

High-quality dissolved oxygen baseline for ecosystem and variability studies

Hernan Garcia¹, Tim Boyer¹, James Reagan^{1,3}, Olga Baranova¹, Scott Cross², Carla Forgy¹, Alexandra Grodsky^{1,3}, Ricardo Locarnini¹, Alexey Mishonov^{1,3}, Rost Parsons⁶, Chris Paver¹, Dan Seidov¹, Igor Smolyar¹, and Melissa Zweng¹

¹NOAA/National Centers for Environmental Information, Silver Spring, MD, USA Email: Hernan.Garcia@noaa.gov

²NOAA/National Centers for Environmental Information, Charleston, SC, USA

³Cooperative Institute for Climate and Satellites/Earth System Science Interdisciplinary Center/University of Maryland, College Park, MD, USA

⁴NOAA Fisheries/Office of Science and Technology, Silver Spring, MD, USA

⁵ERT Corp, Laurel, MD, USA

⁶NOAA/National Centers for Environmental Information, Stennis Space Center, MS, USA

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Outline:

- Uncertainty of long-term O₂ high-quality baselines for climate variability assessment? Comparing *in situ* O₂ values derived from the World Ocean Atlas (WOA13) and the Global Ocean Data Analysis Project (GLODAP2).
- Sensor-based *in situ* O₂ data are a relatively new observing system: Could we use these data to complement O₂ chemical measurements?

Global Ocean Data Analysis Project (GLODAP) Bottle Data (version 2)

Olsen, A., R. M. Key, S. van Heuven, S. K. Lauvset, A. Velo, X. Lin, C. Schirnack, A. Kozyr, T. Tanhua, M. Hoppema, S. Jutterström, R. Steinfeldt, E. Jeansson, M. Ishii, F. F. Pérez & T. Suzuki. The Global Ocean Data Analysis Project version 2 (GLODAPv2) - an internally consistent data product for the world ocean, Earth System Science Data, 8, 297-323, 2016. [doi:10.5194/essd-8-297-2016](https://doi.org/10.5194/essd-8-297-2016).

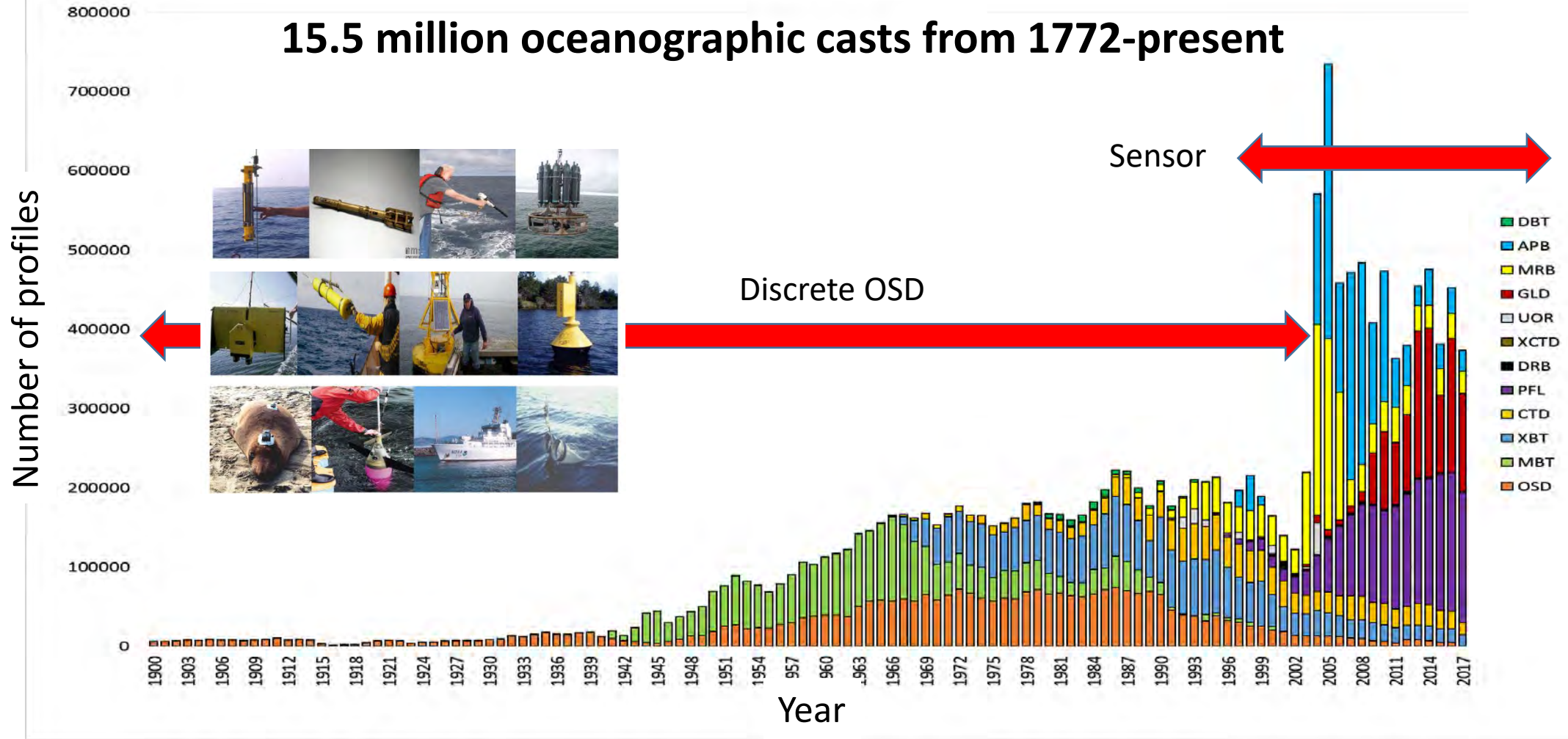
NOAA World Ocean Atlas 2013 (<https://www.nodc.noaa.gov/OC5/woa13/pubwoa13.html>)

- Garcia, H. E., R. A. Locarnini, T. P. Boyer, J. I. Antonov, O.K. Baranova, M.M. Zweng, J.R. Reagan, D.R. Johnson, 2014. World Ocean Atlas 2013, Volume 3: Dissolved Oxygen, Apparent Oxygen Utilization, and Oxygen Saturation. S. Levitus, Ed., A. Mishonov Technical Ed.; NOAA Atlas NESDIS 75, 27 pp.
- Garcia, H. E., R. A. Locarnini, T. P. Boyer, J. I. Antonov, O.K. Baranova, M.M. Zweng, J.R. Reagan, D.R. Johnson, 2014. World Ocean Atlas 2013, Volume 4: Dissolved Inorganic Nutrients (phosphate, nitrate, silicate). S. Levitus, Ed., A. Mishonov Technical Ed.; NOAA Atlas NESDIS 76, 25 pp.
- Locarnini, R. A., A. V. Mishonov, J. I. Antonov, T. P. Boyer, H. E. Garcia, O. K. Baranova, M. M. Zweng, C. R. Paver, J. R. Reagan, D. R. Johnson, M. Hamilton, and D. Seidov, 2013. World Ocean Atlas 2013, Volume 1: Temperature. S. Levitus, Ed., A. Mishonov Technical Ed.; NOAA Atlas NESDIS 73, 40 pp.
- Zweng, M.M, J.R. Reagan, J.I. Antonov, R.A. Locarnini, A.V. Mishonov, T.P. Boyer, H.E. Garcia, O.K. Baranova, D.R. Johnson, D.Seidov, M.M. Biddle, 2013. World Ocean Atlas 2013, Volume 2: Salinity. S. Levitus, Ed., A. Mishonov Technical Ed.; NOAA Atlas NESDIS 74, 39 pp.

