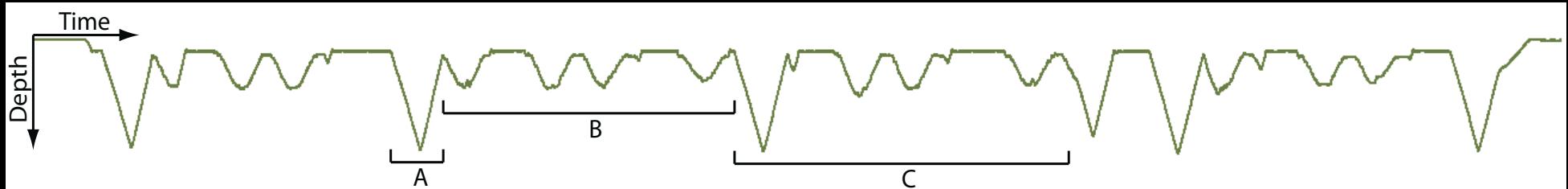


Tyrrhenian Sea, Italy

Map data ©2010 Europa Technologies, Tele Atlas

# GLINT '09

## *Results (07/14/09)*



Autonomy Behaviors:  
Adaptive Yoyo (above) & Racetrack (1km x 200m oval)

Mission:  
Track the acousticline.

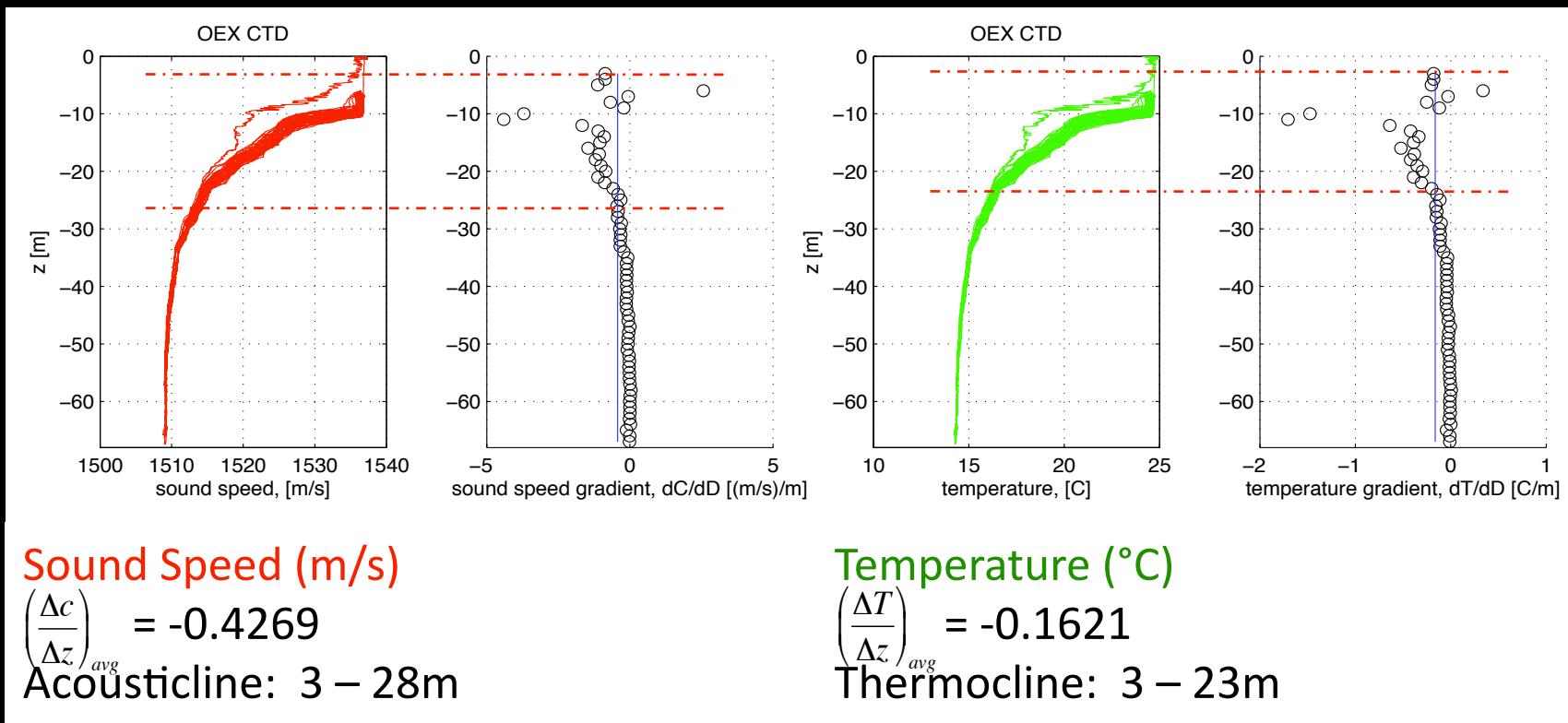
- A: Initial yoyo, 7-70m
- B: Tracking acousticline, 9-28m
- C: Periodic timeout resets yoyo depth limits

