

# Global Lakes Sentinel Services

Grant number 313256

# GLaSS Training material, Lesson #4

# Assessing trophic status tendency from 10-years observation from MERIS

# Is Lake Tanganyika subject to eutrophication?

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## Lesson summary

Deep clear lakes are characterized by large volume of good quality waters thus providing a wide range of ecosystem services (e.g. biodiversity, climate change mitigation, fishery, drinking water, tourism and recreation). Although these lakes are less vulnerable to eutrophication than small shallow lakes, a continuous input of nutrients has led to increasing eutrophication in many of them. Conversely, improved practices in water management (e.g. fertilization policy) might lead to trophic status decreasing in other lakes. This lesson covers how we can use satellite data to assess the trend of trophic level in Lake Tanganyika, the third largest lake in the world by volume, one of the richest freshwater ecosystems supplying fish in the diet of the one million people living around the lake.



## **GLaSS** training material outline

This lesson is part of the GLaSS training material. The complete training material outline is listed on <u>http://data.waterinsight.nl/GLaSS/trainingmaterials/GLaSS\_lesson\_outline.pdf</u>.

Note that the lessons logically follow up on each other, the later lessons might require skills that can be acquired during the earlier lessons.



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# List of abbreviations

| Abbreviation | Description                                   |
|--------------|---|
| CC           | CoastColour                                   |
| CDOM         | Colored dissolved organic matter              |
| Chl          | Chlorophyll                                   |
| EO           | Earth observation                             |
| MERIS        | Medium Resolution Imaging Spectrometer        |
| MODIS        | Moderate Resolution Imaging Spectroradiometer |
| ROI          | Region Of Interest                            |
| WISP-3       | Water Insight SPectrometer with 3 radiometers |



## 1 Introduction

Deep clear lakes are essential strategic resources, constitute an environment for ecosystem (flora and fauna) and supply waters for industry, domestic and agriculture uses. Overall, they provide multiple ecosystem services and are resources for recreation and tourism, with their attractions of landscape, mild climate and water quality. To preserve these vital ecosystems it is important to understand their complete evolution by continuous long-term monitoring of trophic status and water quality.

Over the past decade, latest generation of ocean colour sensors such as MODIS and MERIS, with their specific capacities for resolving productive and turbid waters, have provided unique information for lake monitoring. In particular, those sensors allow the concentration of chlorophyll-a as a proxy of phytoplankton biomass and hence of trophic level to be accurately assessed from season to season during time at global scale.

This lesson relies on the 12-years long MERIS time series and aims to describe the trophic status trend in Lake Tanganyika a deep clear lake in the African Rift. With an average depth of 570 m and a surface of 18,900 km<sup>3</sup>, Lake Tanganyika is the third largest lake in the world by volume and one of the richest freshwater ecosystems: about 600 of these species exist nowhere else in the world outside the Lake Tanganyika watershed. The lake is an important source of fish for consumption and for trade as approximately one million people lives there. The lake is also a vital transport and communications link between the bordering countries Tanzania, Congo, Burundi and Zambia.

The trophic status trend in Lake Tanganyika is obtained by applying statistical tests to chlorophyll (Chl) concentration obtained from MERIS imagery. To capture the patchy distribution of phytoplankton, the analysis is performed for at sub-basin scales. A variety of tools available in BEAM-VISAT will be used for such purposes.



## 2 This lesson

#### 2.1 Research question

Is Lake Tanganyika subject to eutrophication?

#### 2.2 Training objectives / skills to gain in this lesson

The aim of this lesson is to analyze trends in the trophic level evolution in Lake Tanganyika. Teaching students on how to assess the trophic status tendency in a big deep clear lake based on processing of long term time series of MERIS data.

- Visualization of MERIS-derived products
- Spatial analysis
- Definition of region of interests (ROI) on image data
- Application of BEAM tools on time series of Chl products for long-time series analysis
- Use of Kendall test to statistically assess if there is a monotonic upward or downward trend in Chl data

#### 2.3 Required software and data

#### Software and tools

To complete this lesson tasks, the following tools and software are required or suggested:

- BEAM/SNAP 2.0 (required, see Lesson #1).
  Figures and buttons position in this document are referred to the BEAM-VISAT interface. Some slight difference may occur in SNAP interface.
- R (see <a href="https://www.r-project.org/">https://www.r-project.org/</a> for free downloading and details) incl. xts, rkt, date and chron packages (Ryan and Ulrich, 2014; Marchetto, 2015; Therneau et al., 2014; James and Hornik, 2015) are suggested to perform the trend analysis (in Part 4) through the scripts provided but any software in which you could perform trend analysis could be used. Packages can be installed following instructions in provided scripts.