Ocean profile data in the World Ocean Database (WOD) by year and probe type

https://www.nodc.noaa.gov/OC5/WOD/pr_wod.html

15.5 million oceanographic casts from 1772-present



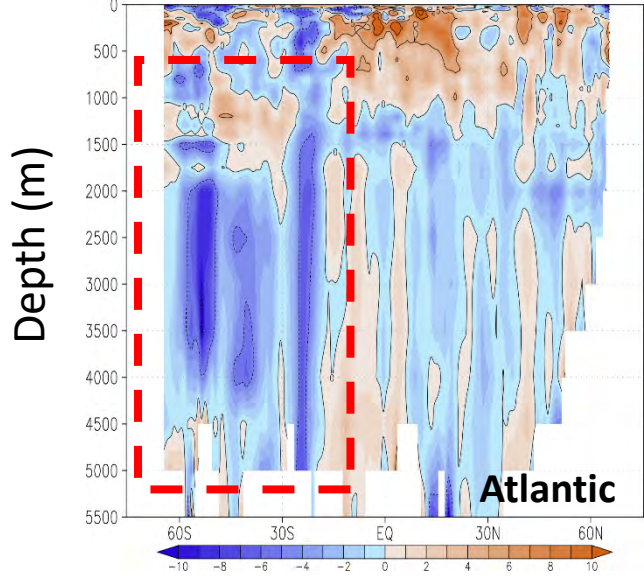
Intergovernmental
Oceanographic
Commission

WOA-GLODAP basin-scale zonal difference (60°S-60°N)

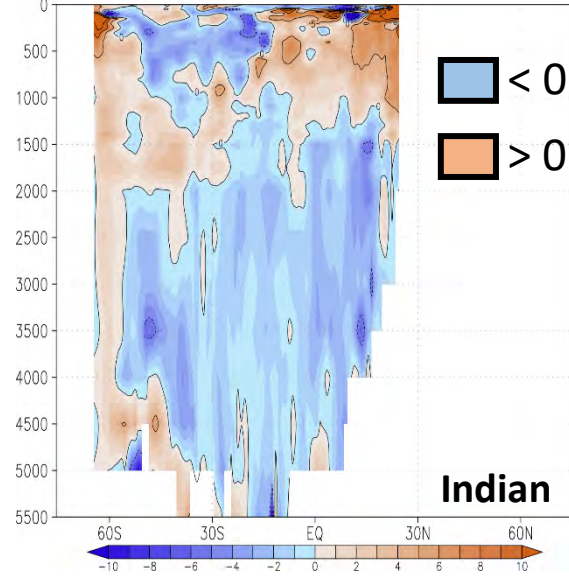
Variable	Depth range (m)	WOA-GLODAP average difference ± average standard deviation			
		Atlantic	Pacific	Indian	Global
Phosphate (μmol/kg)	0-500	0.02 ± 0.11	0.01 ± 0.13	-0.01 ± 0.12	0.01 ± 0.12
	500-5500	-0.01 ± 0.05	-0.02 ± 0.07	-0.02 ± 0.08	-0.02 ± 0.07
Nitrate+Nitrite (μmol/kg)	0-500	0.02 ± 1.60	-0.20 ± 1.87	-0.34 ± 1.69	0.18 ± 1.78
	500-5500	-0.16 ± 0.70	-0.23 ± 1.02	-0.24 ± 0.98	-0.22 ± 0.95
Silicate (μmol/kg)	0-500	0.1 ± 3.1	1.0 ± 3.5	0.9 ± 3.9	0.8 ± 3.6
	500-5500	-0.5 ± 2.7	0.8 ± 4.1	-0.2 ± 3.9	-0.3 ± 3.8
Oxygen (μmol/kg)	0-500	1.1 ± 9.8	1.8 ± 11.5	0.9 ± 10.6	1.4 ± 10.9
	500-5500	-0.4 ± 4.4	0.9 ± 4.6	0.1 ± 4.9	0.4 ± 4.7
Temperature (°C)	0-500	-0.256 ± -0.928	-0.224 ± -0.945	-0.212 ± -0.856	-0.229 ± 0.927
	500-5500	-0.001 ± 0.154	0.005 ± 0.153	0.002 ± 0.163	0.003 ± 0.160
Salinity	0-500	-0.007 ± 0.141	0.000 ± 0.120	-0.016 ± 0.122	-0.005 ± 0.127
	500-5500	0.001 ± 0.019	-0.001 ± 0.012	0.002 ± 0.017	0.000 ± 0.015

WOA-GLODAP O₂ (μmol/kg) basin-scale zonal differences (60°S-60°N)

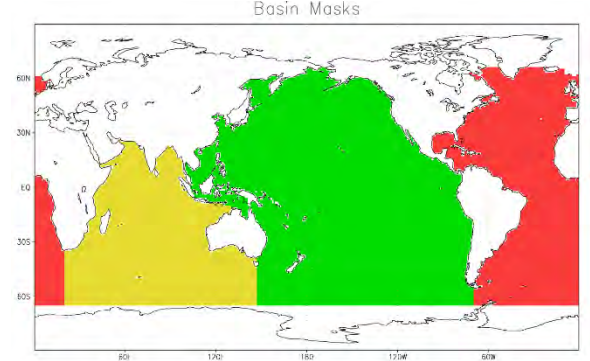
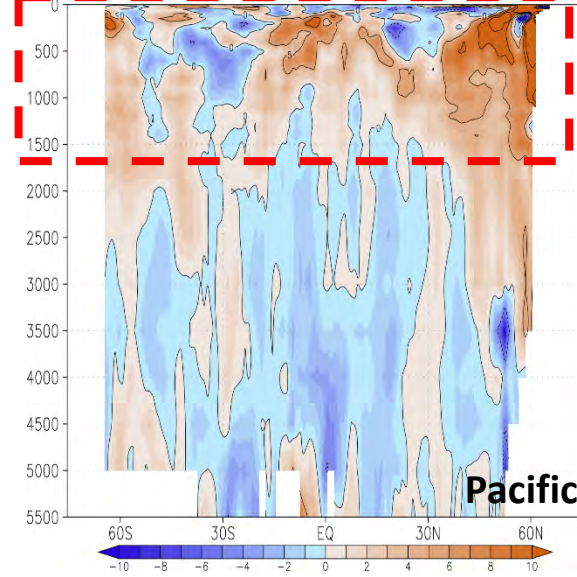
WOA-GLODAP zonal-average annual oxygen difference (μmol/kg) for atl



WOA-GLODAP zonal-average annual oxygen difference (μmol/kg) for ind

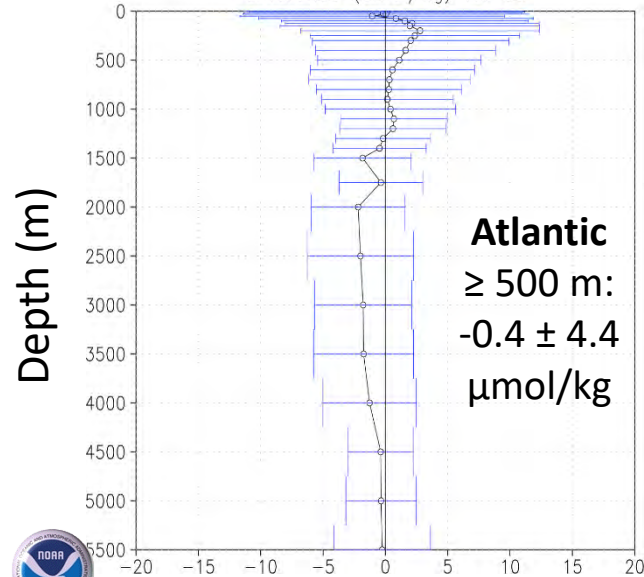


WOA-GLODAP zonal-average annual oxygen difference (μmol/kg) for pac

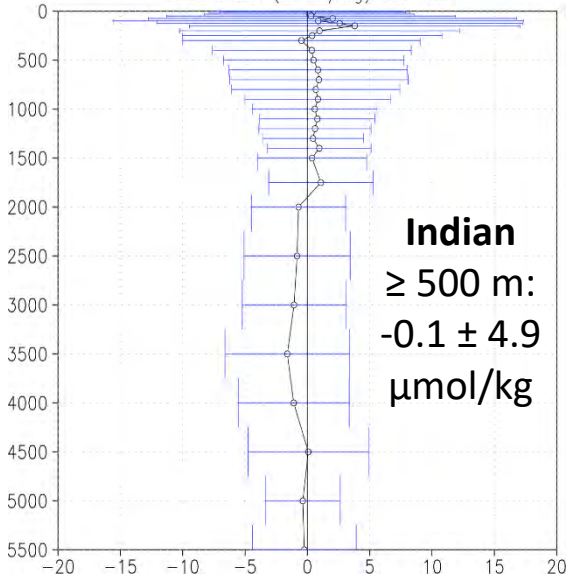


ORAS: ICES/COLA 2018-01-19 11:51:01

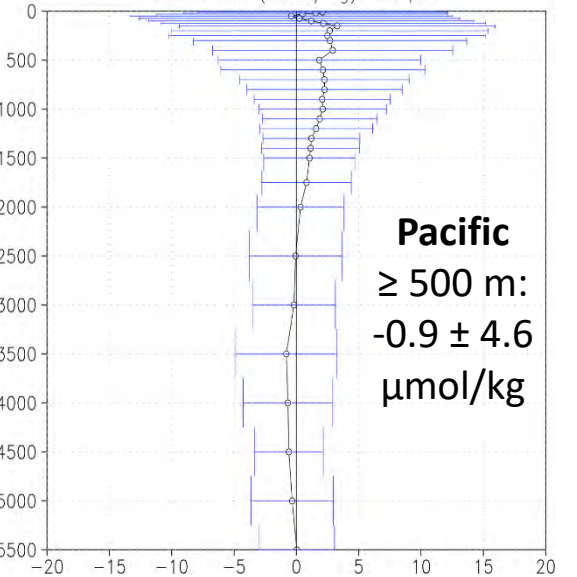
WOA-GLODAP global-average annual oxygen difference (μmol/kg) for atl



