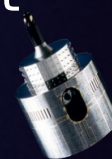


SENTINEL-3A CAL/VAL ENVIRONMENT AND APPLICATIONS



Jean-François Piollé, Ifremer
(Eumetsat/Copernicus visiting
scientist)

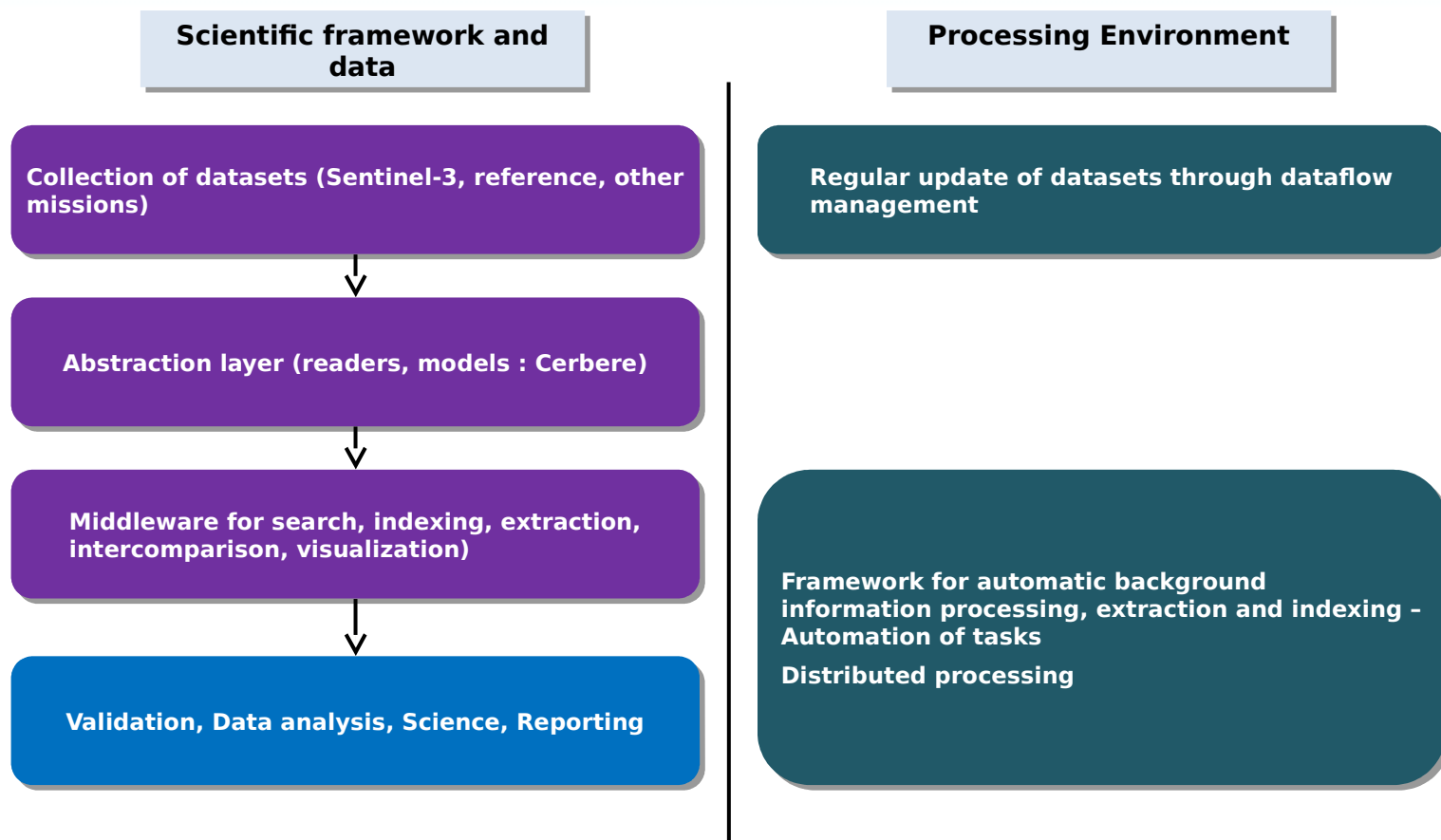
Igor Tomazic, Anne O'Caroll
Eumetsat



Ifremer



« exploitation platform concept » for cal/val



Prototype for a consistent open source and cloud based « thematic exploitation platform », cal/val oriented

GENERAL S3 CALVAL FRAMEWORK



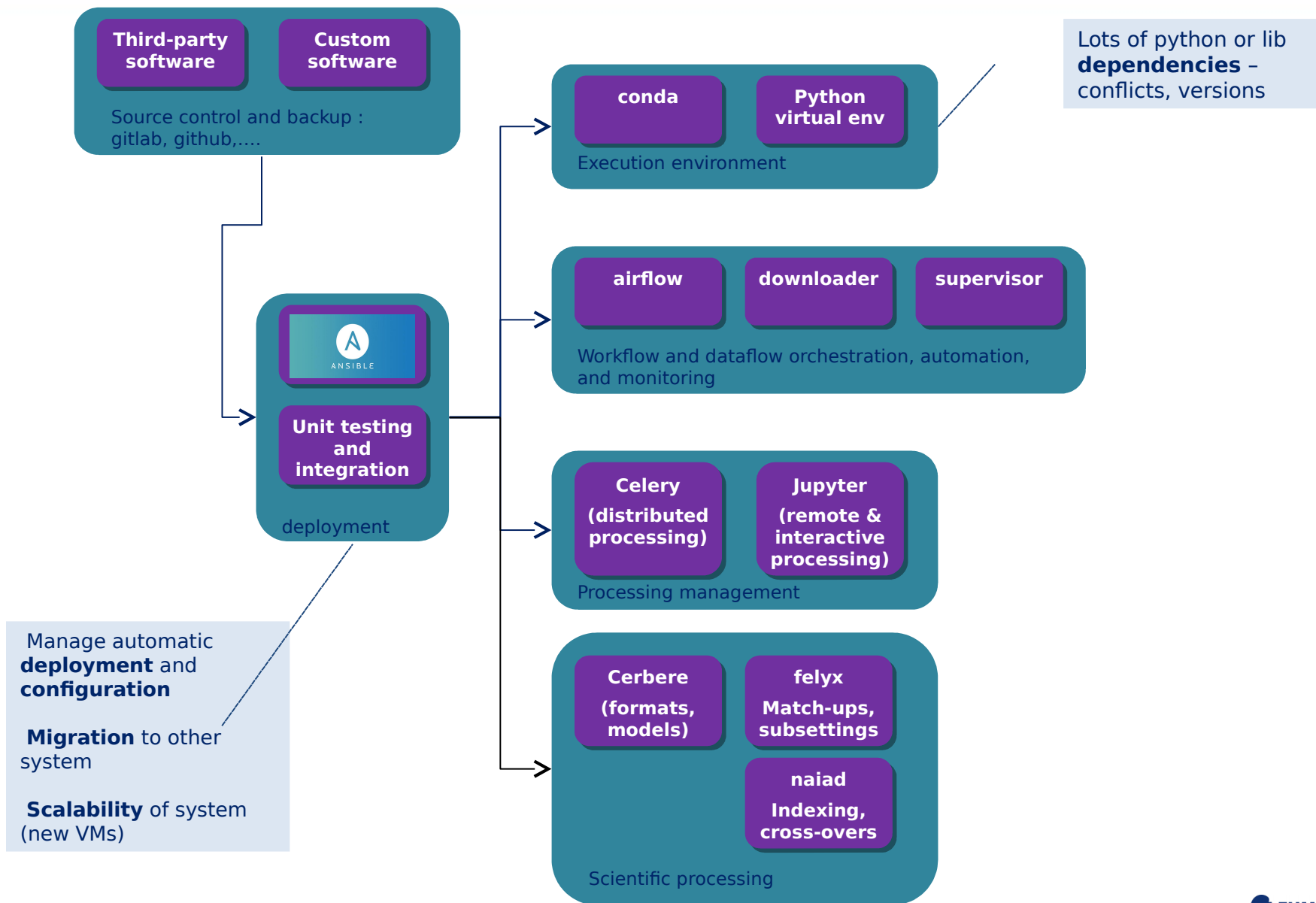
Cloud infrastructure

- Remote platform for Sentinel-3 cal/val
- Virtual desktop

- Dedicated cloud for Sentinel-3 cal/val, shared by SST, ocean colour and altimetry subgroups

- Specs
 - 9 VMs (64 GB RAM, 8 cores)
 - storage : 1 PB
 - Ubuntu

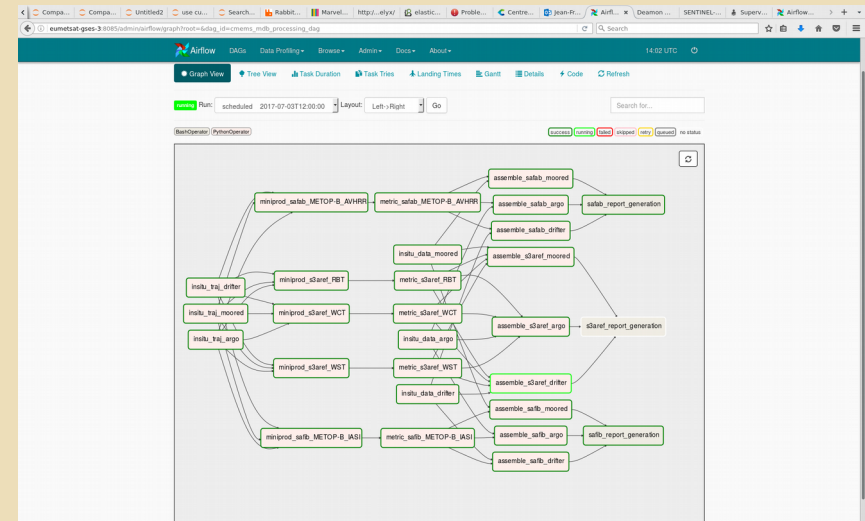
Building the cal/val environment



Workflow management : Airflow



- Task scheduler
- Schedules and runs processing workflows
 - Handle dependencies, conditions
 - Workflows implemented in python
 - Tasks distributed on different VMs (celery framework)
 - Alert through email and web interface
 - Quite complex to handle at first but very powerful framework for running and monitoring background tasks – time saver on the long run!!
- Deployed and installed on GSES with Ansible, controlled by supervisor
- High availability, very effective
- Absolutely essential for routine workflows



