

QARTOD 101: An Introduction to GLOS Real-Time Quality Control Procedures

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Agenda

- What is QARTOD?
- QARTOD implementation at GLOS
- QARTOD application and implications
- GLOS and QARTOD: next steps



What is QARTOD?

- Quality Assurance/Quality Control for Real-Time Oceanographic Data
- Standardized tests
- Ensures available data is of known quality
- IOOS Certification requirement for Regional Information Coordination Entities (RICE)



IOOS
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Observing System





Being a certified RICE means...

- Local observing data are leveraged to expand the pool of federal-quality data available nationwide.
- GLOS data are as reliable as the data you get from federal sources like NOAA.
- Federal sources are able to use this data without spending time and resources on additional QC.
- Data are archived at a national center which facilitates long-term data research.



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Seven Data Management Laws of QARTOD

1. Every real-time observation distributed to the ocean community must be accompanied by a quality descriptor.
2. All observations should be subject to some level of automated real-time quality test.
3. Quality flags and quality test descriptions must be sufficiently described in the accompanying metadata.
4. Observers should independently verify or calibrate a sensor before deployment.
5. Observers should describe their method/calibration accuracy in the real-time metadata.
6. Observers should quantify the level of calibration accuracy and the associated expected error bounds.
7. Manual checks on the automated procedures, the real-time data collected and the status of the observing system must be provided by the observer on a time scale appropriate to ensure the integrity of the observing system.



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QARTOD Tests and Parameters

26 IOOS CORE VARIABLES

ACIDITY	FISH ABUNDANCE	PATHOGENS	TEMPERATURE*
BATHYMETRY	FISH SPECIES	PHYTOPLANKTON SPECIES*	TOTAL SUSPENDED MATTER
BOTTOM CHARACTER	HEAT FLUX	SALINITY*	WIND SPEED AND DIRECTION*
COLORED DISSOLVED ORGANIC MATTER*	ICE DISTRIBUTION	SEA LEVEL*	ZOOPLANKTON ABUNDANCE
CONTAMINANTS	Ocean Color	STREAM FLOW	ZOOPLANKTON SPECIES
DISSOLVED NUTRIENTS*	OPTICAL PROPERTIES*	SURFACE CURRENTS*	
DISSOLVED OXYGEN*	PARTIAL PRESSURE OF CO ₂	SURFACE WAVES*	



QARTOD Tests and Parameters

- QARTOD Manuals

- Real-Time Quality Control of Passive Acoustics Data
- Real-Time Quality Control of Phytoplankton Data
- Real-Time Quality Control of HF Radar Observations
- Real-Time Quality Control of Dissolved Nutrients Observations
- Real-Time Quality Control of Wind Data
- Real-Time Quality Control of Water Level Data
- Real-Time Quality Control of In-Situ Surface Wave Data
- Real-Time Quality Control of Ocean Optics Data
- Real-Time Quality Control of In-Situ Temperature and Salinity Data
- Real-Time Quality Control of In-Situ Current Observations
- Real-Time Quality Control of Dissolved Oxygen Observations in Coastal Oceans



QARTOD Tests and Parameters

• US IOOS 26 Core Variables

- Nine completed
- Two non-core completed
- Three supporting docs

Core Variable Manuals Completed	Core Variable (s) Covered	Other Variables Covered
Dissolved Oxygen	Dissolved Oxygen	
In-Situ Currents	Current Speed and Direction	
In-Situ Waves	Surface Waves	
Temperature and Salinity	Temperature Salinity	
Water Level	Sea Level	
Wind Speed and Direction	Wind Speed and Direction	
Ocean Optics	CDOM Ocean Color Optical Properties	In-water & above-water radiance/irradiance, Beam attenuation, Turbidity, PAR, Chlorophyll, FDOM, Backscattering/volume scattering
Dissolved Nutrients	Dissolved Nutrients	Nitrogen (NO3, NO2, and NH4) Phosphate Silicate
Phytoplankton Species	Phytoplankton Species	
Other Manuals (not core variables)		
Five Year Plan Update		
Data Flags Manual		
HFR Surface Currents		
Glider DAC		
Passive Acoustics		



QARTOD Tests and Parameters

- Required, recommended and suggested QC tests

Example from IOOS “Manual for Real-Time Quality Control of In-situ Temperature and Salinity Data”