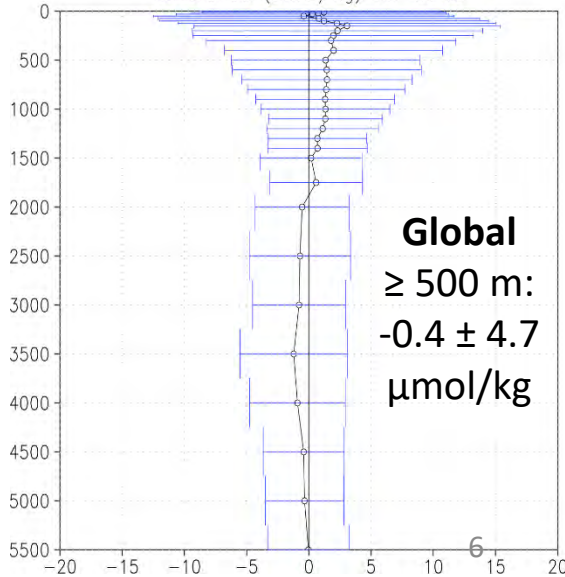
WOA-GLODAP global-average annual oxygen difference (μmol/kg) for ind



WOA-GLODAP global-average annual oxygen difference (μmol/kg) for pac



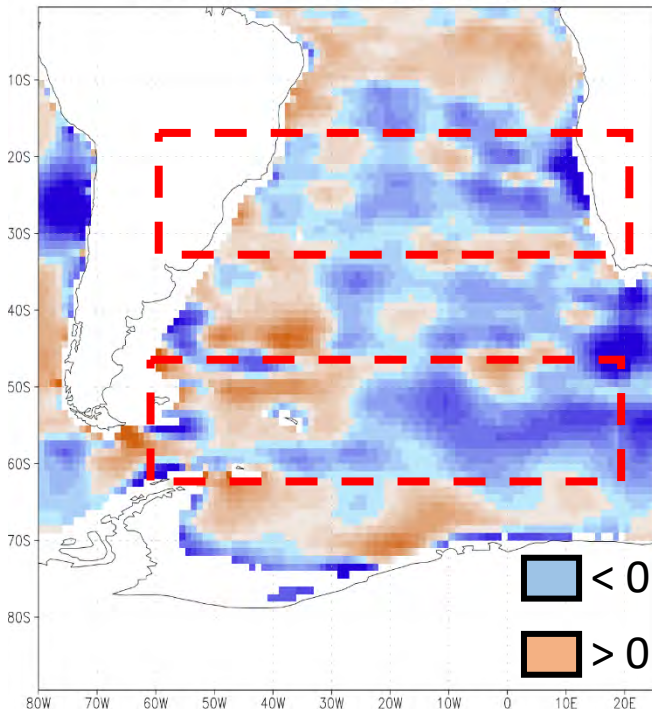
WOA-GLODAP global-average annual oxygen difference (μmol/kg) for world



South Atlantic regional WOA-GLODAP O₂ differences (μmol/kg)

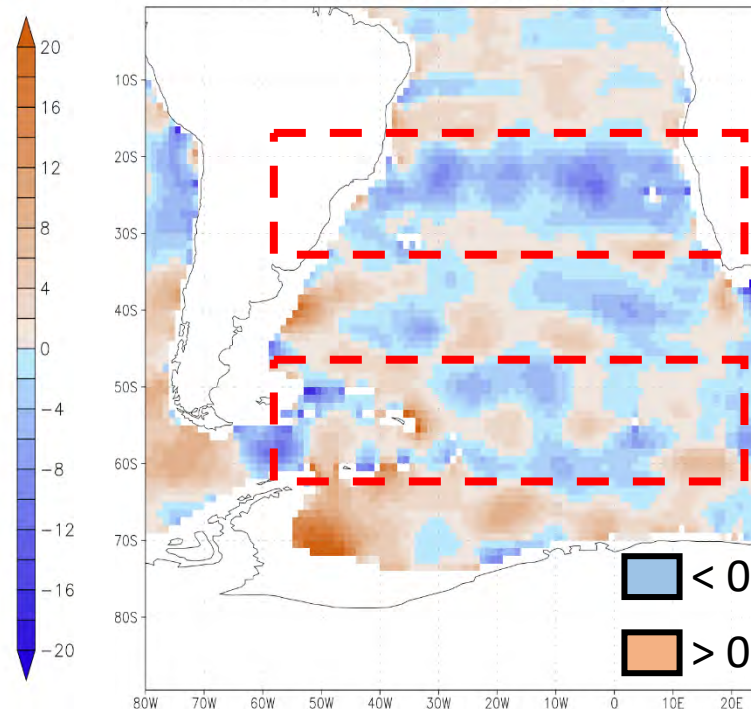
700 m

South Atlantic OA Oxygen Difference
WOA-GLODAP at 700m (μmol/kg)