Water Depth: ~105m

# GLINT '09

## *Validation of pEnvGrad Performance*

### - OEX CTD Gradient Determination -



Tyrrhenian Sea – 14 July, 2009

# Champlain '09

## *Field Experiment*

- 03-05 October, 2009
  - MIT
  - Naval Undersea Warfare Center (NUWC), Newport, RI
- Iver AUV running MOOS & MOOS-IvP
- Testing of pEnvGrad
  - Track thermocline
- Fresh water!



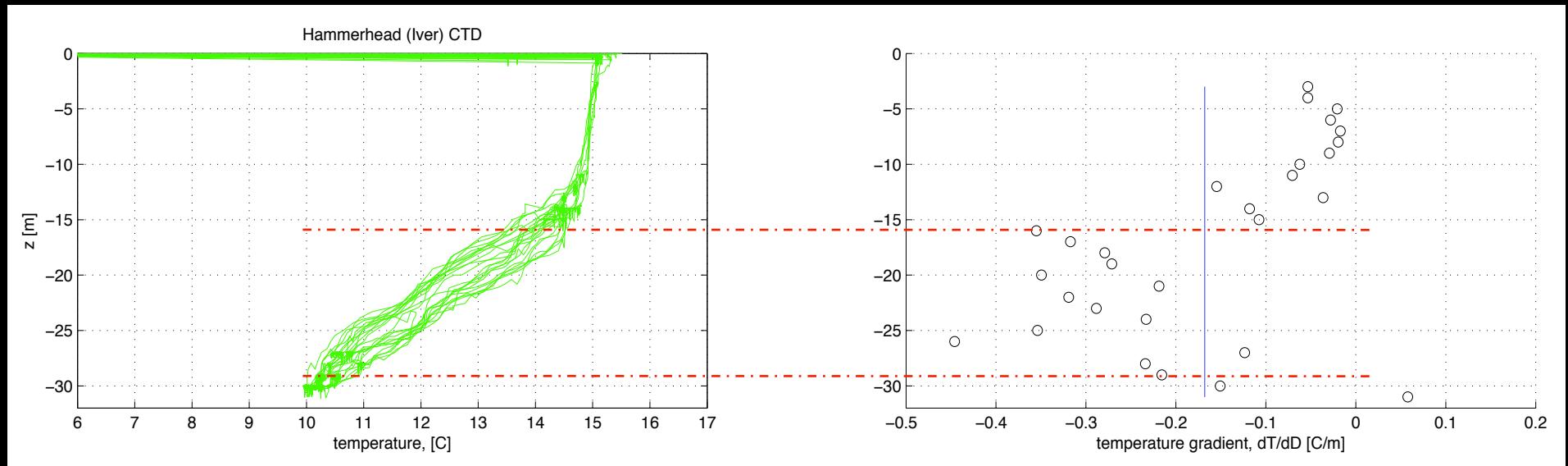
Lake Champlain, VT



Hammerhead (Iver AUV)