Group 1 <i>Required</i>	Test 1) Test 2) Test 3) Test 4) Test 5)	Gap Test Syntax Test Location Test Gross Range Test Climatological Test
Group 2 <i>Strongly Recommended</i>	Test 6) Test 7) Test 8)	Spike Test Rate of Change Test Flat Line Test
Group 3 <i>Suggested</i>	Test 9) Test 10) Test 11) Test 12) Test 13)	Multi-Variate Test Attenuated Signal Test Neighbor Test TS Curve/Space Test Density Inversion Test



QARTOD Tests and Parameters

Flag	Primary-Level Flag Short Name	Definition
1	Pass / Good	Data have passed critical real-time quality control tests and are deemed adequate for use as preliminary data
2	Not evaluated, not available or unknown	Data have not been QC-tested or the information on quality is not available
3	Questionable / suspect	Data are considered to be either suspect or of high interest to data providers and users. They are flagged suspect to draw further attention to them by operators
4	Fail / Bad	Data are considered to have failed one or more critical real-time QC checks. If they are disseminated at all, it should be readily apparent that they are not of acceptable quality
9	Missing Data	Used as a placeholder when data are missing



GLOS QARTOD Tests and Parameters

variable	units	gross range				spike		rate of change	flat_line		
		sensor_min	sensor_max	user_min	user_max	low_threshold	high_threshold	high_threshold	low_reps	high_reps	epsilon
Air_Pressure	hPa	500	1110	950	1030	1	2	1.5	6	12	0.1
Air_Temperature	degree_Celsius	-45.6	65.6	-17.7	37.8	2.2	3.3	3.3	2	6	0.1
Dew_Point	degree_Celsius	-45.6	65.6	-28.9	37.8	2.2222	3.3333	3.3333	2	6	0.1
dissolved_oxygen	mg/L	0	50	0	20	0.5	1	0.5	10	100	0.1
dissolved_oxygen_saturation		0	500	0	110	10	20	2	10	100	0.01
ph		0	14	7	10	0.25	5	0.2	10	20	0.01
Relative_Humidity	%	0	100	0	100	15	20	20	6	12	0.1
Significant_Wave_Height	m	0	15.24	0.06096	9.144	0.9144	1.524	1.2192	2	6	0.1
Significant_Wave_Period	sec	0	100	0.5	10	0.2	0.4	0.5	2	6	0.1
significant_wave_to_direction	degrees	0	360	0	360	360	360	360	2	6	0.1
Solar_Radiation	W/m^2	0	3000.0	0	1400	400	800	700	100	200	0.1
Thermistor_String	degree_Celsius	-5	50	0	35	1	2	1.5	2	4	0.01
water_conductivity	μS/cm	0	600			25	40	40	2	4	0.01
Water_Temperature_at_Surface	degree_Celsius	-5	50	0	35	1	2	1.5	2	4	0.01
Wind_from_Direction	degrees	0	360	0	360	360	360	360	2	6	0.1
Wind_Gust	m/s	0	100	0	44.7	11.2	17.9	17.9	2	6	0.1
Wind_Speed	m/s	0	100	0	44.704	6.7056	8.9408	8.9408	2	6	0.1
ysi_blue_green_algae		-2	100	-2	75	10	25	2	2	4	0.01
ysi_chlorophyll		-2	100	-2	50	10	25	2	2	4	0.01
ysi_turbidity		0	4000	2	1000	10	20	1	2	4	0.01



QARTOD Tests and Parameters

Test 4) Gross Range Test (Required)

Data point exceeds sensor or operator-selected min/max. Applies to T, SP, C and P.		
<p>All sensors have a limited output range, and this can form the most rudimentary gross range check. No values less than a minimum value or greater than the maximum value the sensor can output (T_SENSOR_MIN, T_SENSOR_MAX) are acceptable. Additionally, the operator can select a smaller span (T_USER_MIN, T_USER_MAX) based upon local knowledge or a desire to draw attention to extreme values.</p> <p>NOTE: Operators may choose to flag as suspect values that exceed the calibration span but not the hardware limits (e.g., a value that sensor is not capable of producing or negative conductivity).</p>		
Flags	Condition	Codable Instructions
Fail=4	Reported value is outside of sensor span.	If $T_n < T_SENSOR_MIN$, or $T_n > T_SENSOR_MAX$, flag = 4
Suspect=3	Reported value is outside of operator-selected span.	If $T_n < T_USER_MIN$, or $T_n > T_USER_MAX$, flag = 3
Pass=1	Applies for test pass condition.	
Test Exception: None.		
<p>Test specifications to be established locally by the operator.</p> <p>Examples: The following global range min/max are applied on some climate and forecast standard-names in the IMOS toolbox: depth: -5/12,000 m sea_water_pressure: -5/12,000 decibars (dbar) sea_water_pressure_due_to_sea_water: -15/12,000 dbar sea_water_salinity: 2/41 sea_water_temperature: -2.5/40 °C</p>		