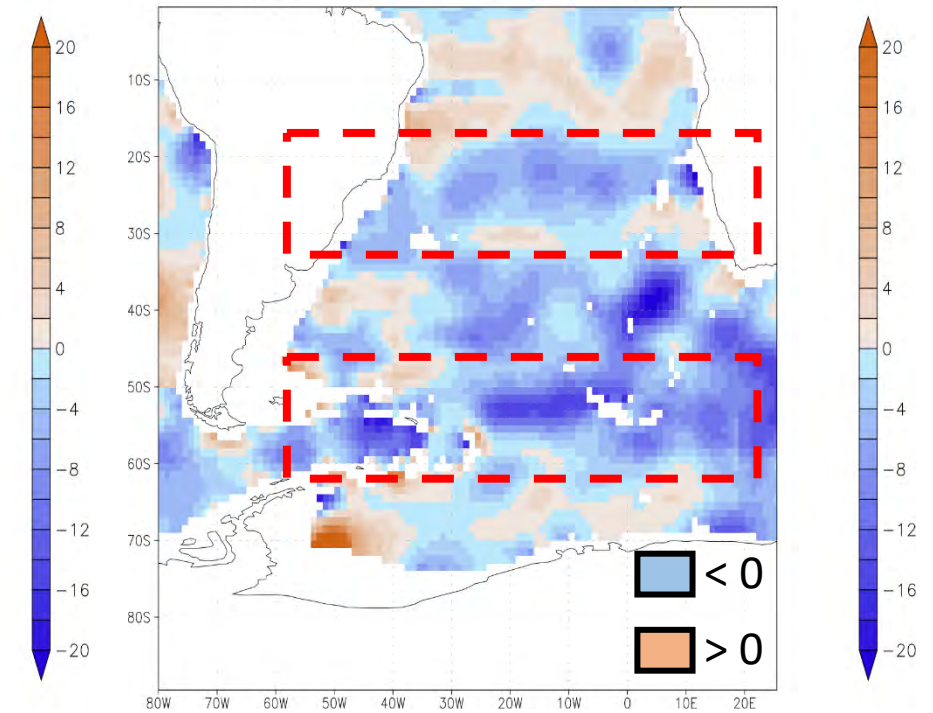
1750 m

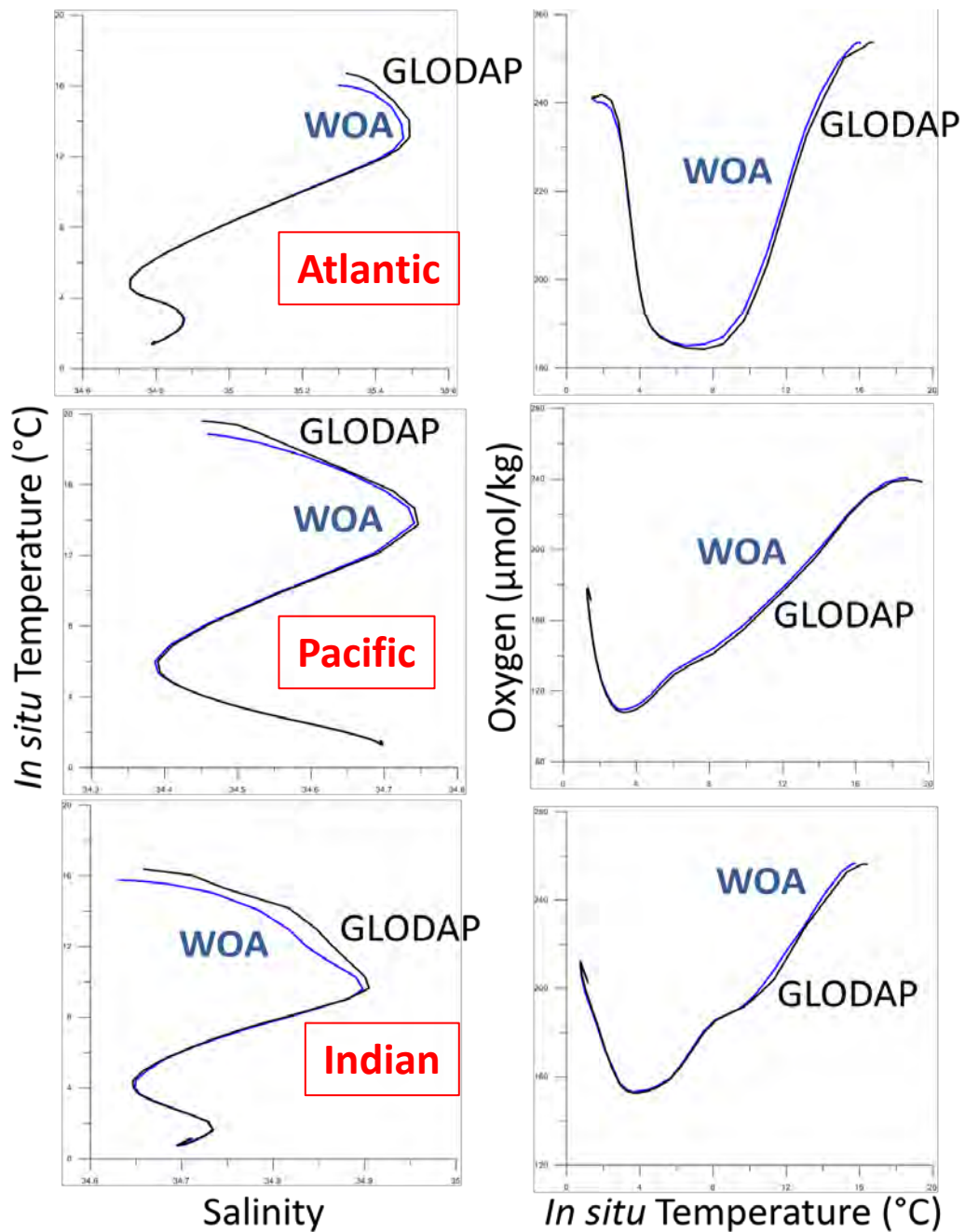
South Atlantic OA Oxygen Difference
WOA-GLODAP at 1750m (μmol/kg)



2500 m

South Atlantic OA Oxygen Difference
WOA-GLODAP at 2500m (μmol/kg)



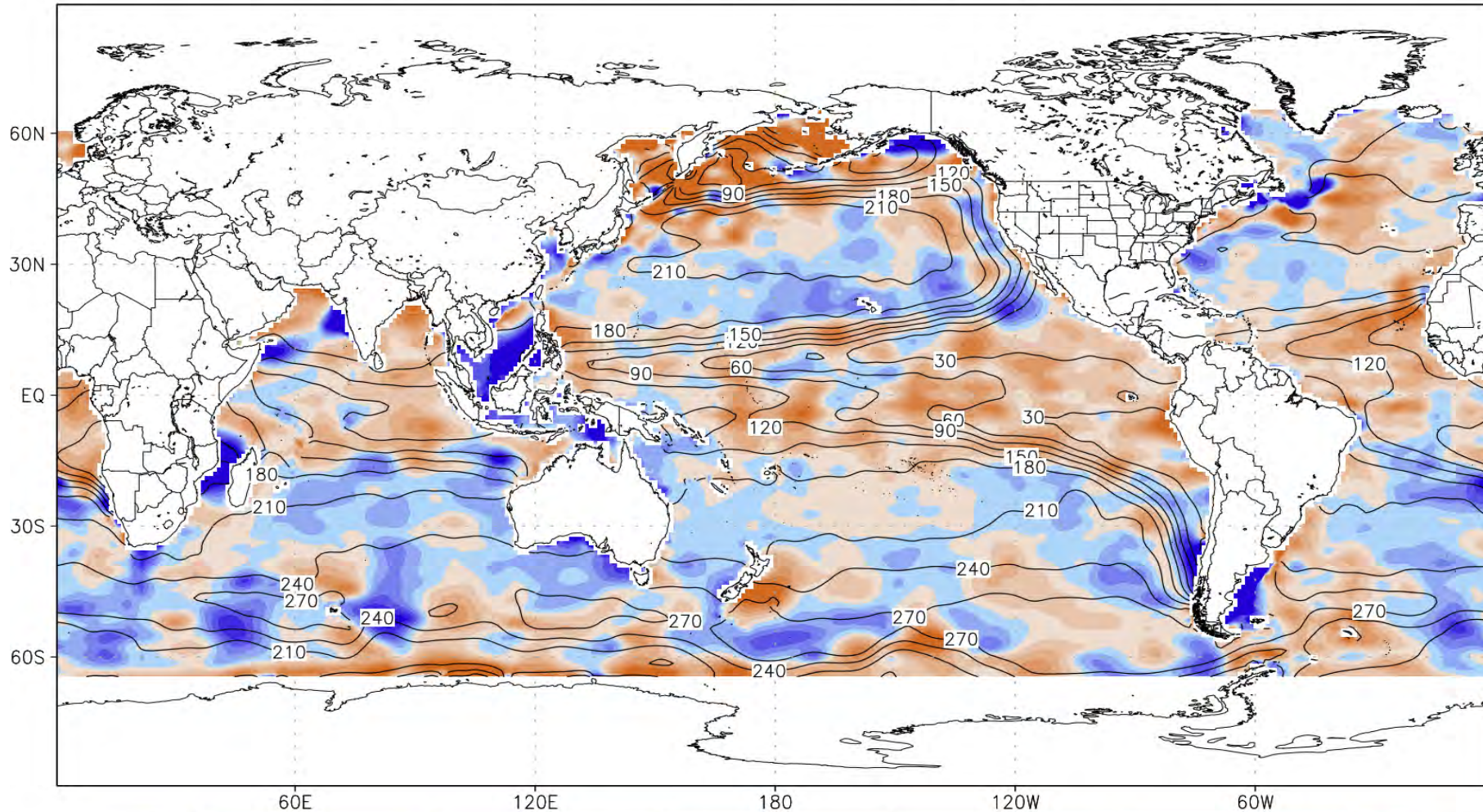
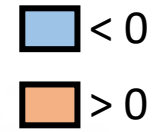


GLODAP2 is relatively saltier, warmer, and lower in O₂ when compared to WOA for near surface and thermocline waters warmer than about 4°C depending on basin.