<https://airflow.incubator.apache.org>

Managing dataflows

Sentinel-3A data	versions
SL_1_RBT__	REF : reference - internal
SL_2_WCT__ (internal)	
SL_2_WST__	OPE : operational version
OL_1_ERR__	
OL_1_EFR__	REP : reprocessings (two)
OL_2_WRR__	
OL_2_WFR__	NRT : near real time NTC : non time critical
SR_2_WAT__	
The data to assess	

Reference data	Source
OSTIA	UK Met office
CMC	PO.DAAC
OSI SAF MDB NRT	Ifremer
CMEMS in situ data	Ifremer
Radiometer data	NOC
MOBY	NOAA
Aeronet	NASA
Rephy	Ifremer

The « ground truth »

Comparison data	Source
OSI SAF METOP-B AVHRR L2P	OSI SAF (Ifremer)
OSI SAF SEVIRI L2P	OSI SAF (Ifremer)
OSI SAF METOP-B IASI L2P	OSI SAF (Ifremer)
OSI SAF METOP-A IASI L2P	OSI SAF (Ifremer)
NOAA VIIRS L2P	NOAA
METOP-B IASI L1	Eumetsat
METOP-B IASI L2	Eumetsat

Similar products / sensors to compare with

Multiple dataflows to maintain updated

Multiple sources for download to monitor

Scripts + more advanced tools for easier management

Dataflow management :« downloader »

Maintaining complete up-to-date collections of reference and S3A datasets

Ensure completeness, continuous update / replacement

Store data in a common organization (possibly different from provider)

Connect to processing workflows (notifications, spools)

Purge data history (rolling archive) without impact on download

Ensure data integrity (use of checksum when provided)

Monitor data source (access, availability of the data) and raise issues

No on-the-shelf tool existing with enough intelligence to address all this issues

The screenshot displays the 'Downloader' web interface. At the top, there are navigation tabs: 'Downloader', 'Statistics', 'Real-time', and 'Administration'. Below this is a breadcrumb trail: 'back < model_LP_VIIRS_NPP_NAVO.download.xml.OFF >'. The main content area is titled 'Editing "model_LP_VIIRS_NPP_NAVO.download.xml.OFF"'. It features a step-based navigation bar with five steps: 1. Provider (selected), 2. Local storage, 3. Data, 4. Post processing, and 5. Advanced. A 'Mode' section contains five radio button options: 'Ftp (download from ftp to local storage)' (selected), 'Local copy (copy from local path into local storage)', 'Local symlink (create symbolic link to local path into local storage)', and 'Notify only (no download, only notify for new data)'. Below the configuration area, there is a status bar with 'Active downloads (1)', 'Disabled downloads (1)', and 'Test mode downloads (2)'. A notification box states 'file moved! Disabled download file "test.download.xml" has been "moved". (See Test mode downloads)'. The 'Test mode downloads' section shows a table with columns for 'download name', 'actions', and 'status'. One entry is 'podaac_avhrr17g2' with a 'Success' status. A 'status view' modal is open, showing 'test status' as 'Success' and 'last test date' as '2016-02-18T14:43:00Z'. It also includes a 'define file list' button and a 'test file' section with a 'run test' button. A 'Next' button is visible on the right side of the interface.

Documentation :

https://docs.google.com/document/d/1G8RBIAl3hBoJc_hjUcgj90qFGa0DPYb1OJBHKQ4A0jzE/edit?usp=sharing

Source code : <https://git.cersat.fr/felyx/downloader>

CALVAL TOOLS AND APPLICATION MIDDLEWARE



Cerberere : data abstraction layer in python

- Generic **python API** to access and describe file content (different data formats) and observation patterns
- Abstract layer to build generic tools and applications upon it
- Implemented at Ifremer, also access layer for software like felyx, naiad, cal/val tools and routines
- Generic data file model (similar to netCDF) – **mapper** :
 - Standard geolocation dimensions : row/cell, x/y, lat/lon, time,...
 - Other dimensions
 - Standard geolocation fields
 - Instrumental / geophysical fields : multi-dimensional arrays (incl.)
 - Variables attributes : no explicit scale factor, transformation performed in memory
 - Metadata (global attributes)
- Generic observation patterns - **datamodel**
 - Swath, Grid, Trajectory (along-track) , Image, TimeSeries, GridTimeSeries,....
 - Generic functions
 - save : format to similar format (dimensions, global attributes, etc...) any data following the same observation pattern
 - extraction of subsets, etc...
- Complemented by some companion packages
 - mappers for other formats (Sentinel-3/SAFE, IASI/EPS)
 - generic packages based on the cerbere datamodel concept : ancillary fields, display, resampling/interpolation, ocean parameter calculation,



Elasticsearch : nosql type of database (alternative solution to SOLR, Cassandra, Hbase,...), with geospatial extensions : used for geospatial information indexing and search

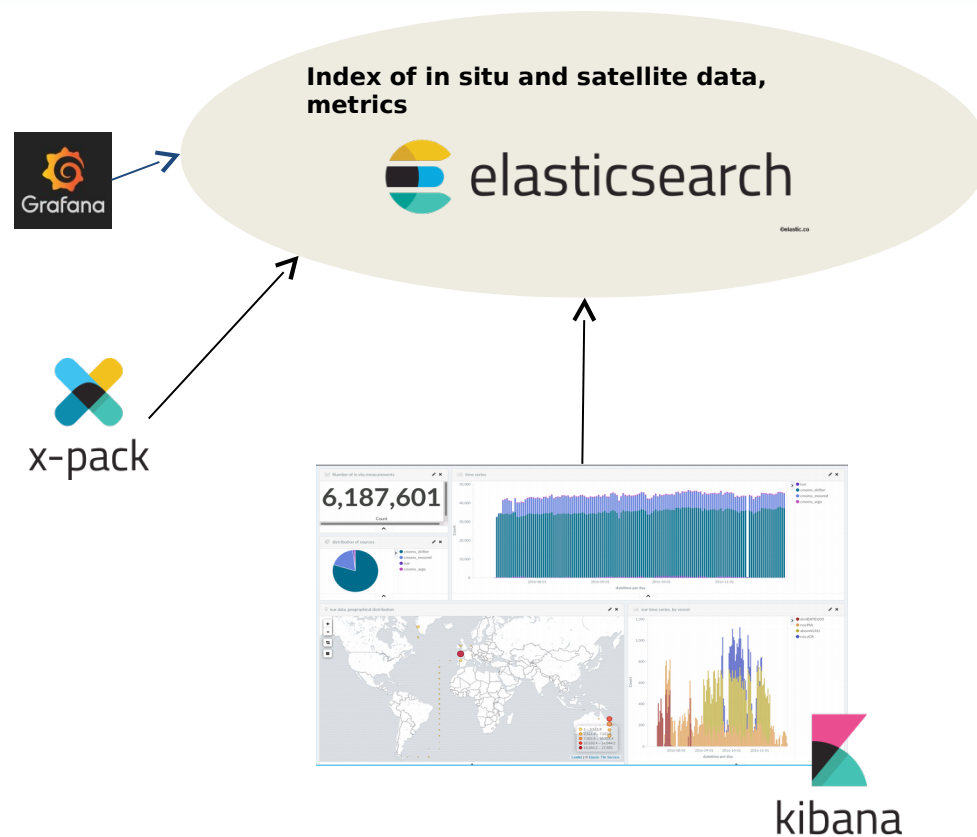
Take advantage of distributed environment (here GSES VMs)

Several third-party tools and analytics tools to leverage its full power)

Analyzing, alerting, finding patterns

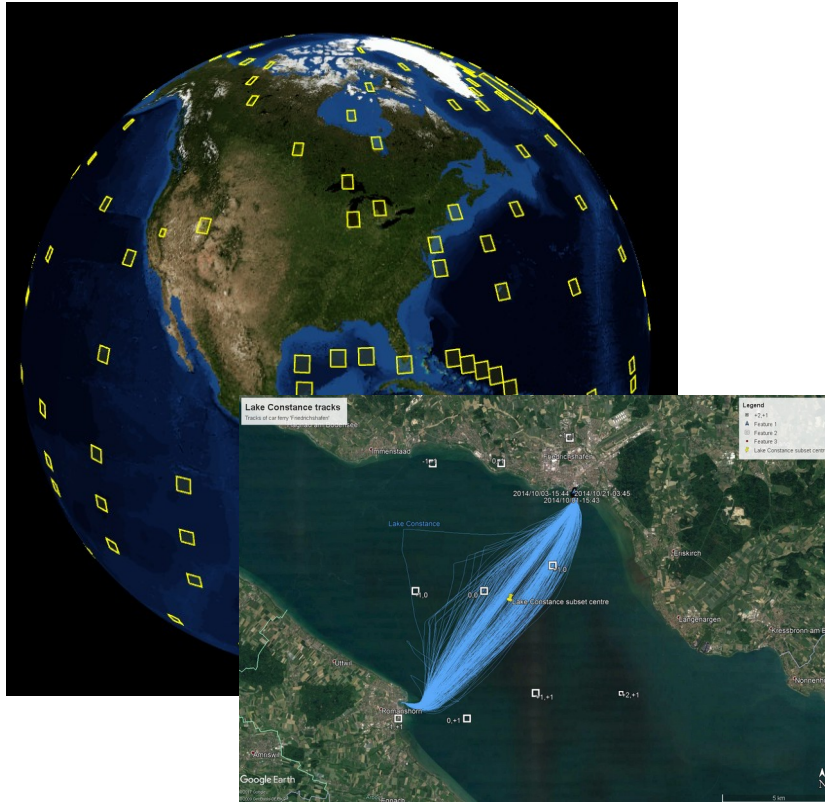
Barely scratching the surface now : machine learning, ...