Example from IOOS “Manual for Real-Time Quality Control of In-situ Temperature and Salinity Data”



QARTOD Tests and Parameters

Test 6) Spike Test (Strongly Recommended)

Data point $n-1$ exceeds a selected threshold relative to adjacent data points. Applies to T, SP, C, and P.

This check is for single value spikes, specifically the value at point $n-1$. Spikes consisting of more than one data point are difficult to capture, but their onset may be flagged by the rate of change test. The spike test consists of two operator-selected thresholds, THRS_HLD_LOW and THRS_HLD_HIGH. Adjacent data points ($n-2$ and n) are averaged to form a spike reference (SPK_REF). The absolute value of the spike is tested to capture positive and negative spikes. Large spikes are easier to identify as outliers and flag as failures. Smaller spikes may be real and are only flagged suspect. The thresholds may be fixed values or dynamically established (for example, a multiple of the standard deviation over an operator-selected period).

Flags	Condition	Codable Instructions
Fail=4	High spike threshold exceeded.	If $ T_{n-1} - \text{SPK_REF} > \text{THRS_HLD_HIGH}$, flag = 4
Suspect=3	Low spike threshold exceeded.	If $ T_{n-1} - \text{SPK_REF} > \text{THRS_HLD_LOW}$ and $ T_{n-1} - \text{SPK_REF} \leq \text{THRS_HLD_HIGH}$, flag = 3
Pass=1	Applies for test pass condition.	N/A

Test Exception: None.

Test specifications to be established locally by the operator.

Examples: THRS_HLD_LOW = 3 °C, THRS_HLD_HIGH = 8 °C

Example from IOOS “Manual for Real-Time Quality Control of In-situ Temperature and Salinity Data”



QARTOD Tests and Parameters

Test 7) Rate of Change Test (Strongly Recommended)

Excessive rise/fall test. Applies to T, SP, C, and P.		
<p>This test inspects the time series for a time rate of change that exceeds a threshold value identified by the operator. T, SP, C, P values can change substantially over short periods in some locations, hindering the value of this test. A balance must be found between a threshold set too low, which triggers too many false alarms, and one set too high, making the test ineffective. Determining the excessive rate of change is left to the local operator. The following show three different examples of ways to select the thresholds provided by QARTOD VI participants. Implementation of this test can be challenging. Upon failure, it is unknown which of the points is bad. Further, upon failing a data point, it remains to be determined how the next iteration can be handled.</p> <p>The rate of change between temperature T_{n-1} and T_n must be less than three standard deviations ($3*SD$). The SD of the T time series is computed over the previous 25-hour period (operator-selected value) to accommodate cyclical diurnal and tidal fluctuations. Both the number of SDs (N_DEV) and the period over which the SDs (TIM_DEV) are calculated and determined by the local operator.</p> <p>The rate of change between temperature T_{n-1} and T_n must be less than $2\text{ }^{\circ}\text{C} + 2SD$.</p> <p>$T_{n-1} - T_{n-2} + T_{n-1} - T_n \leq 2*N_DEV*SD$ (example provided by EuroGOOS).</p>		
Flags	Condition	Codable Instructions
Fail=4	No fail flag is identified for this test.	N/A
Suspect=3	The rate of change exceeds the selected threshold.	If $ T_n - T_{n-1} > N_DEV*SD$, flag = 3
Pass=1	Applies for test pass condition.	N/A
Test Exception: None.		
Test specifications to be established locally by operator. Example: N_DEV = 3, TIM_DEV = 25		

Example from IOOS “Manual for Real-Time Quality Control of In-situ Temperature and Salinity Data”