# Champlain '09

## *Thermocline Tracking, cont.*



$$\text{avg}(dT/dz) = -0.1679 \text{ } ^\circ\text{C/m}$$

$$\text{Thermocline} = [16 \quad 29] \text{ m}$$

# GLINT '10

## *Field Experiment*

- 13 August, 2010  
Adaptive Env't. missions
  - MIT
  - NURC
- 2-AUV collaboration
- Unicorn (MIT Bluefin 21") & Harpo (NURC OEX) both running MOOS & MOOS-IvP
- Searching for internal waves
- Harpo – Swim at top of thermocline (~12m)
- Unicorn – Trail Harpo while tracking the thermocline



# GLINT '10

## *Results (08/13/10)*

### 2-AUV Collaboration

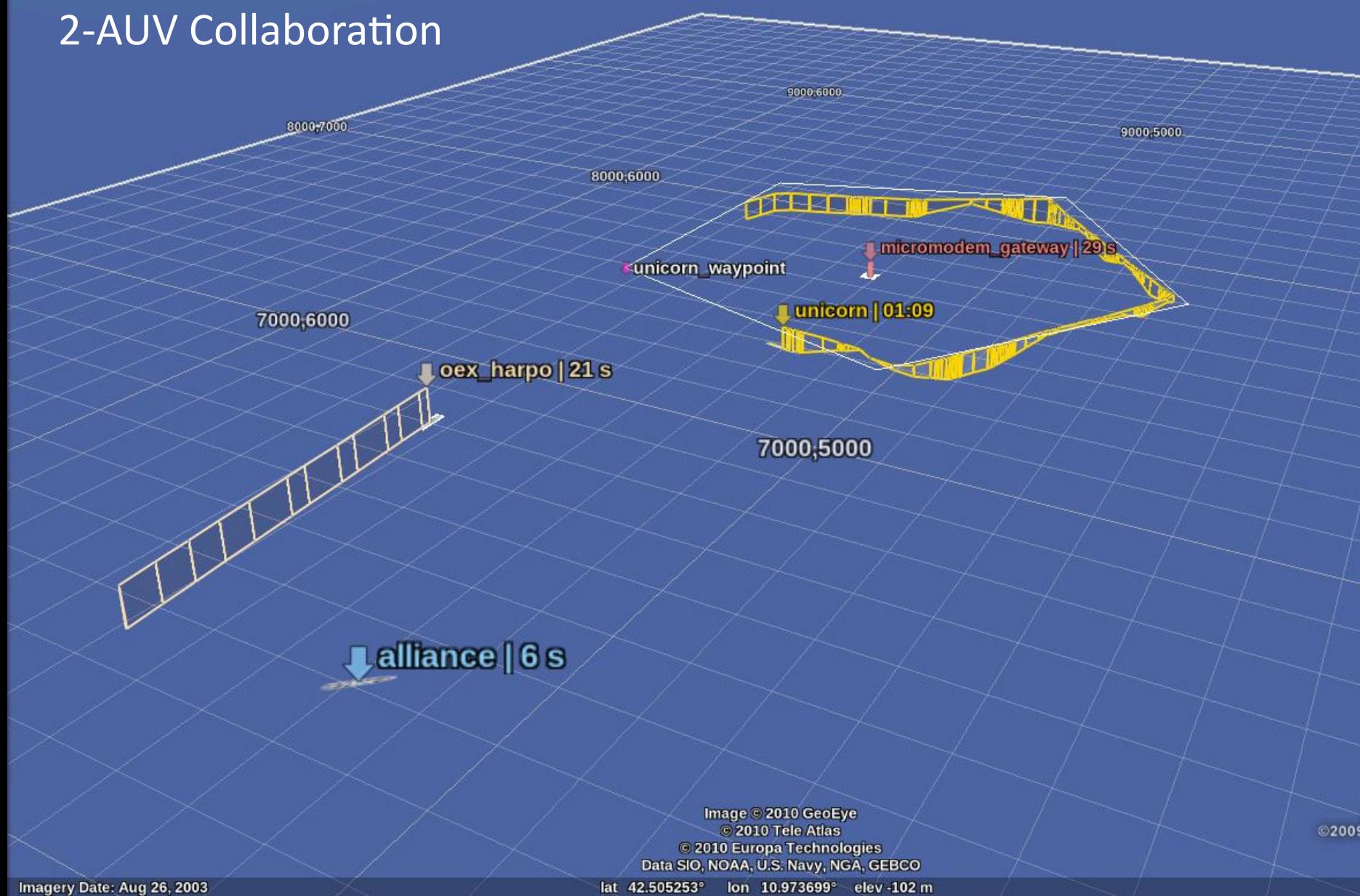