Two main tools based on : **Felyx** and **Naiad**



CALVIVAL TOOLS AND APPLICATION MATCH-UP DATABASES WITH FELYX





Static sites

Extraction of time series

« dummy match-ups » => multi-sensor match-ups with no reference in situ measurement

Local case studies => lakes

Dynamic sites

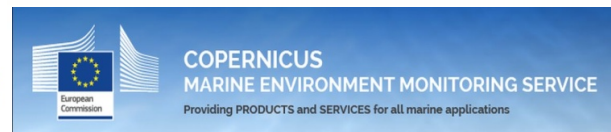
Match-ups with moving platforms (buoys, ships)

Does allow multi-sensor match-ups too but anchored to in situ measurement

SLSTR MDBs

In situ sources

- Benefit on general frameworks:



- CMEMS

- Integration with Copernicus/CMEMS service for the provision of moored and drifting buoys and Argo data : collection and availability of all data in the same format and quality control
- Canadian & european GDACs for surface drifters being created
- Expected improvements in quality control and metadata

- in situ radiometer

- <http://www.shipborne-radiometer.org/>
- High quality data
- Common format and content has been agreed
- Shared repository will be soon available assembling all these data
- Currently used in felyx : cruises from ABoM, NOC, RSMAS and DMI

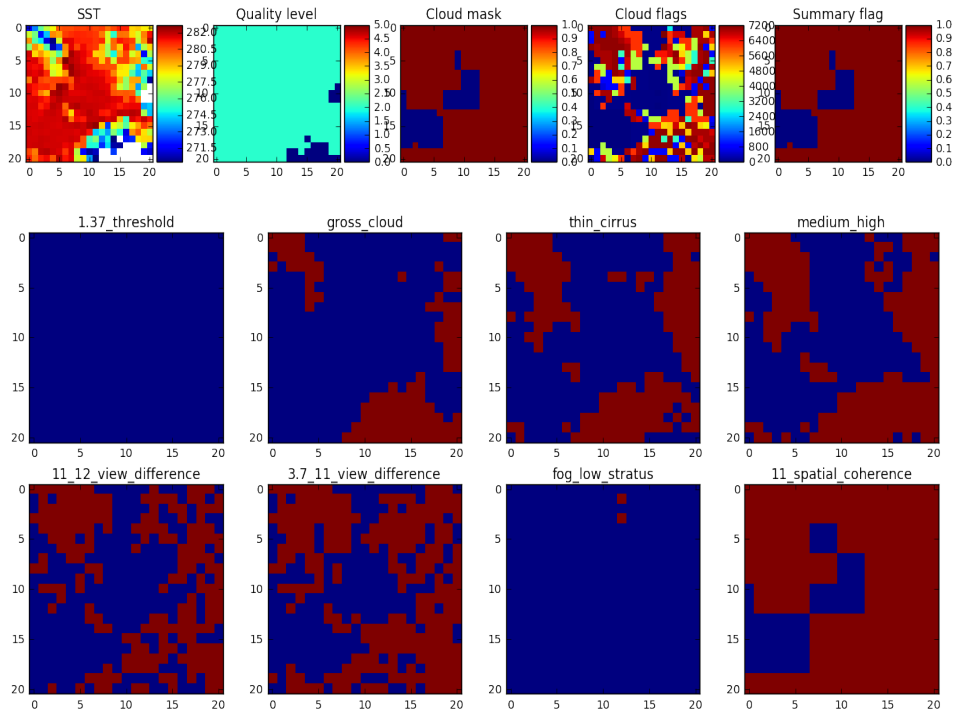


- All these data formatted in felyx format and available on ftp for ingestion into other MDB (request jfpiolle@ifremer.fr)

- Felyx + in situ data : framework for consistent MDB production for each GHRSSST product

Content of match-up

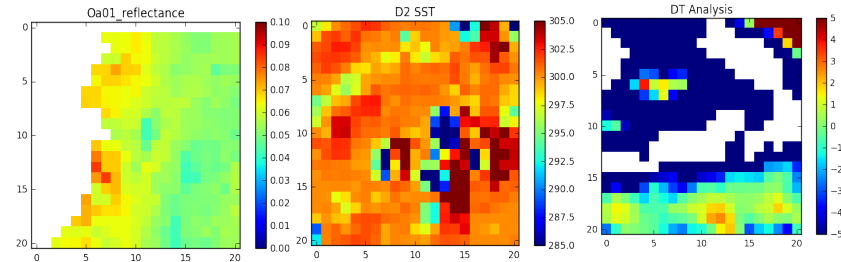
All fields from RBT (L1), WCT and WST (L2) traceability



More than 600 variables from L1 to L2.....

21x21 boxes extracted with all fields for each match-up can be used to test and assess new algorithms or post-processing on a larger scale and time period in a fast way, with in situ information to directly estimate the improvement.

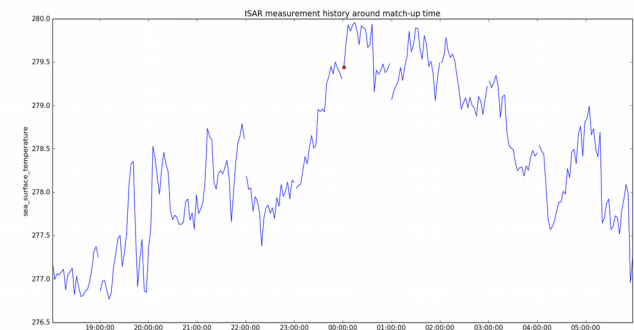
All fields from cross-overs and complementary files



Cross-over fields from OLCI, METOP, VIIRS

Complementary files from post processing of match-ups (prototype SST, quality level, etc...)

Ancillary fields (OSTIA dSST)



In situ buoy history centered on match-up

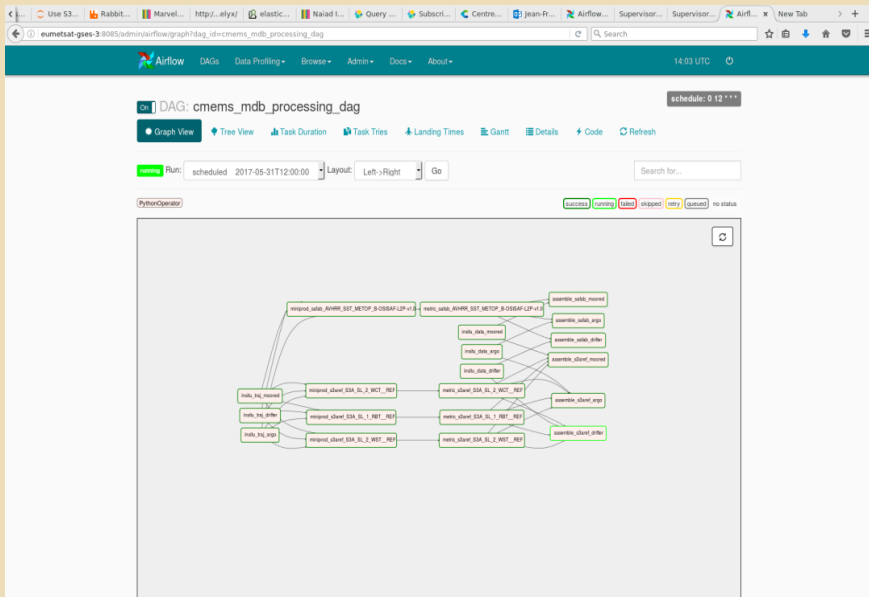
Existing match-up databases

Match-up database	Primary products	Complementary products	Availability
OSI SAF SLSTR MDB	SLSTR NRT products	METOP (about 50%) SEVIRI (about 30%) SST prototype OSTIA	July 2016 - present
Eumetsat reprocessed SLSTR MDB	SLSTR REP v4	OLCI SST prototype OSTIA	July - Nov 2016
Eumetsat reprocessed MDB	SLSTR REP v5	SST prototype OSTIA	Nov 2016 (-April 2017)
Eumetsat IASI MDB	Eumetsat & OSI SAF L2P METOP-A METOP-B IASI		June 2017 - onward
Eumetsat METOP-B MDB	OSI SAF L2P METOP-B AVHRR		June 2017 - onward

SLSTR MDB alternative configurations

- Challenge of MDB production is the collection and download of the input data, especially with SLSTR
- All product levels, operation and reference versions, reprocessed dataset
- Sentinel-3A and Sentinel-3B
- All SLSTR MDBs to be processed on EUM S3 cal/val environment

Processing baseline	Timeliness	MDB production
OPE	NTC	Continuous update, full time series
	NRT	On demand, to quantify difference with NTC, ~one month
REF	NTC	On demand, for validation of new PB
	NRT	On demand, for validation of new PB
Reprocessing	NTC	On demand, complete or partial time series



Airflow (<https://airflow.incubator.apache.org>) is a task scheduler

Processing workflow, from in situ data ingestion to match-up assembling, can be integrated in such system for automated MDB production