QARTOD Tests and Parameters

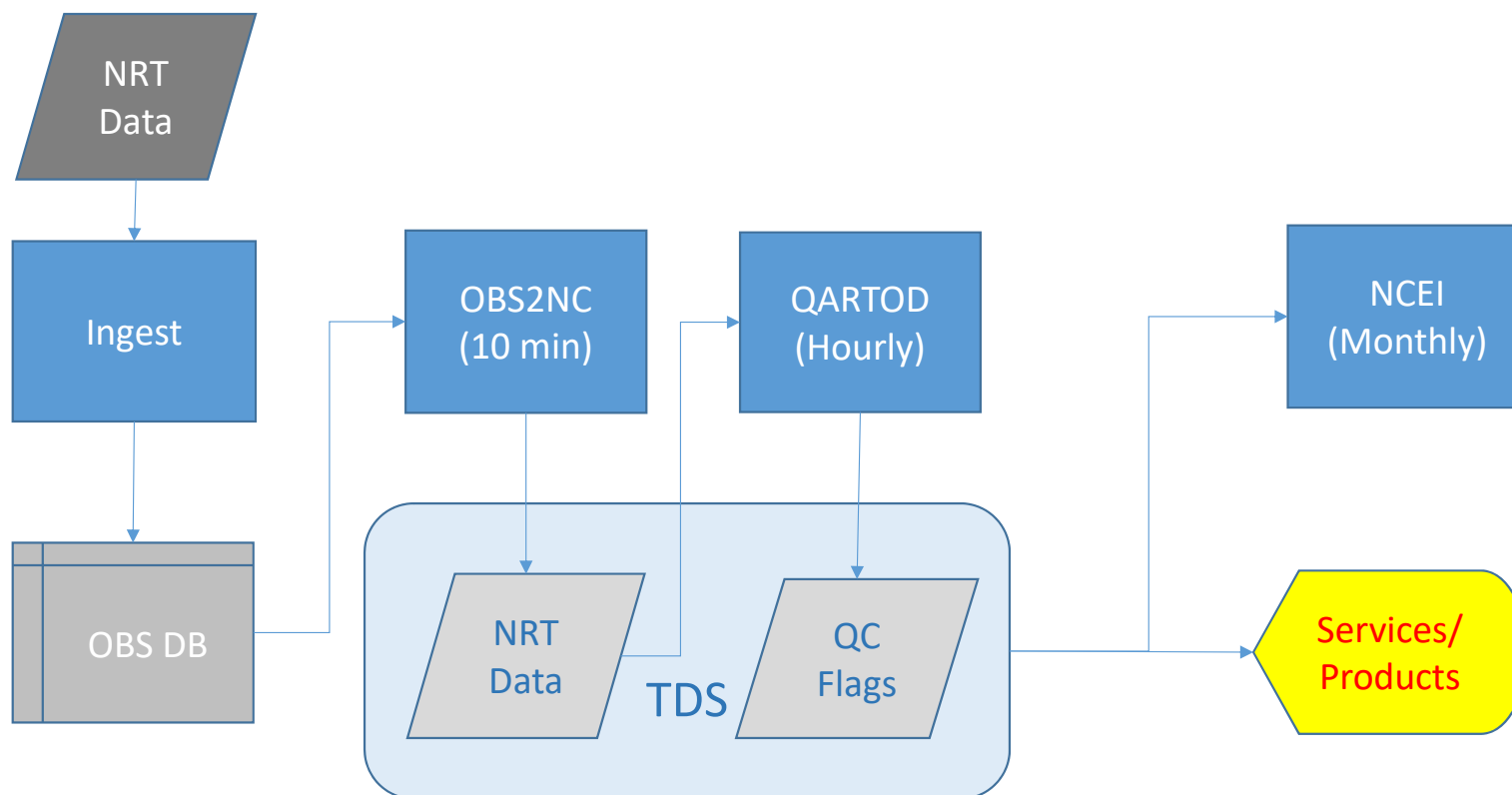
Test 8) Flat Line Test (Strongly Recommended)

Invariant value. Applies to T, SP, C, and P.		
When some sensors and/or data collection platforms fail, the result can be a continuously repeated observation of the same value. This test compares the present observation n to a number (REP_CNT_FAIL or REP_CNT_SUSPECT) of previous observations. Observation n is flagged if it has the same value as previous observations within a tolerance value, EPS, to allow for numerical round-off error. Note that historical flags are not changed.		
Flags	Condition	Codable Instructions
Fail=4	When the five most recent observations are equal, T_n is flagged fail.	For $i=1, \text{REP_CNT_FAIL } T_n - T_{n-i} < \text{EPS}, \text{ flag} = 4$
Suspect=3	It is possible but unlikely that the present observation and the two previous observations would be equal. When the three most recent observations are equal, T_n is flagged suspect.	For $i=1, \text{REP_CNT_SUSPECT } T_n - T_{n-i} < \text{EPS}, \text{ flag} = 3$
Pass=1	Applies for test pass condition.	N/A
Test Exception: None.		
Test specifications to be established locally by the operator. Examples: REP_CNT_FAIL = 5, REP_CNT_SUSPECT= 3, EPS = 0.05°		