O ₂ in situ data	GLODAP2	WOA 2018
Observations	688,477	4,945,707
Profiles	45,306	877,400
Time coverage	1972-2013	1955-2017
Variability fields (1°x1°)	Annual	Annual, seasonal, monthly
Depth levels	33	102
Grid size	1-degree	1-degree



WOA-GLODAP 0-500m annual oxy
average difference ($\times 10^{-0}$ $\mu\text{mol}/\text{kg}$) for world



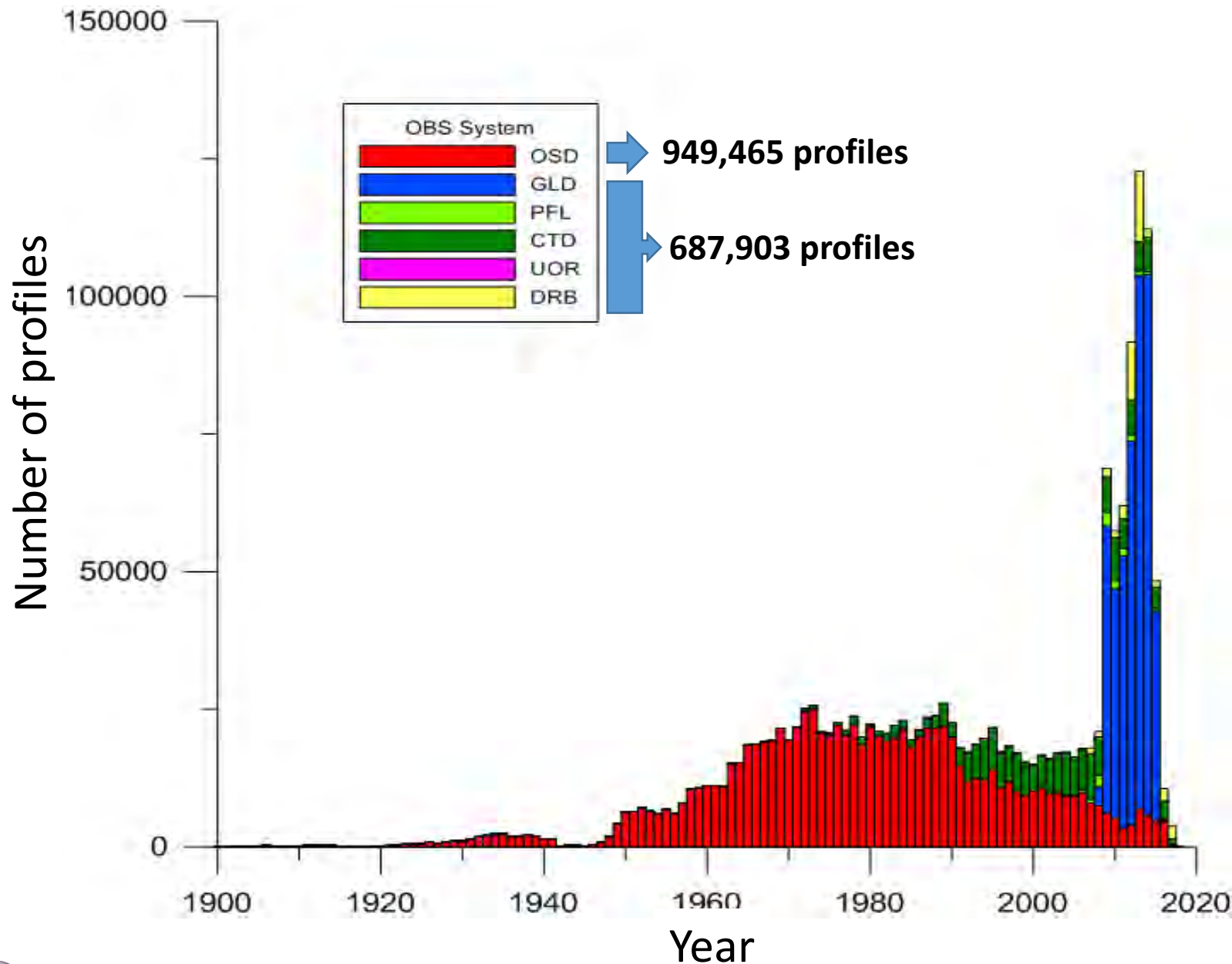
Contours are mean O_2 values 0-500 m.

A local $|10 \mu\text{mol}/\text{kg}|$ O_2 difference represent as much as 30% magnitude of the observed signal



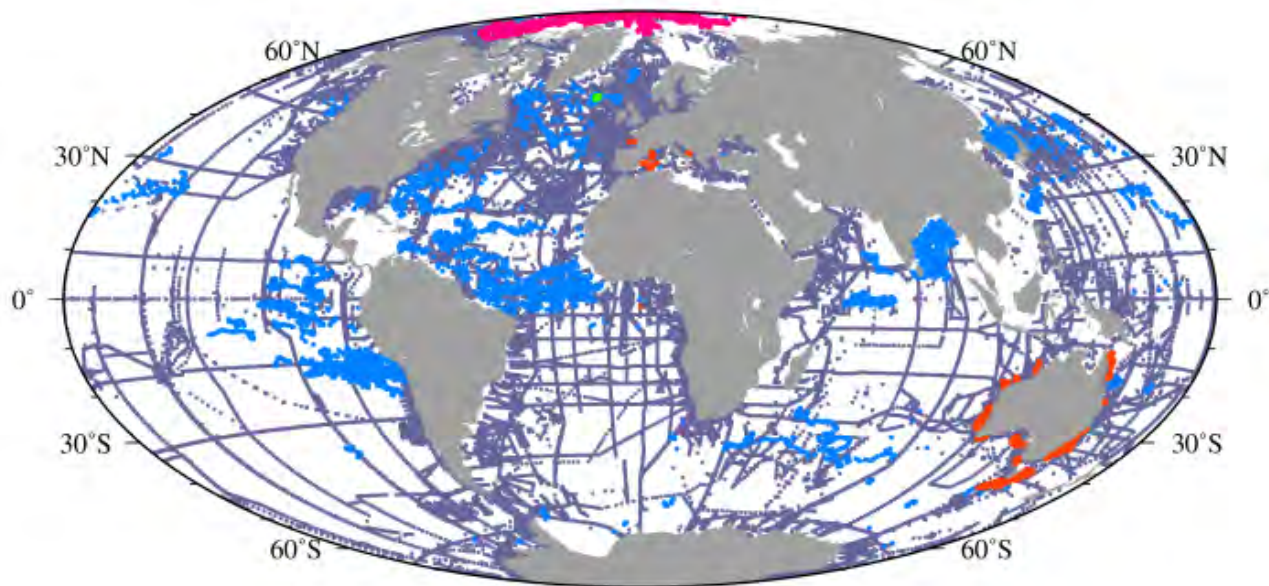
O_2 concentration averaged difference ($\mu\text{mol}/\text{kg}$)





Impact of O₂ Observing Systems:

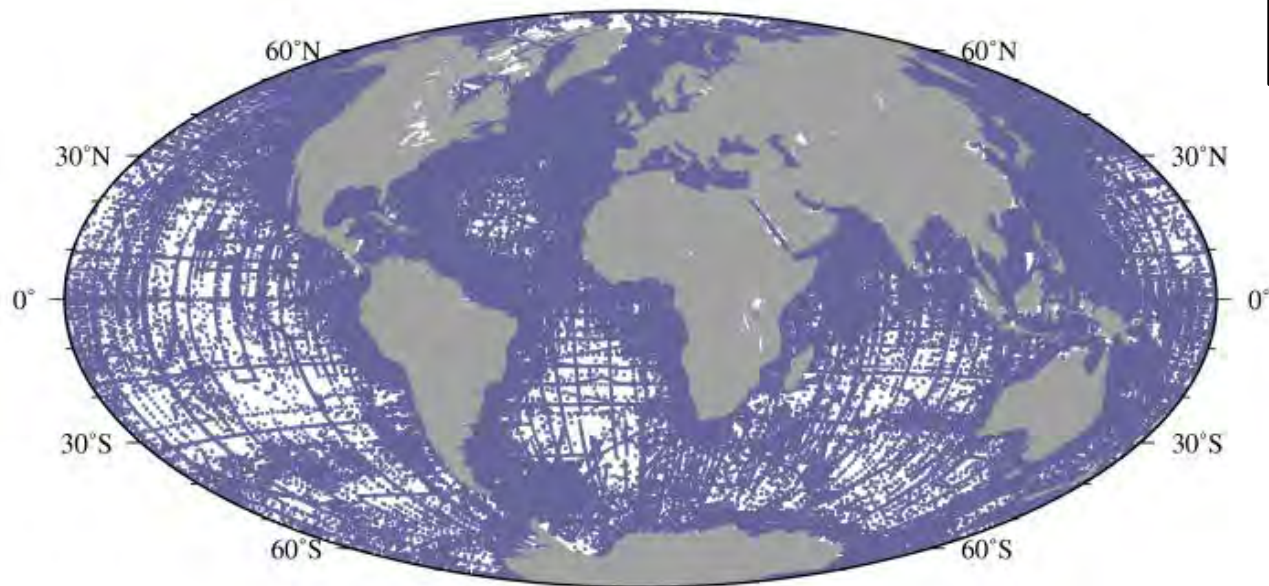
Sensor-based O₂ *in situ* data are becoming increasingly abundant and likely will have greater temporal and spatial coverage than OSD.