Provides automation, control and monitoring

Routine processing

Supervisor status

REFRESH | RESTART ALL | STOP ALL

State	Description	Name	Action
running	pid 1675, uptime 0:00:31	couchdb	Restart Stop Clear Log Tail-f
fail	Exited too quickly (process log may have details)	bermle-tq-base1	Start Clear Log Tail-f
fail	Exited too quickly (process log may have details)	bermle-tq-base2	Start Clear Log Tail-f
running	pid 1674, uptime 0:00:31	memmon	Restart Stop Clear Log Tail-f
running	pid 1676, uptime 0:00:31	theogramname	Restart Stop Clear Log Tail-f

Felix daemons supervised and run by **supervisor**

<http://supervisord.org>

supervision

```
felyx-run-mdb --miniprod --metric
--ancillary --assemble -t all -c
cmems_mdb.cfg -v --backlog 0 -l
20180306.log --date 20180306
```

Command-line script to run the complete MDB process for a time range

Several options to run specific steps or configurations

On-demand processing

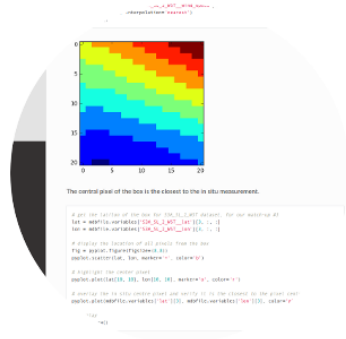
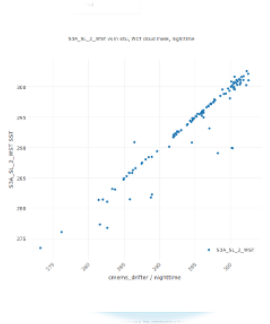
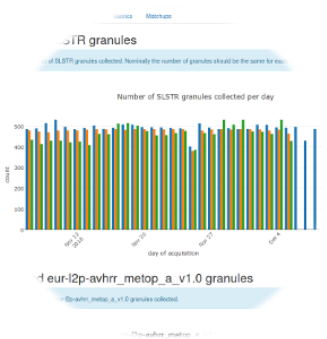


Sentinel-3A SLSTR Match-Up Database

Homepage of Ocean and Sea-Ice Satellite Application Facility (OSI SAF) match-up database for Sentinel-3A SLSTR instrument

This site gives access to colocations between all level SLSTR products and various sources of reference in situ measurements, completed with other third party mission measurements when close enough to SLSTR measurements. It is used for the validation and monitoring of SLSTR products. This project is funded by Eumetsat. The access to these data is restricted and must be requested to ifpiolle@ifremer.fr.

Note: interactive plots are best viewed with Chrome navigator.



Production reports

Statistics on the production of the match-ups with respect to input satellite and in situ data, to monitor completeness of match-up production and processing errors.

[View latest >>](#)

Analysis reports

Basic daily comparison statistics between SLSTR and in situ sea surface temperature measurements, as computed from the match-ups

[View latest >>](#)

Data access

How to access the data, python tools and tutorial to start with the match-up files.

[View details >>](#)



s3analysis 1.0

Search docs

- Sentinel-3A MDB databases
- s3analysis package
- pyfelyx
- s3analysis
- Reading and using the SLSTR MDB files
- Comparison of WST SST in situ using WCT cloud mask
- Investigate outliers in WST/WCT comparisons with in situ
- Investigate a match-up
- Generate diagnostics over the SLSTR MDB content

Docs » Welcome to s3analysis's documentation! [View page source](#)

Welcome to s3analysis's documentation!

Overview

- Sentinel-3A MDB databases
 - Sentinel-3 SLSTR MDB
- s3analysis package
 - Overview
 - Installation

Reference

- pyfelyx
- s3analysis

Tutorials

- Reading and using the SLSTR MDB files
 - basics
 - understanding the in situ section of the matchups
 - understanding the satellite part of the matchups
 - traceability
 - some advanced functions with s3analysis
- Comparison of WST SST in situ using WCT cloud mask
 - getting sst and cloud information
 - Compare with in situ
 - night time statistics
 - day time statistics
 - spatial coherence test
- Investigate outliers in WST/WCT comparisons with in situ
 - interactive display
- Investigate a match-up
 - trace back to original file
- Generate diagnostics over the SLSTR MDB content

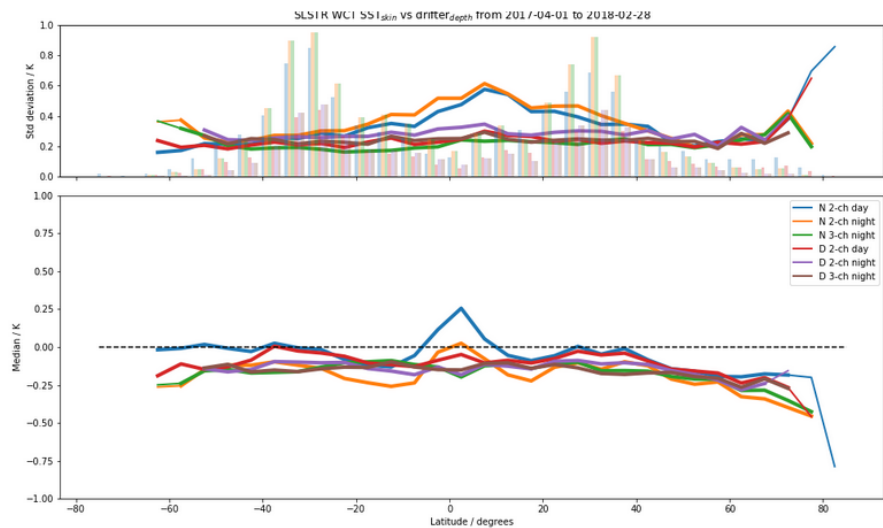
Jupyter notebooks for above tutorials can also be downloaded here:

- Using SLSTR MDB files
- Comparison between WST and in situ using WCT mask
- Investigating outliers
- Generate diagnostics

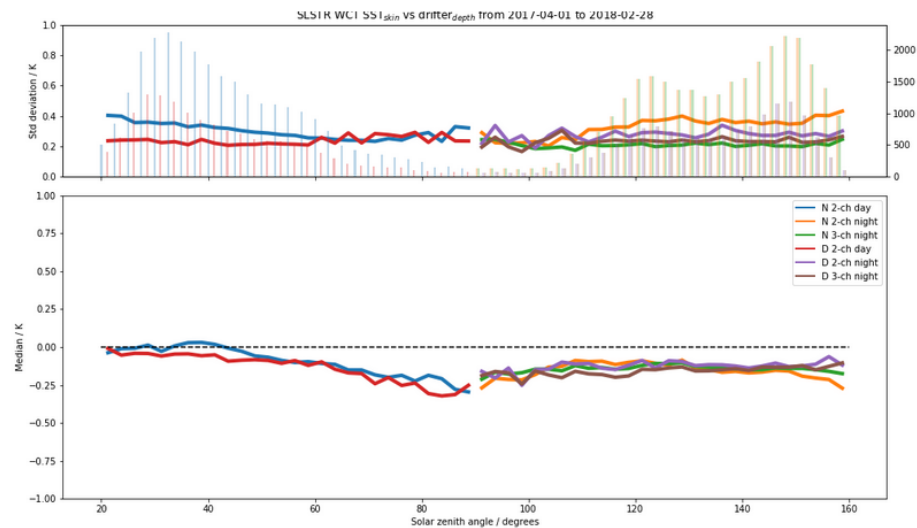
- Content of the match-up is quite complex
- Python package providing :
 - Abstraction over individual files (virtual file)
 - Handy pre-built selection filters
 - Diagnostic plots
- Demonstrated with jupyter notebooks
- Shared methodology for match-up analysis and diagnostic production
- Reproducible results