Image © 2010 GeoEye

© 2010 Tele Atlas

© 2010 Europa Technologies

Data SIO, NOAA, U.S. Navy, NGA, GEBCO

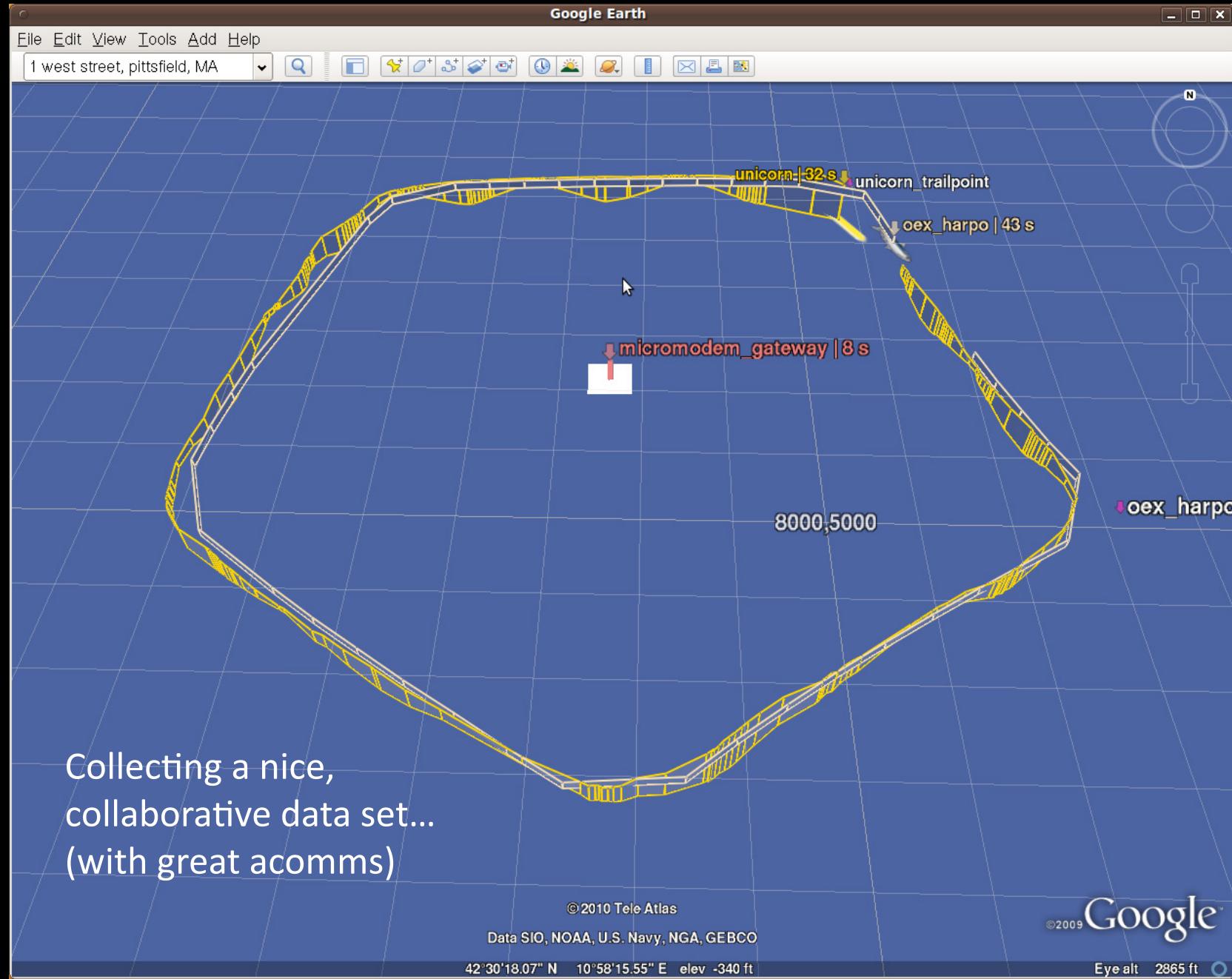
# GLINT '10

## *Results (08/13/10)*



# GLINT '10

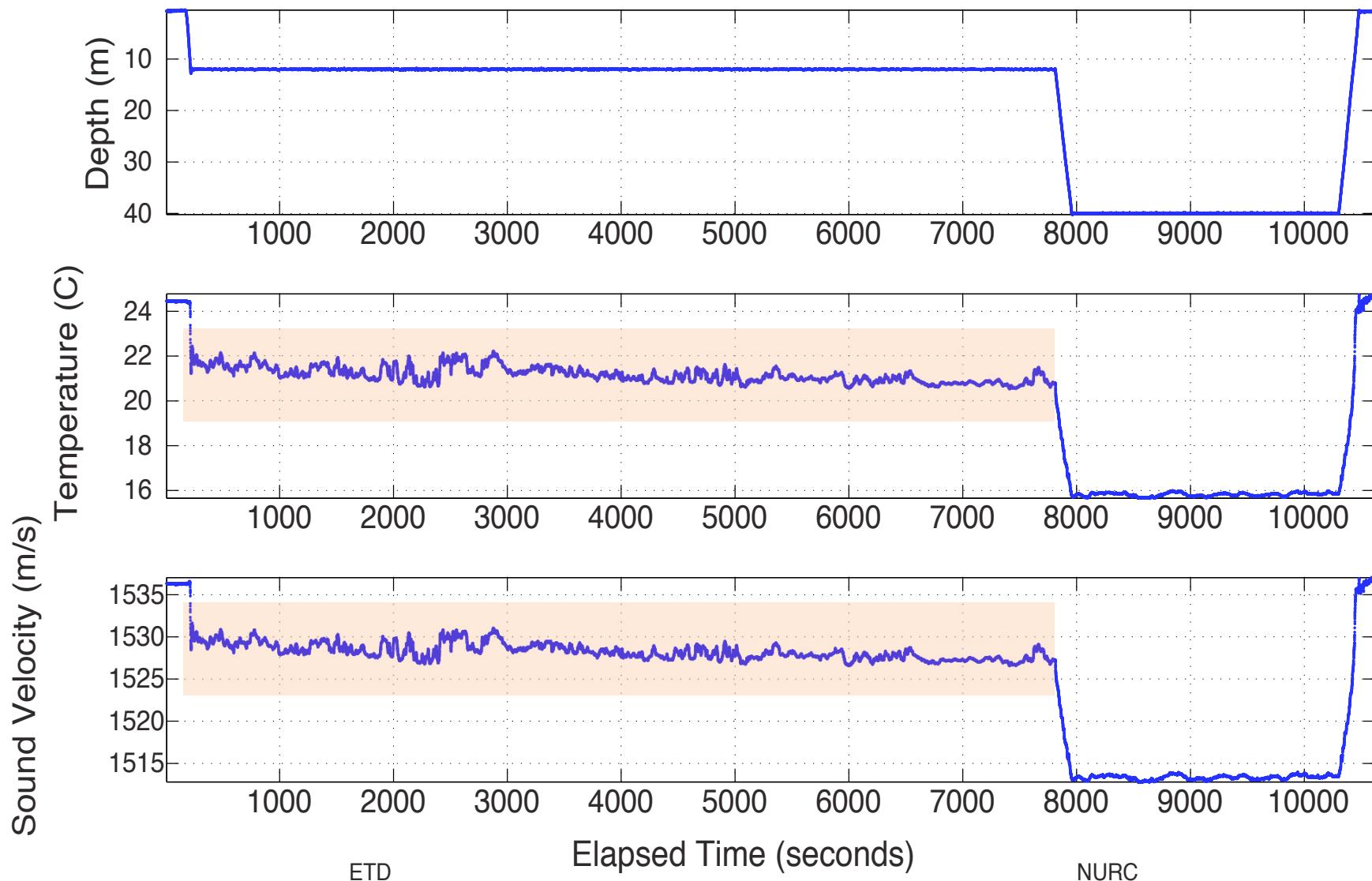