Example from IOOS “Manual for Real-Time Quality Control of In-situ Temperature and Salinity Data”



GLOS QARTOD Implementation: Data Flow





GLOS QARTOD Implementation: Details

- Default flag values to '2' for 'Not Evaluated' on initialization
- Individual flags for each test + primary flag
- Run tests on observations in near real-time (hourly)
- Run QC on-demand for delayed data if necessary
- Standardized spreadsheet for configuration of QC parameters
- NetCDF solution
 - stores flags as values
 - adds many variables to every dataset, but...
 - clear, self-describing



GLOS QARTOD Implementation: Packages

1. IOOS QARTOD: utilities, scripts and tests to assist in automated QARTOD application
 - Implementation agnostic - requires array of data and returns array of flags
 - Includes location, gross range, climatology, spike, rate of change, flat line, attenuated signal
 - Includes tests for the tests
2. GLOS netCDF Wrapper: python utility for applying IOOS QARTOD to netCDF time-series datasets.
 - Reads netCDF files
 - Reads QARTOD config file
 - Initializes/applies the tests
 - Writes the results to netCDF



QARTOD Examples

- TDS access demo
- RPS tool demo (non-GLOS)



TDS Access

[http://tds.glos.us/thredds/dodsC/buoy_agg_standard_qc/leelyria/leelyria.ncml?Water_Temperature_at_Surface\[0:1:100\],qartod_Water_Temperature_at_Surface_flat_line_flag\[0:1:100\],qartod_Water_Temperature_at_Surface_gross_range_flag\[0:1:100\],qartod_Water_Temperature_at_Surface_spike_flag\[0:1:100\],qartod_Water_Temperature_at_Surface_primary_flag\[0:1:100\],qartod_Water_Temperature_at_Surface_rate_of_change_flag\[0:1:100\]](http://tds.glos.us/thredds/dodsC/buoy_agg_standard_qc/leelyria/leelyria.ncml?Water_Temperature_at_Surface[0:1:100],qartod_Water_Temperature_at_Surface_flat_line_flag[0:1:100],qartod_Water_Temperature_at_Surface_gross_range_flag[0:1:100],qartod_Water_Temperature_at_Surface_spike_flag[0:1:100],qartod_Water_Temperature_at_Surface_primary_flag[0:1:100],qartod_Water_Temperature_at_Surface_rate_of_change_flag[0:1:100])

☒ **qartod_Water_Temperature_at_Surface_flat_line_flag**: Array of 8 bit Bytes [time = 0..128684]

time: 0:1:100

Unsigned: false
_FillValue: 9
units: 1
standard_name: Water_Temperature_at_Surface status_flag
long_name: QARTOD Flat Line Test for Water_Temperature_at_Surface

☒ **qartod_Water_Temperature_at_Surface_gross_range_flag**: Array of 8 bit Bytes [time = 0..128684]

time: 0:1:100

Unsigned: false
_FillValue: 9
units: 1
standard_name: Water_Temperature_at_Surface status_flag
long_name: QARTOD Gross Range Test for

☒ **qartod_Water_Temperature_at_Surface_spike_flag**: Array of 8 bit Bytes [time = 0..128684]

time: 0:1:100

Unsigned: false
_FillValue: 9
units: 1
standard_name: Water_Temperature_at_Surface status_flag
long_name: QARTOD Spike Test for Water_Temperature_at_Surface

☒ **qartod_Water_Temperature_at_Surface_primary_flag**: Array of 8 bit Bytes [time = 0..128684]