Dependency diagrams

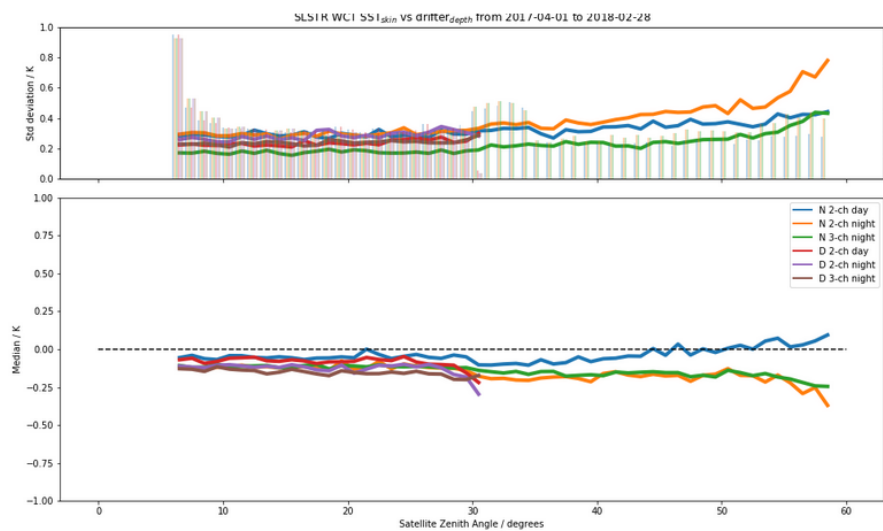
Latitude



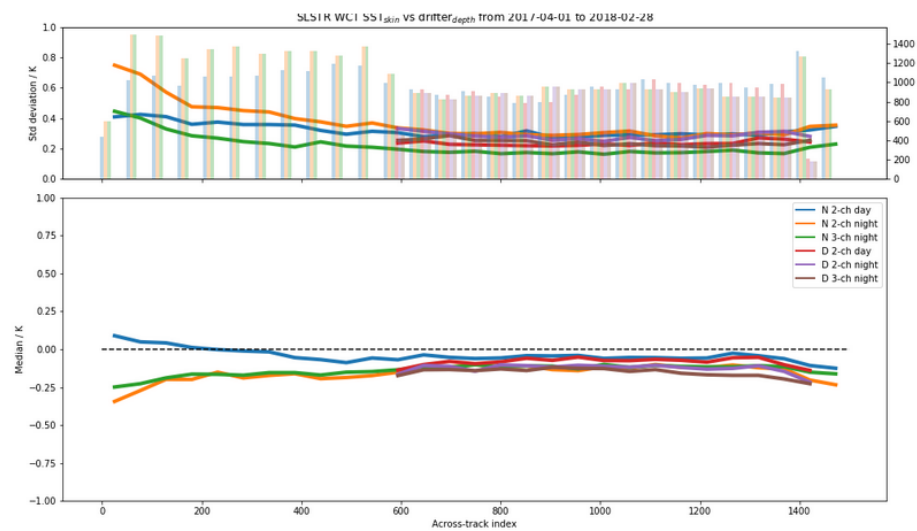
Solar Zenith Angle



Satellite Zenith Angle



Across Track Index



Wind Speed

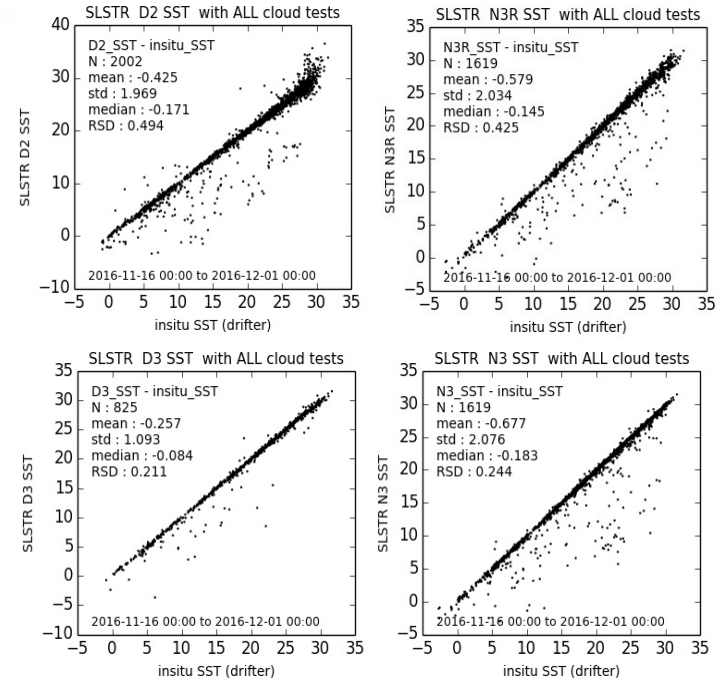


Total Waver Vapour Content



Application of SLSTR MDB(s)

- Used by different groups at Eumetsat, within S3VT and MPC Sentinel-3
- Major asset in:
 - L1 cloud screening validation (RAL)
 - L2 algorithm/cloud screening improvements
 - L2 Quality level stratification and uncertainties estimation (Univ. Of Leicester)
 - SST validation : OSI SAF (Meto-France / DMI / MetNo), NOAA, Eumetsat
 - Metis intercomparison framework



(WCT_SST - insitu_SST) with cloud clearing REC

algo	N	mean	std	median	RSD
N2	5293	-1.520	3.449	-0.330	0.560
N3R	1911	-0.617	2.098	-0.146	0.430
N3	1911	-0.727	2.165	-0.192	0.245
D2	2653	-0.735	2.654	-0.188	0.561
D3	966	-0.294	1.179	-0.096	0.209

26586 cases, 5299 clear cases 19.9 %

(WCT_SST - insitu_SST) with cloud clearing ALL

algo	N	mean	std	median	RSD
N2	4130	-0.973	2.608	-0.296	0.479
N3R	1619	-0.579	2.034	-0.145	0.425
N3	1619	-0.677	2.076	-0.183	0.244
D2	2002	-0.425	1.969	-0.171	0.494
D3	825	-0.257	1.093	-0.084	0.211

26586 cases, 4133 clear cases 15.5 %

No correction : skin WCT SST vs bulk insitu SST

Courtesy: Anne Marsouin, Meteo-France

CALVAL TOOLS AND APPLICATION

NAIAD : DATA INDEXING AND SEARCH



Naiad

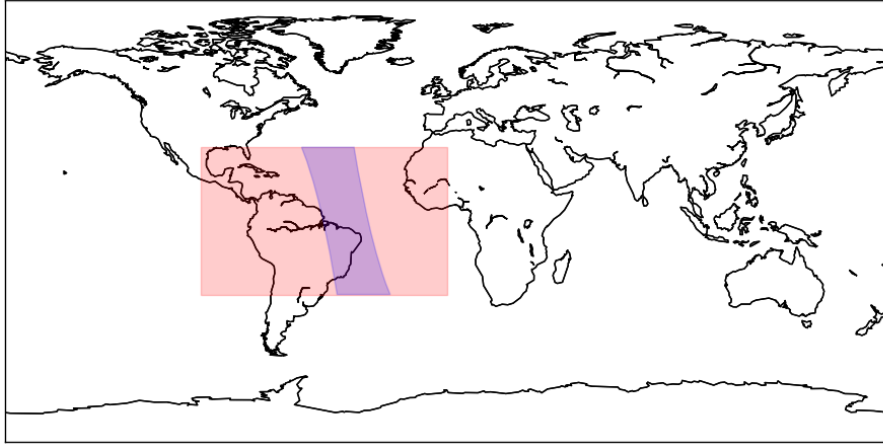
- Intended for **satellite to satellite cross-over** detection
- geo-indexing of observation data as temporally bounded geographical shapes
- Command line or API based
- **Main functions**
 - Search file or file subset wrt multiple criteria : spatial, temporal, properties and metadata
 - Cross-search in different datasets, with time window constraint (cross-overs)
- **Main outputs**
 - List of file subsets (file name, indices)