## *Results (08/13/10)*



# GLINT '10

## *Results - Harpo*

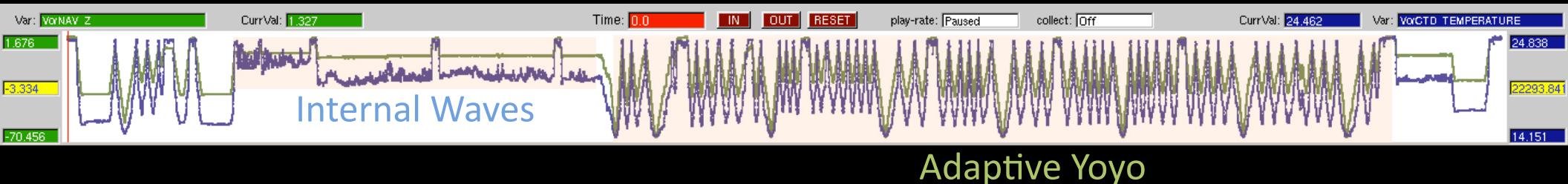
OEX-Harpo Internal Waves near 12m



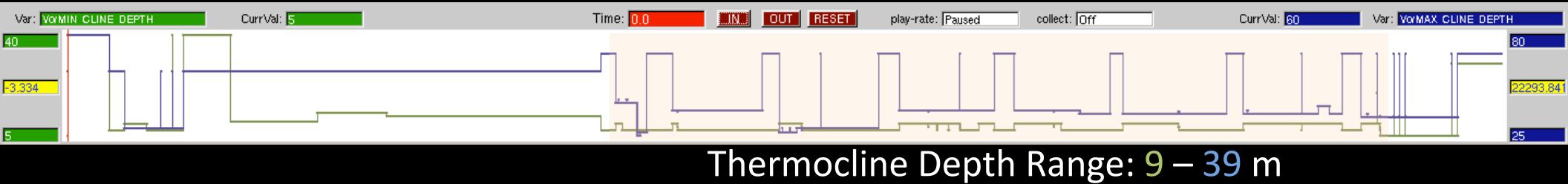
# GLINT '10

## *Results - Unicorn*

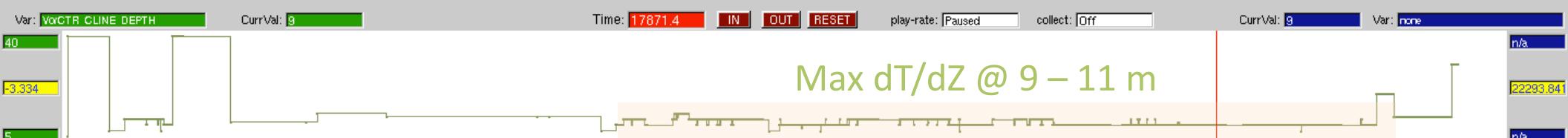
Depth of Unicorn, Temperature at Unicorn's Location