O₂ Sensor Data (687,903 profiles)

- = Drifting Buoys (37,812 profiles)
- = Undulating Oceanographic Recorder (361 profiles)
- = Glider Data (450,084 profiles)
- = Profiling Float (12,216 profiles)
- = Conductivity-Temperature-Depth (187,430 profiles)

O₂ measurements in the NCEI World Ocean Database (WOD) as a function of observing system as of May 2018



O₂ Chemical Data (949,465 profiles)

- = Ocean Station data (Discrete measurements)

Profile Analysis to identify profiles with systematic depth offsets (approximately parallel profiles)

Independent O₂ profiles with ~covariance and ~normal population

x₁, ..., x_n with n₁ measurements and y₁, ..., y_n with n₂ measurements

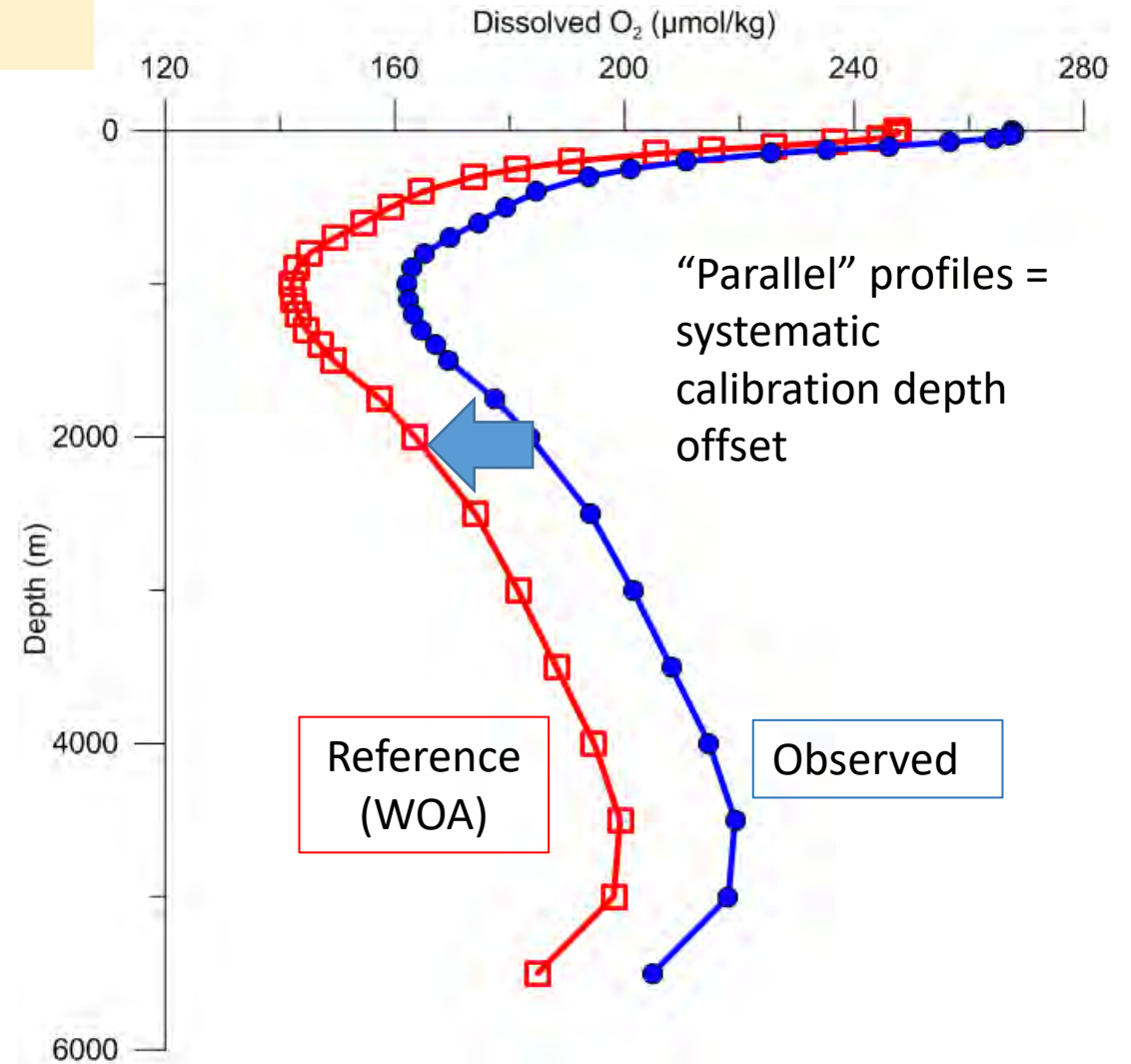
Test metric statistic (ellipse):

$$T^2 = [C(\bar{X} - \bar{Y})]' \left[\left(\frac{1}{n_1} + \frac{1}{n_2} \right) C S_p C' \right]^{-1} [C(\bar{X} - \bar{Y})] \leq d^2$$

Where C is a contrast matrix, S_p is a pooled covariance matrix, and d² is given by

$$d^2 = \left[\frac{(n_1 + n_2 - 2)(p - 1)}{n_1 + n_2 - p} \right] F_{p-1, n_1+n_2-p}(\alpha)$$