<http://naiad.readthedocs.io/en/develop/>

Naiad - queries

Command line tools or python API

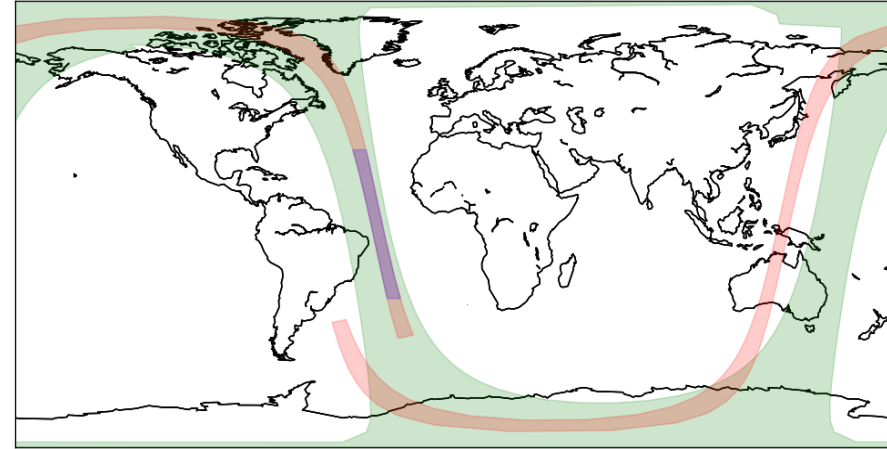
Simple search



Simple search

- product(s)
- time and space criteria
- constraints on properties

Cross-over search



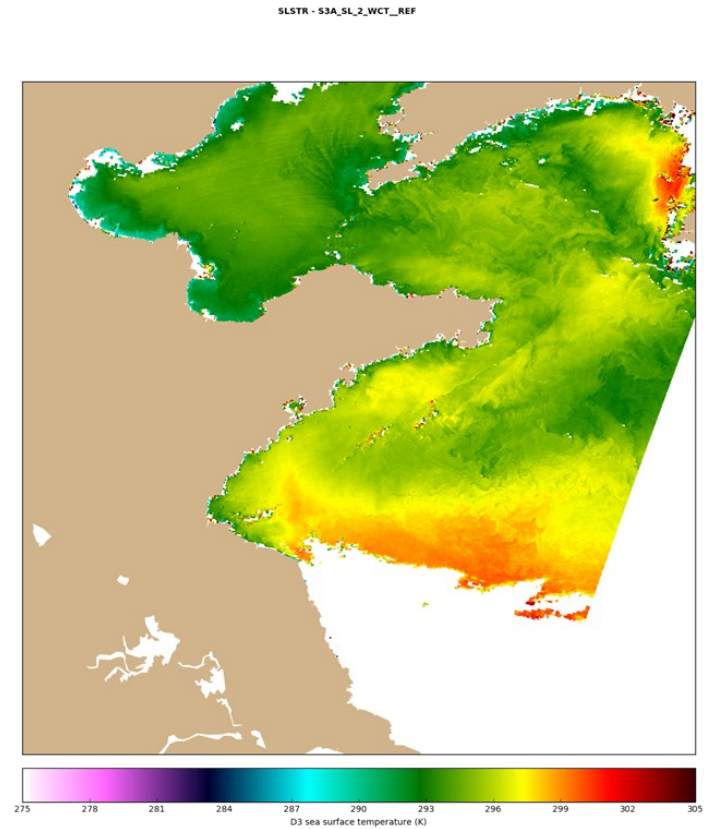
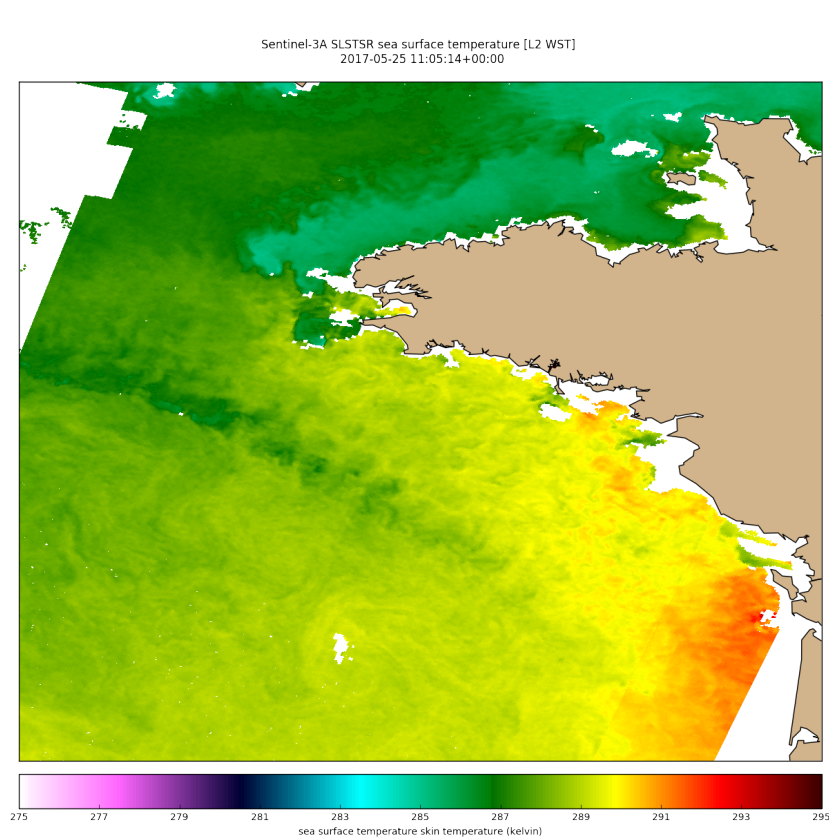
```
SHOW 0 8
W_XX-EUMETSAT-Darmstadt,HYPERSPECT+SOUNDING,MetOpA+IASI_C_EUMP_20100701004153_19184_eps_o_l1.nc

Reference
Name      : W_XX-EUMETSAT-Darmstadt,HYPERSPECT+SOUNDING,MetOpA+IASI_C_EUMP_20100701004153_19184_eps_o_l1.nc
Time range: 2010-07-01 01:45:32 to 2010-07-01 02:04:44
Slice     : {'cell': slice(40, 119, None), 'row': slice(477, 621, None)}
Geometry  : POLYGON ((-74.3743285021517 30, -68.90709065955365 30, -68.65699768066406 29.06100082397461, -60.12200164794922 -9.196999549865723, -56.58900070190 43 -23.4950008392334, -54.69640015258144 -30, -60.13921621269841 -30, -62.56700134277344 -19.75699996948242, -70.01499938964844 13.71700000762939, -72.4209976 1962891 23.25600051879883, -74.3743285021517 30))

Crossover :
Name      : 20100701-ATS_NR_2P-UPA-L2P-ATS_NR__2PNPDE20100701_020310_000046842090_00432_43572_3066-v01.nc
Time range: 2010-07-01 02:08:32 to 2010-07-01 02:27:22
Slice     : {'cell': slice(0, 511, None), 'row': slice(2152, 9684, None)}
Geometry  : POLYGON ((-74.3743285021517 30, -68.90709065955365 30, -68.65699768066406 29.06100082397461, -60.12200164794922 -9.196999549865723, -56.58900070190 43 -23.4950008392334, -54.69640015258144 -30, -60.13921621269841 -30, -62.56700134277344 -19.75699996948242, -70.01499938964844 13.71700000762939, -72.4209976 1962891 23.25600051879883, -74.3743285021517 30))
```

Results as images, text or json document

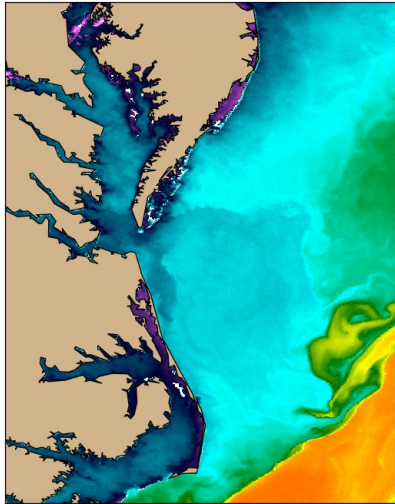
Use case : clear sky image search



Search based on metadata registered in Elasticsearch

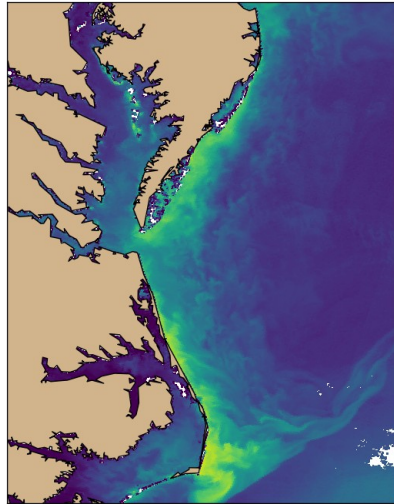
Use case : scene selection, comparison

SLSTR - S3A_SL_2_WCT 11 Nov 2016 15:26:16



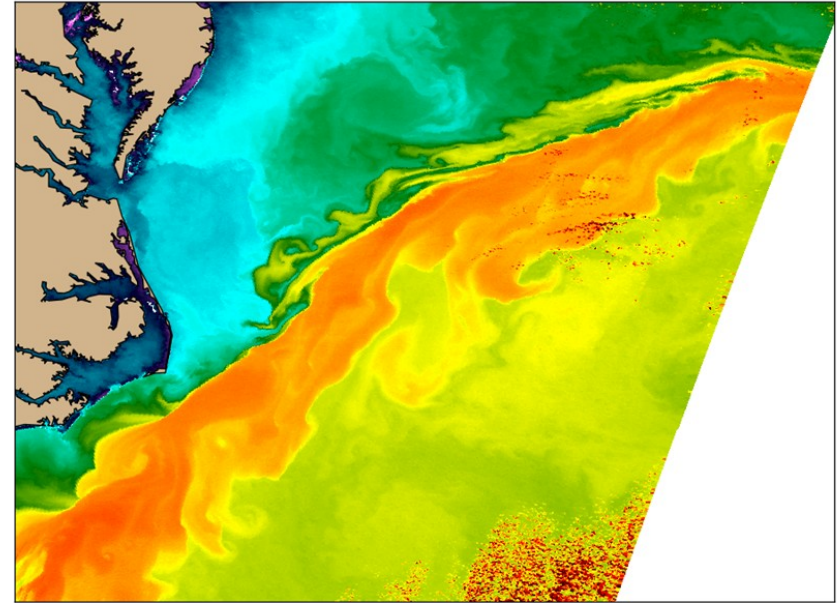
280.0 282.5 285.0 287.5 290.0 292.5 295.0 297.5 300.0 302.5 305.0
N3 sea surface temperature (K)

OLCI - S3A_SL_2_WRR 11 Nov 2016 15:26:16



0.000 0.007 0.014 0.021 0.028 0.035 0.042 0.049 0.056 0.063 0.070
Reflectance for OLCI acquisition band Oa05

SLSTR - S3A_SL_2_WCT 11 Nov 2016 15:26:16



280.0 282.5 285.0 287.5 290.0 292.5 295.0 297.5 300.0 302.5 305.0
N3 sea surface temperature (K)

- clear sky image search
- cross-overs between SLSTR / OLCI or other pairs of sensors

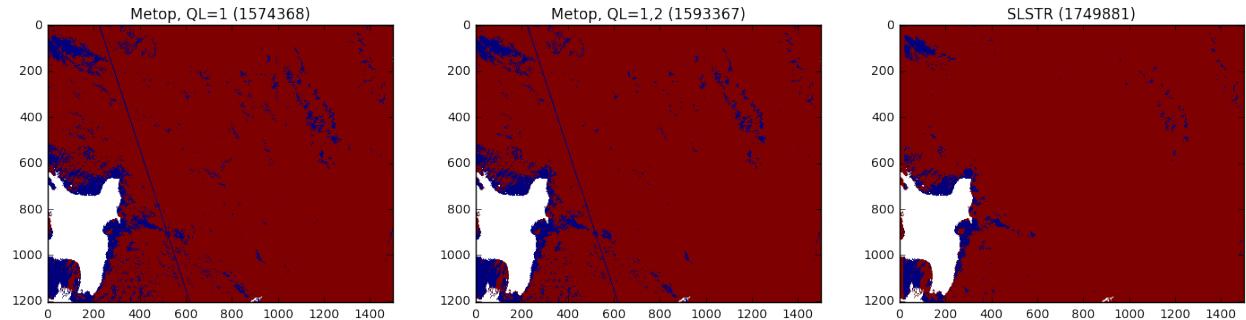
Use case : external cloud mask

Assess quality of SLSTR L1/L2 cloud mask by direct comparison with cloud mask provided by other instruments, resampled on SLSTR image grid

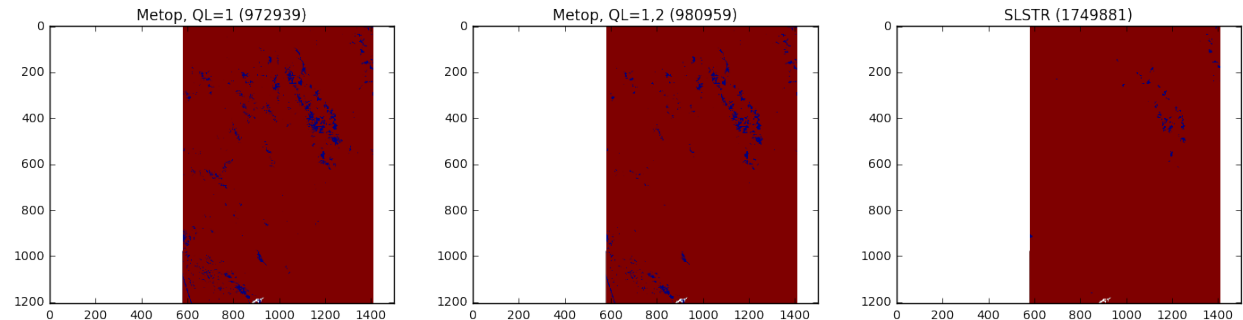
We construct a new cloud mask for SLSTR by remapping the cloud mask from Metop-B cross-overs onto SLSTR granules.