#### Downloadable files

- GLaSS\_Training\_Lesson4.pdf The main document of the lesson including exercises and questions.
- GLaSS\_Training\_Lesson4\_Answers.pdf A document containing answers to all questions proposed in the exercises.
- GLaSS\_Training\_Lesson4\_DataAndTools.zip Supplied data and tools, described below.

The zip-file with supplied data and tools contain:

A 'Sample\_data' directory containing:

 9 WISP-3 products derived from MERIS CoastColor (CC) images of Lake Tanganyika in NetCDF format (e.g. MER FSG CCL2R 20030823 080617 000002192019 00164 07733 5705.nc).



- 'Tanganyika\_regions.shp': shapefile of the sub-basins selected for the trophic status trend evaluation.
- 'Tanganyika\_Monthly.txt': Chl statistics extracted from all available images from two of the regions contained in Tangayika\_regions.shp, aggregated on monthly basis.
- 'Tanganyika\_regions\_coord.txt': ascii file containing centre coordinates of the same regions included in the shapefile.

A 'Tools' directory containing:

- 'Longtime\_trend.R', R script for the analysis of long-time trend Chl concentration.
- 'Stats\_extraction\_StatisticsOp.xml' and 'Stats\_extraction\_PixEx.xml' for the extraction through BEAM operators (respectively *StatisticsOp* and *PixEx*) in batch mode Chl values from MERIS Tanganyika products.



## 3 Exercise

#### Part 1 Single image visualization and analysis of level-2 products

In the GLaSS project core, for the estimation of ChI concentration, the WISP-3 algorithm was applied to flagged Level 2 MERIS-CC remote sensing reflectances. The WISP-3 algorithm (Peters et al., 2013) is a semi-analytical approach that uses an iterative scheme to calculate water quality parameters. In this first part, BEAM-VISAT tools are used for data visualization and for statistics extraction and spatial distribution analysis.

#### Activities

- Start VISAT, the BEAM interface (find it in ...\beam-5.0\bin).
- Open the MERIS image of May 23<sup>rd</sup> 2009 (*File > Open Product* and select image 'MER\_FSG\_CCL2R\_20090523\_080717\_000003402079\_00164\_37793\_6600.nc'). You can read the date from the image name.
- In the Products tab, expand product main folder, expand 'Bands' folder: several products are displayed, including TSM, CDOM and Chl concentration. Double click on wisptest\_chl to open a grey-scale map of Chl concentration.
- Expand 'Metadata'>'Variable\_Attributes' folder to find out more information on each variable: in particular, double clicking on *wisptest\_chl* info are shown as in Figure 1.

| [9] wisptest_chl |   |         |      | - 7 ×       |
|------------------|---|---------|------|-------------|
| Name             | Value   | Туре    | Unit | Description |
| FillValue        | -32768.0  | float64 |      |             |
| -scale_factor    | 1.0   | float64 |      |             |
| -coordinates     | lat lon   | asci    |      |             |
| -add_offset      | 0.0   | float64 |      |             |
| -long_name       | Calculated concentration for chlorofyl, @ Water Insight | asci    |      |             |
| units            | micrograms/litre  | asci    |      |             |
| ChunkSize.0      | 641   | int32   |      |             |
| ChunkSize.1      | 462   | int32   |      |             |

Figure 1. Metadata of Chl WISP-3 product.

- What are the variable units?
- Close metadata window and return back to Chl map: Chl values can be shown clicking on *Pixel info* tab and moving the pointer across the map (it shows the value for each pixel pointed)
- Switch to Colour manipulation tab: choose Editor Basic and the colour ramp you prefer (for example 'meris\_algal'. Change Minimum and Maximum values to be included in the scale range. Choosing the Editor Sliders, you can change the sliders distribution manually or distributing in equal intervals clicking on the button.

As shown in Figure 2, Chl concentration is not the same in the whole lake, but it varies in space.

• Where Chl concentration is higher?





Figure 2. Tanganyika Chl map on May 23<sup>rd</sup> 2009, as shown in BEAM-VISAT, and Colour Manipulation Tab (bottom-left).

> Select *wisptest\_chl* by left-clicking on the band name in the *Product Explorer* panel and select *Statistics*  $\Sigma$  to show statistical values of the whole image: click on  $\bigotimes$  to generate statistics. The tool will show statistics for the whole image, including pixels that don't belong to Lake Tanganyika. In the next section it will be discussed how to compute statistics for lake pixels only.