Min & Max depth bounds of thermocline



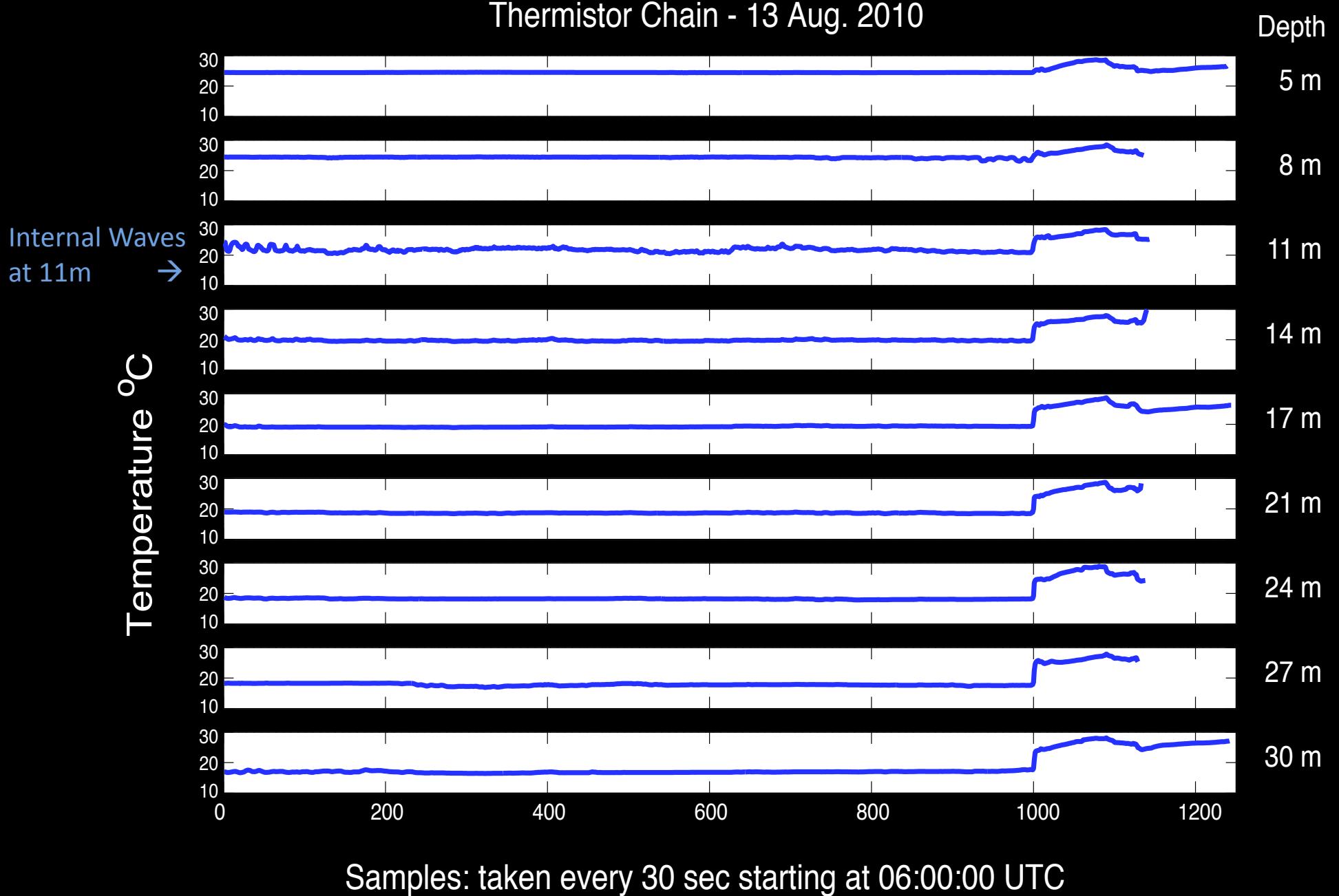
Depth of Max Temperature Gradient



# GLINT '10

## *Did it work? – Yes!*

Thermistor Chain - 13 Aug. 2010



# Summary

- Successful proof-of-concept for AAFT
- Widely applicable in the dynamic ocean environment, for single and collaborating AUVs
- MOOS & MOOS-IvP allow us to bring our technology advances into use in the oceanographic community
  - Good, but we need a real database for onboard dynamic data processing!

# Acknowledgements

- MOOS & MOOS-IvP
  - P. Newman, M. Benjamin
- MIT
  - LAMSS: T. Schneider, K. Cockrell
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- NURC
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# Thanks!

Questions / comments?

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