Two masks are generated : native cloud mask from Metop-B (QL=1) and GHRSS mask (QL=1,2)

Intendend for statistical comparison of respective mask extent (NOT at pixel level as clouds may be shifting)

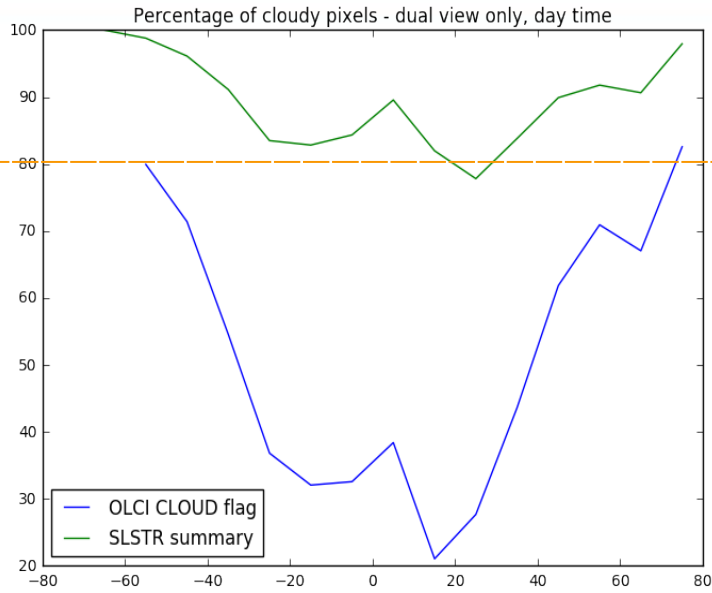


Full swath mask

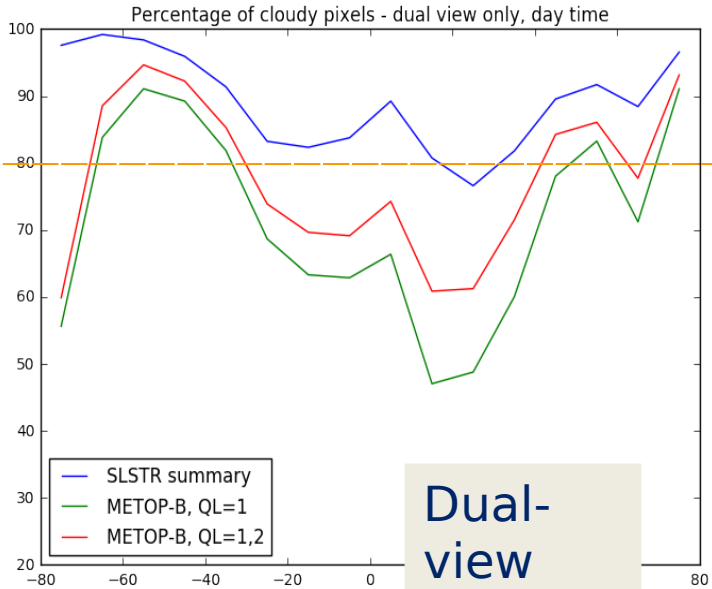
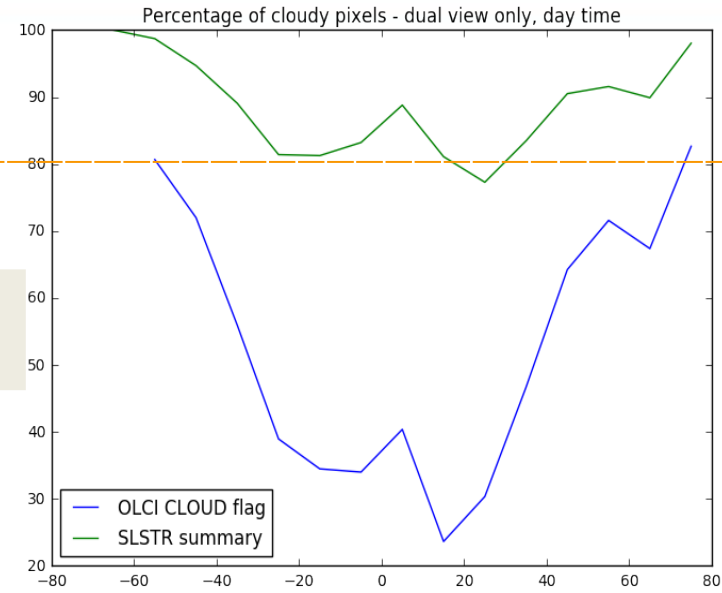


dual view part of the swath

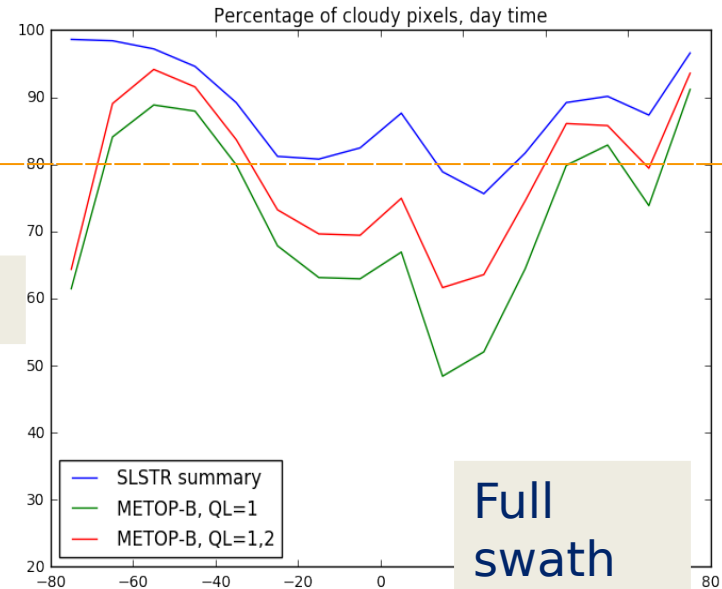
Comparisons of SLSTR with OLCI and Metop cloud masks, per lat



OLCI



Dual-view

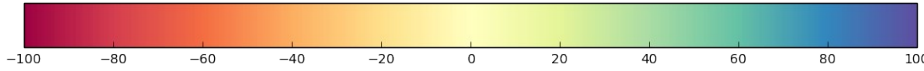
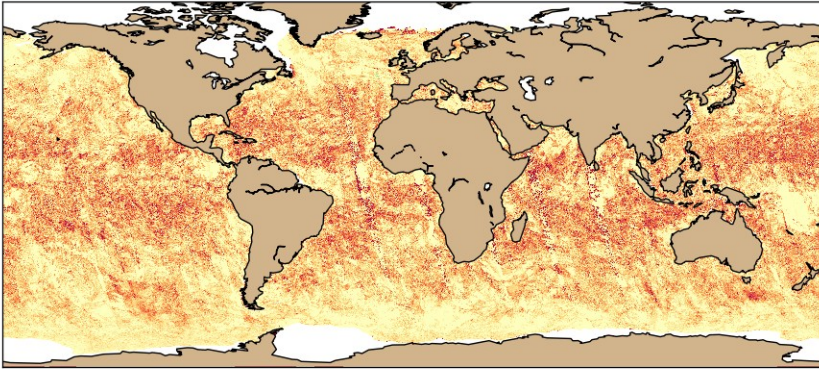


Full swath

SLSTR / Metop-B, night time

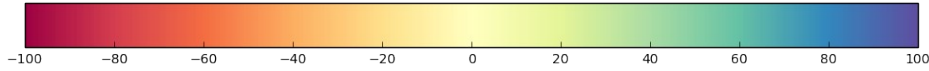
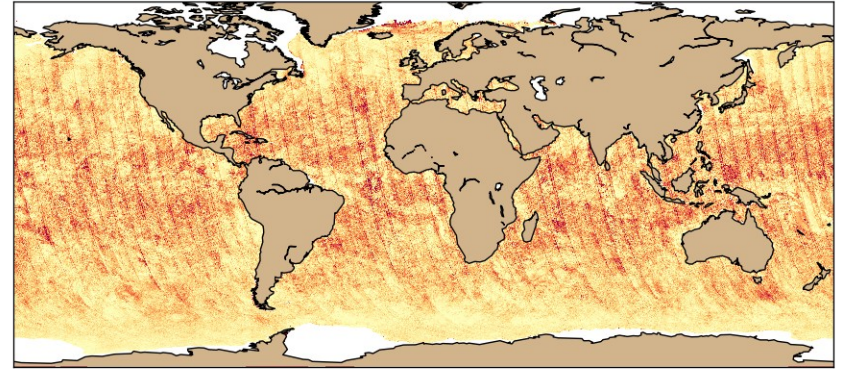
cloud coverage difference with SLSTR, night time