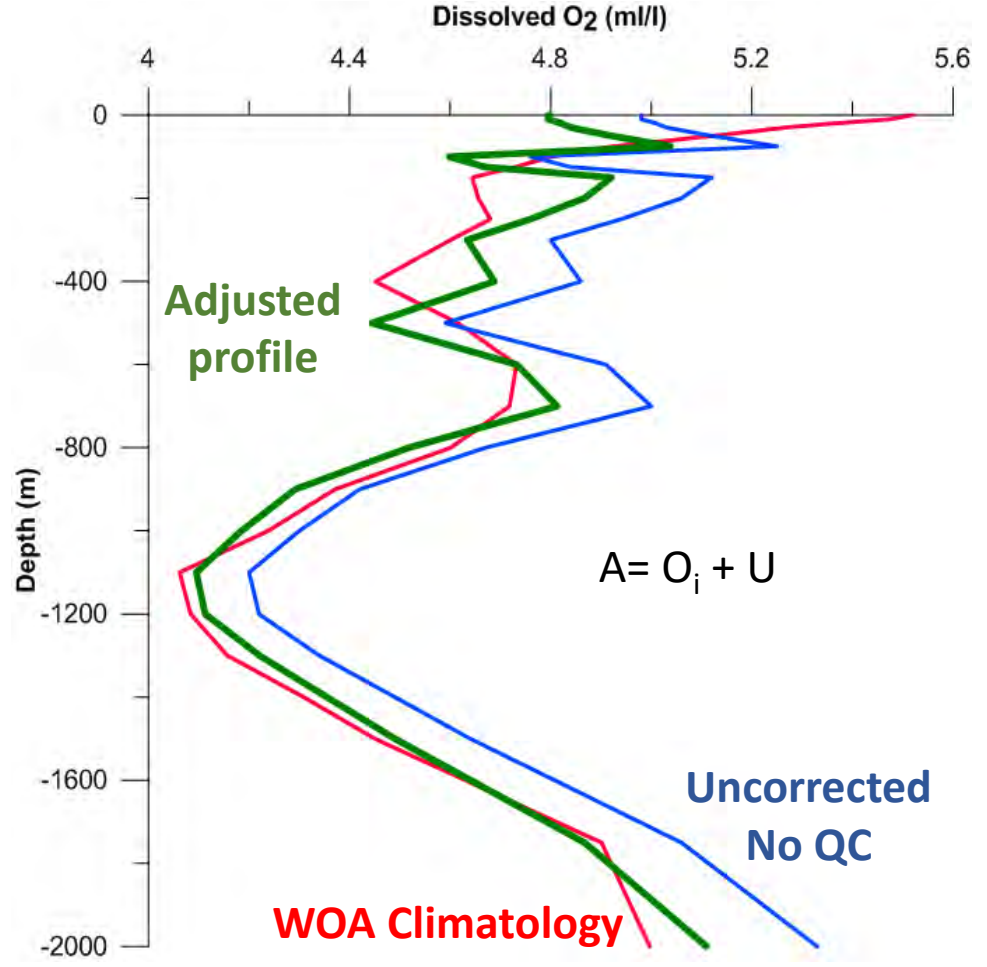
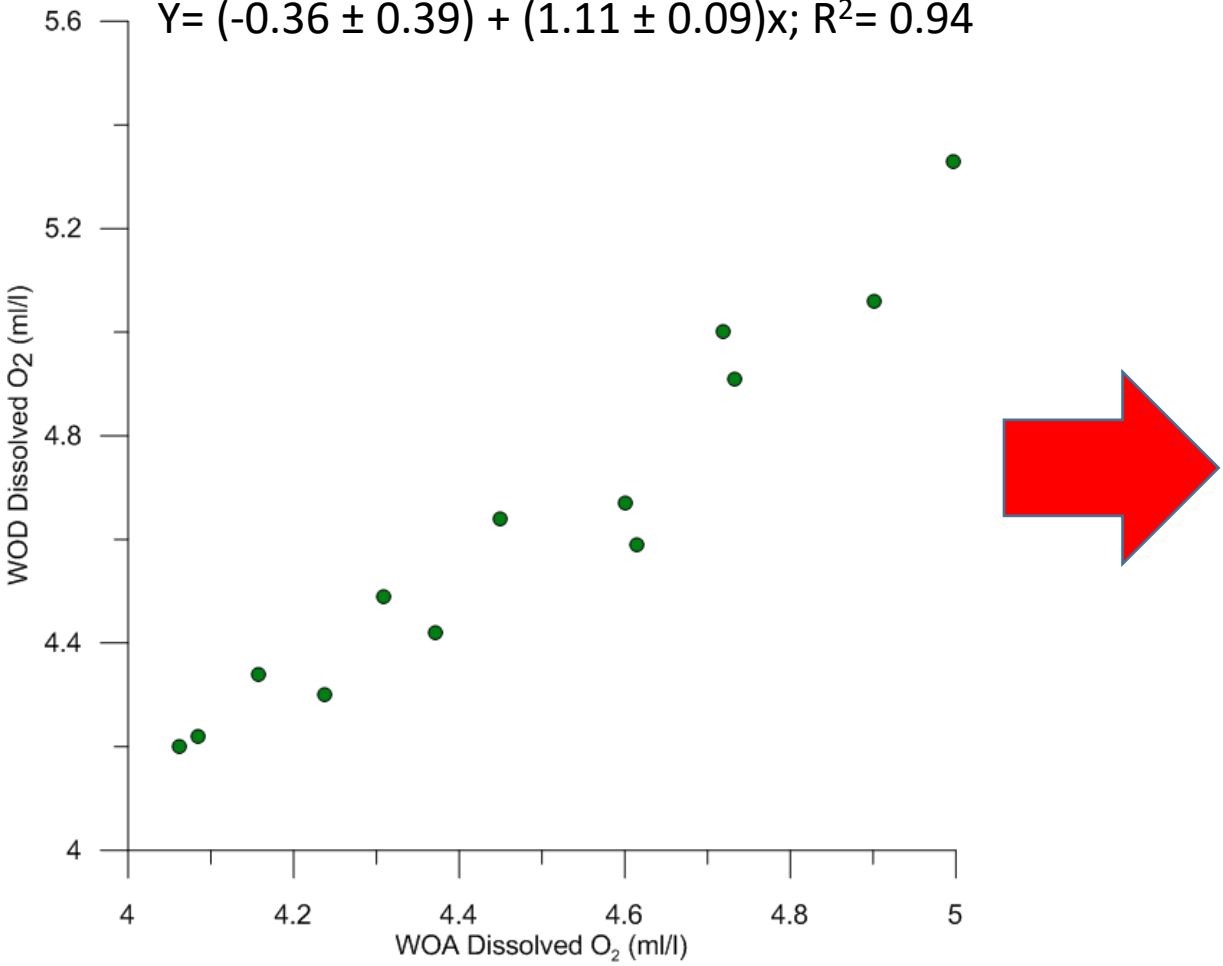
Assumption: Systematic depth offsets represent sensor calibration issues (Type I/II errors)



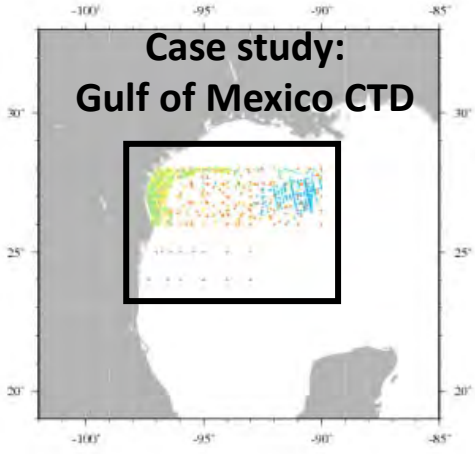
LSR Adjusting systematic CTD O₂ profile depth offsets

Example for data with $0.8 < r^2 < 1.2$; $Z > 500$ m depth

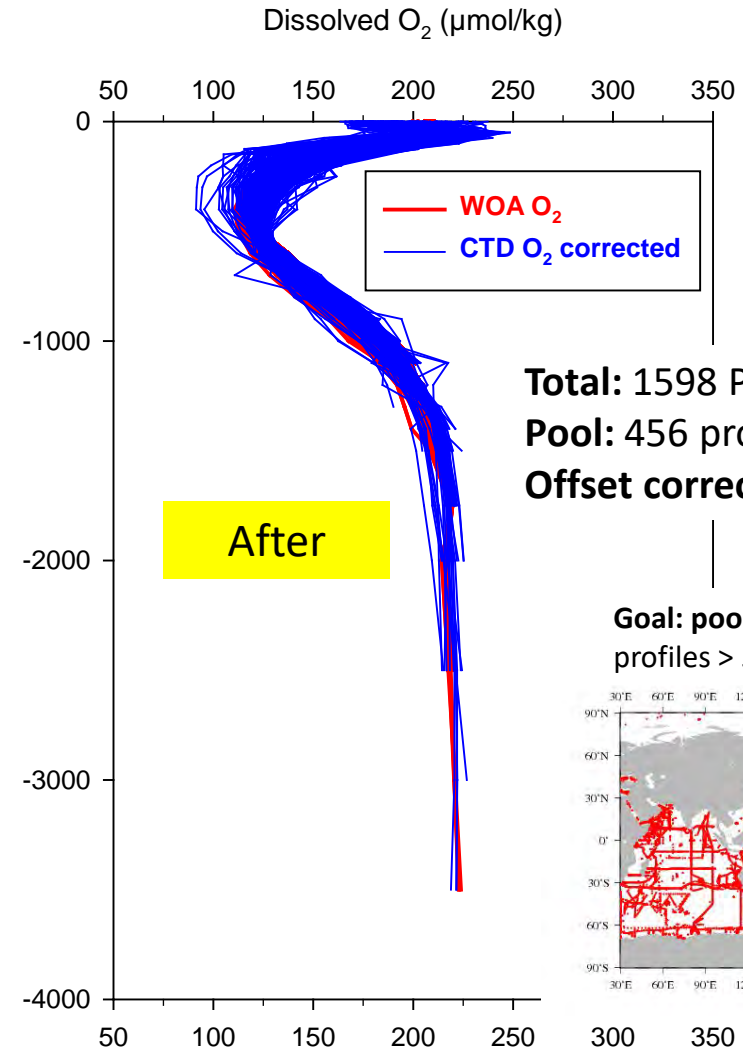
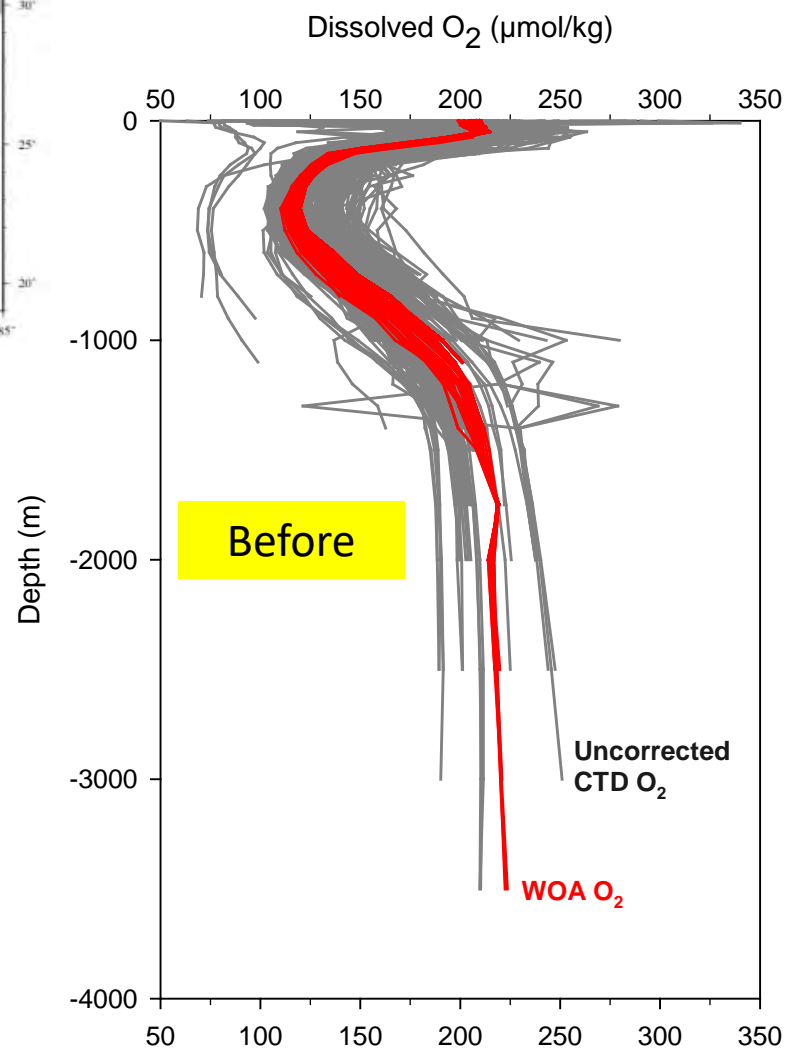
$Y = (-0.36 \pm 0.39) + (1.11 \pm 0.09)x$; $R^2 = 0.94$