Figure 3. Statistics compute for the whole image of May 23<sup>rd</sup> 2009.



#### Part 2 Masks generation for products analysis

ROIs and masks can be useful in EO products analysis both to exclude pixels you are not interested in or conversely to consider only some pixels, mainly when values and statistics are extracted from them. As discussed in lesson 2, masks can be defined by several tools, by manually drawing them, through logical band math expressions or importing existing shapefile or csv file containing single points coordinates.

#### Activities

To create a mask containing Tanganyika pixels only, 'Tanganyika\_regions.shp' shapefile can be imported:

File > Import Vector Data > ESRI Shapefile and select 'Tanganyika\_regions.shp'. The files contains 5 polygons dividing the lake in 5 different sub-basins. BEAM asks you whether you want to use them separately. At this step we want to consider the whole lake, thus choose No. The shapefile is thus imported both as vector and mask and

can be managed through both *Vector Manager* and *Mask Manager*, to choose visibility, colour visualization and transparency.

Statistics can be now extracted for Tanganyika pixels only:

- > Open again  $\Sigma$ . This time tag *use ROI mask(s)* and select the 'Tanganyika\_regions' mask. Then click on  $\bowtie$  to obtain statistics.
- What's ChI mean and median concentration? What's the maximum value in the lake?
- Import again the 'Tanganyika\_regions.shp' shapefile but this time choose Yes when BEAM asks you whether you want to use them separately, indicating 'Basin' as 'Attribute for mask/layer naming'. 5 different geometries and masks are generated.
- What's Chl mean value in 'Centre' region? And in 'South' region?

Let's generate a mask containing only pixels in Lake Tanganyika with high Chl concentration, using as a threshold the sum of mean and standard deviation.

- Open and then f(x) to define a new mask on a new logical band math expression. In the *Expression* window type 'Tanganyika\_regions & wisptest\_chl > 2.58', to include only Lake Tanganyika pixels and with Chl concentration higher than 2.58 (the sum of Chl mean and standard deviation).
- $\succ$  A new mask is generated: open  $\Sigma$  and calculate again statistics using it.
- In how many pixels Chl exceeds the threshold defined above?



# Part 3 Long-time series generation from EO products data through BEAM PixEx or StatisticsOp operators

Both *PixEx* and *StatisticsOp* operators are useful for statistics extraction from remote sensing products.

*PixEx* extracts alternatively, the value contained in a pixel or in a group of pixels, giving all values (with 'no aggregation' method), the mean, the minimum, the maximum or the median value of pixels in a square window of a given size centred in a point of given coordinates. It extracts statistics from all available products given in input.

*StatisticsOp* extracts statistics (including given percentiles) from pixels defined by input shapefile. It aggregates the values on temporal basis, using the time interval defined.

These tools are useful for the generation of long-time series of data for further analysis.

#### Activities

- > In the folder 'Tools' open the 'Stats\_extraction\_PixEx.xml' file:
  - Complete the path for the directory in which MERIS images are stored and the file pattern (the pattern of all the products you want to include in your analysis), in this case '<sourceProductPaths>...\Sample\_data\\*.nc</sourceProductPaths>'. *PixEx* will recursively look for all NetCDF products in the folder.

  - Define the output path (a directory where you want to store *PixEx* results) and the prefix you prefer for the name of results file.
  - An expression can be used to define valid pixels: '<expression>!!2\_flags.L2R\_INVALID and !!2\_flags.L2R\_SUSPECT and !!2\_flags.INPUT\_INVALID and (wisptest\_chl < 50) and (wisptest\_chl &gt; 0)</expression'. It means that the tool will skip pixels defined as suspected or invalid by Level 1 and 2 processors and with ChI concentration higher than 50 µg/l, to avoid pixels with too high values, affected by any kind of problem like mixed pixels near the coast.
  - Define the aggregation method choosing among 'no aggregation', 'min', 'max', 'mean', 'median'.
- Open BEAM Command Line (look for it in your browser typing 'cmd') and type 'gpt ...\Tools\ Stats\_extraction\_PixEx.xml' (complete the directory path, do not use blank spaces). PixEx starts collecting all available products in the selected folder.
- Two files are thus generated in the output directory, 'Tanganyika\_ measurements.txt' and 'Tanganyika\_productIdMap.txt', containing, respectively, the values extracted from valid pixels for each station defined in the coordinates file, for all available bands in the input products and a list of all products used for statistics extraction.
- Import 'Tanganyika\_ measurements.txt' in a spreadsheet.
- Where and when the highest Chl concentration was recorded?