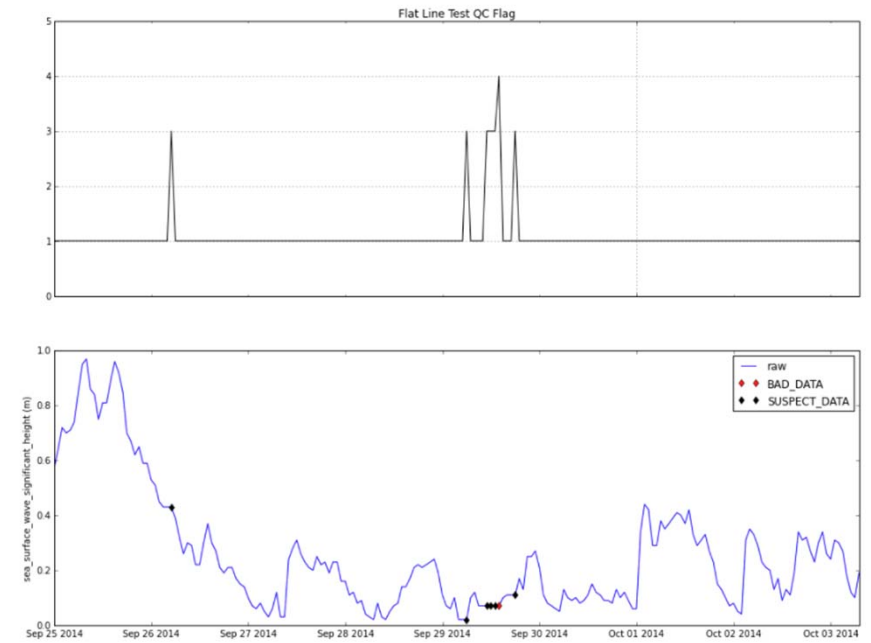
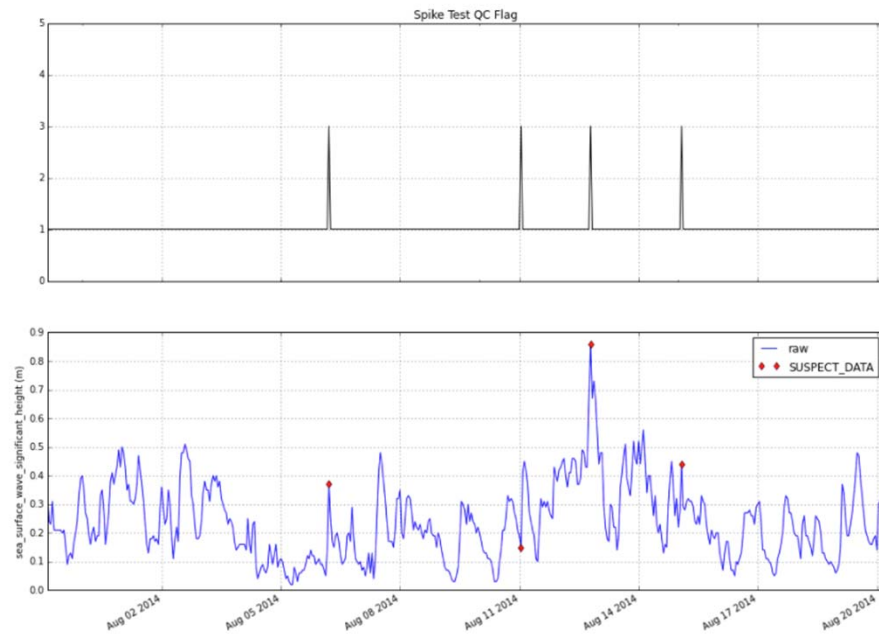
time: 0:1:100

Unsigned: false
_FillValue: 9
units: 1
standard_name: Water_Temperature_at_Surface status_flag
long_name: QARTOD Primary Flag for Water_Temperature_at_Surface

[illegible]



Jupyter Notebook





GLOS QARTOD: Next Steps?

- Refine test parameters
- Alerts to data providers
- Add more tests at GLOS or provider level
 - Climatologies?
- Add more parameters
- Integrate flags with retrieval/visualization



Useful Links

- IOOS QARTOD Project site
 - <https://ioos.noaa.gov/project/qartod/>
- GitHub QARTOD code
 - <https://ioos.github.io/qartod>
- GitHub GLOS QARTOD
 - <https://github.com/glos/glos-qartod>
- RPS Jupyter notebook
 - https://github.com/glos/QARTOD/blob/master/notebooks/plot_QARTOD_results.ipynb
- GLOS TDS
 - <http://tds.glos.us/thredds/catalog.html>
- Feedback
 - dmac@glos.us



Wrap-Up

- Questions or comments?
- Thank you ...
 - Please fill out our webinar survey!