Integrating WOD *in situ* data with sensor-based O₂ data for WOA: Statistical calibration of systematic depth offsets with uncertainties

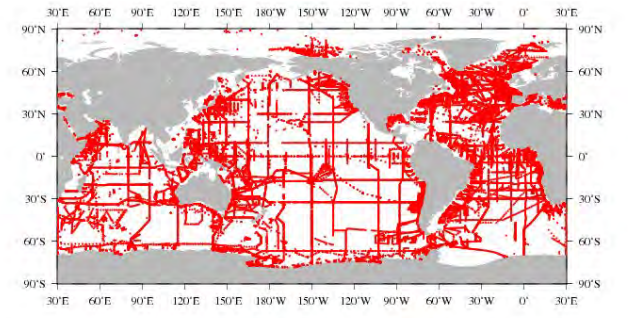


1598 Profiles with O₂
(456 profiles > 500 m)



Total: 1598 Profiles
Pool: 456 profiles > 500 m
Offset corrected: 258 profiles (~57%)

Goal: pool WOD CTD O₂: 66,405 profiles > 500 m depth



Summary

- WOA13 and GLODAP2 O₂ deep basin fields are in agreement within long-term O₂ measurement uncertainty (< 1 μmol/kg) and do not show significant systematic depth offsets.

Part I

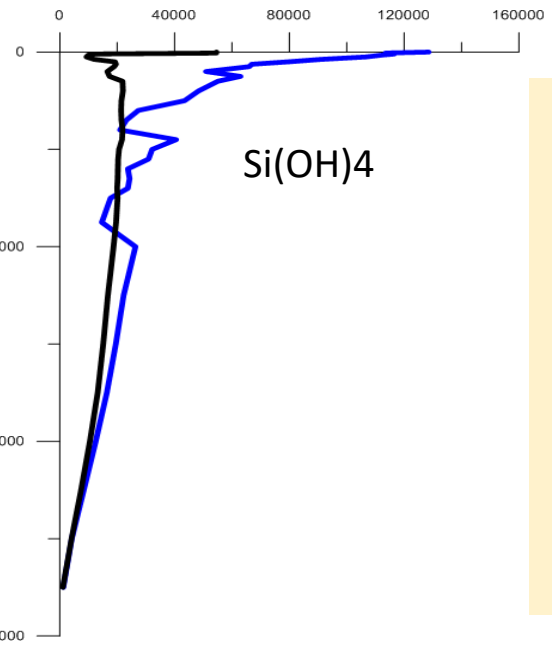
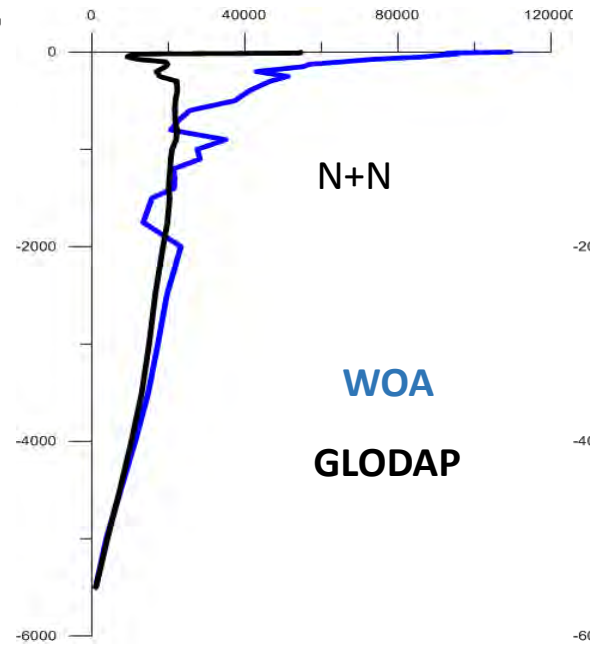
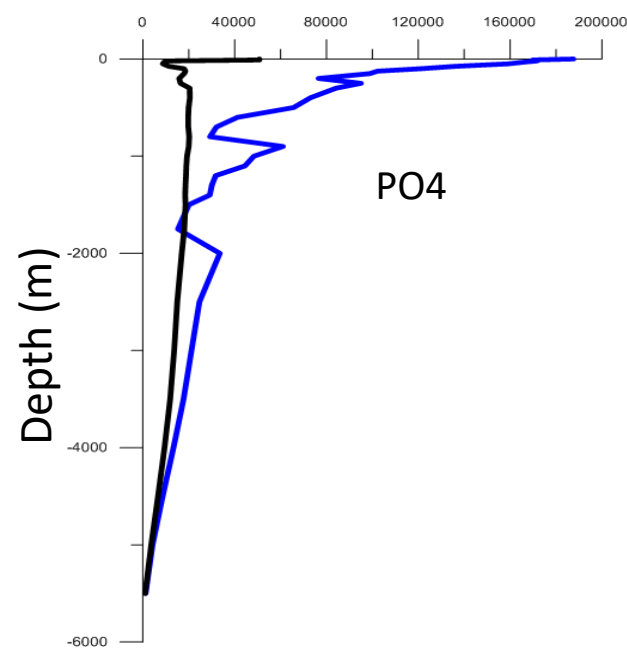
- Significant measurable O₂ differences exist at the local and regional level as a function of depth. These differences could be attributed to near surface seasonal bias, longer time scales variability (thermocline), and data coverage differences. WOA O₂ has greater spatial and temporal coverage than GLODAP.

- The number of sensor based O₂ measurements have increased significantly in the past few years. The addition of Bio ARGO and other emergent observing systems will greatly increase the spatial and temporal coverage of more traditional O₂ chemical measurements.

Part II

- Carefully quality controlled O₂ sensor data could complement existing *in situ* based climatologies along with well documented corrections. WOA2018 will include separate climatologies, one for *in situ* and another for *in situ* + sensor (*e.g.*, CTD, BIO-ARGO, Gliders, *etc.*).





Number of observations available in WOA and GLODAP (60°S-60°N)