If you want to use a shapefile (or a geometry you have previously created in BEAM and suitably saved as a shapefile) you should use *StatisticsOp* recursively for each image, which would take much more time for the generation of long time series. On the other hand, accounting for the annual or seasonal mean of any parameter, it allows the generation of overall statistics, both in ascii and in shapefile format.

- > In the folder 'Tools', open the 'Stats\_extraction\_StatisticsOp.xml' file:
  - Complete the path for the source product as previously done with *PixEx* operator.
  - Complete the path for the Shapefile containing Lake Tanganyika regions polygons to be used to extract values and calculate statistics: '<shapefile>...\Sample\_data\Tanganyika\_regions.shp</shapefile>'.
  - Define the time interval for statistics extraction and aggregation: *StatisticsOp* considers only product which date is included in this interval: '<startDate/>2002-05-01 00:00:00' and '<endDate/>2002-12-31 23:59:00'.
  - Define the band name containing values to be extracted: '<sourceBandName>wisptest\_chl</sourceBandName>'.
  - The same expression used for *PixEx* could be used to define valid pixels.
  - Complete output files path for ascii and Shapefile output files.
  - Finally choose the percentiles to be calculated among statistics: e.g. '<percentiles>25,75</percentiles>'.
- Open BEAM Command Line (look for it in your browser typing 'cmd') and type 'gpt ...\Tools\ Stats\_extraction\_StatisticsOp.xml' (complete the directory path, do not use blank spaces). StatisticsOp starts collecting all available products in the selected time interval, in the selected folder.
- Open the output ascii file thus generated, named 'Tanganyika\_results.txt': it contains for each region average ('vrg\_0'), maximum ('mx\_0'), median ('mdn\_0') and minimum ('mn\_0') values, selected percentiles and, in column 'total', the number of valid pixels used for the calculation.

The output shapefile contains the same information.

• On the basis of the images provided, what's the overall mean value for Lake Tanganyika regions?



# Part 4 Long-time trend analysis of Chl concentration through Seasonal Kendall test

The Mann-Kendall test, is a non-parametric test, which allows the evaluation of monotonic trend over time. The Seasonal Kendall test (Hirsch and Slack, 1984) is a modification of the Mann-Kendall's, which allows taking into account seasonal patterns in the evaluation of monotonic trend. In the Mann-Kendall test, the statistic S, which is the difference between the number of pairwise slopes that are positive minus the number that are negative, is calculated by listing values in temporal order. The null hypothesis condition for this test is that there isn't any temporal trend in the data values, with a confidence limit of 0.05. In seasonal modification, the same statistic is calculated on each season separately and then the results are combined by summing up statistic S<sub>i</sub> for each season i over all seasons to form the overall test statistic S<sub>k</sub>. Along with this test, the Sen Slope can be calculated as indicator of median annual slope, calculating the slope of all possible pairs of values in each season. In this exercise we will consider 12 seasons (12 months) and we will use Chl values extracted from 'Centre' and 'North' regions from all available images from 2003 to 2011, aggregated on monthly basis.

#### Activities

- > Start the R console you installed and open 'Longtime\_trend.R'.
- Complete the script defining the path and file name containing Tanganyika monthly average values ('data <- read.table ('.../Sample\_data/results\_for\_Tanganyika\_month.txt', header=TRUE, sep='\t').
- Start the script.

The script provides the result of Seasonal Kendall test made on both regions in addition to the time series plots.

• What's Chl long-time trend from 2003 to 2011 for regions 'Centre' and 'North'? Is it meaningful?



## 4 More information and further reading

This lesson is based on the following report:

 GLaSS Deliverable 5.3, 2015. Global Lakes Sentinel Services, D5.3: Deep clear lakes with increasing eutrophication. CNR, WI, EOMAP, BG. Available via: <u>http://www.glass-project.eu/downloads/</u>

The report is suggested for further reading. It contains:

- Lake Garda
- Lake Maggiore
- Lake Constance
- Lake Vättern
- Lake Michigan
- Lake Malawi

For more information on GLaSS, and to download all public reports: <u>www.glass-project.eu</u>.



### References

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# Colophon

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# GLaSS Training material, Lesson #4

# Assessing trophic status tendency from 10-years observation from MERIS

Is Lake Tanganyika subject to eutrophication?

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2016

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