METOP-B, QL=1 - SLSTR



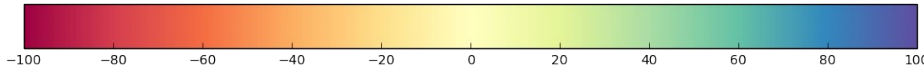
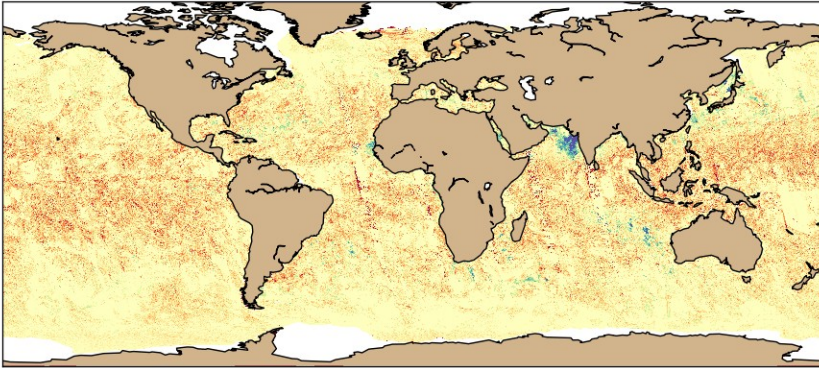
cloud coverage difference with SLSTR, night time

METOP-B, QL=1 - SLSTR



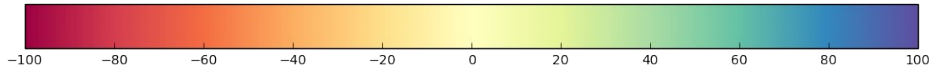
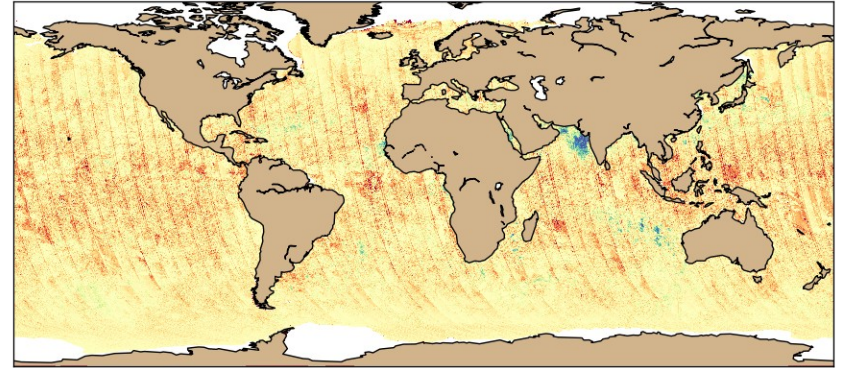
cloud coverage difference with SLSTR, night time

METOP-B, QL=1,2 - SLSTR

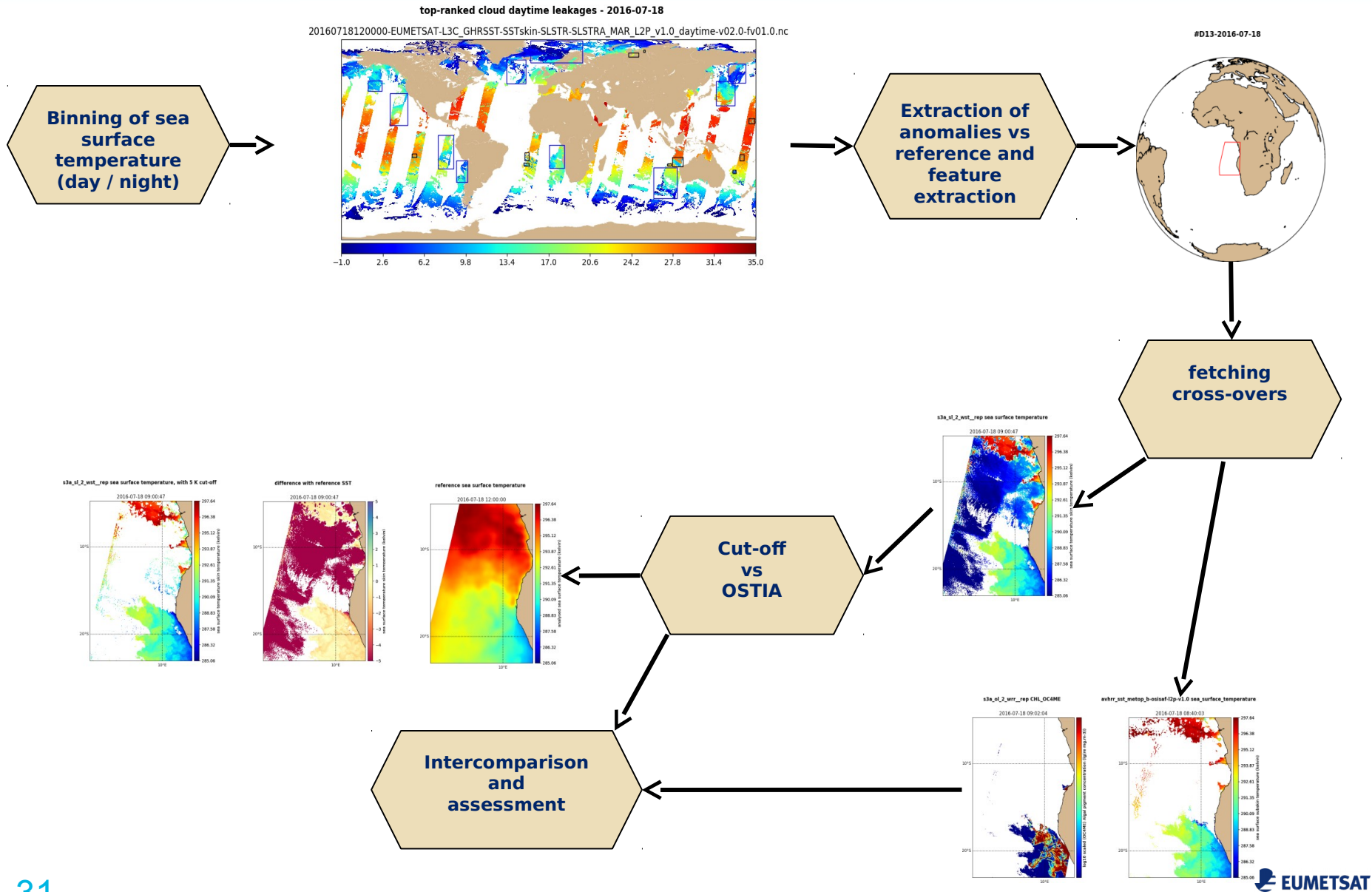


cloud coverage difference with SLSTR, night time

METOP-B, QL=1,2 - SLSTR



Use case : cloud leakage detection workflow / cut-off adjustment



Catalogue of cloud cases

Use S3... Rabbit... Marvel... http://...elyx/ elastic... Naiaid l... Query ... Subscri... Centre... Jean-Fr... Airflow... Supervisor... Supervisor... The Se... x Index ...

eumetsat-gses-1/~jfpiole/s3calval/pages/cloud_summary.html

S3 Cal/Val Home Cal/val environment Data quality Sentinel-3 operations Blog

Social
Twitter (Anne O Caroll)

Links
Metis
Airflow

The Sentinel-3A CloudLeaks - summary page

◀ Previous / 07/18/2016 / Next ▶


Cloud leakages [daytime] Cloud leakages [night time] Summary

Cases with SST deviation > 15 K

Case #D01-2016-07-18

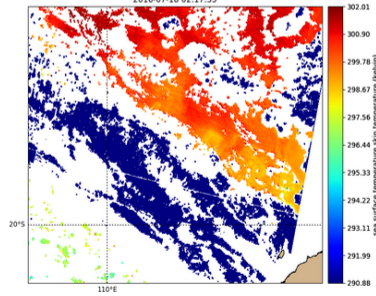
[Go to this cloud leakage case page](#)

#D01-2016-07-18



s3a_sl_2_wst_rep sea surface temperature

2016-07-18 02:17:35



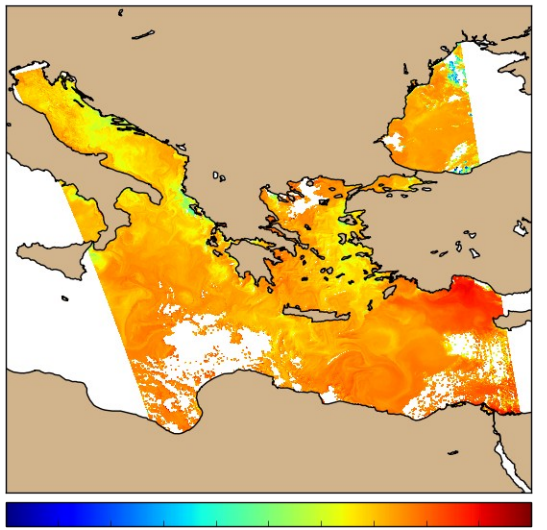
Pass start time: July 18th 2016, 02:17:35
Pass end time: July 18th 2016, 02:27:35
Granules:
S3A_SL_2_WST___20160718T021736_20160718T022236_20170121T040728_0299_006_274_____MR1_R_NT_002.SEN3
S3A_SL_2_WST___20160718T022236_20160718T022736_20170121T040706_0299_006_274_____MR1_R_NT_002.SEN3

Case #D02-2016-07-18

Use case : cross-over comparisons

s3a_sl_2_wst_rep SST, cloud mask, quality >= 4

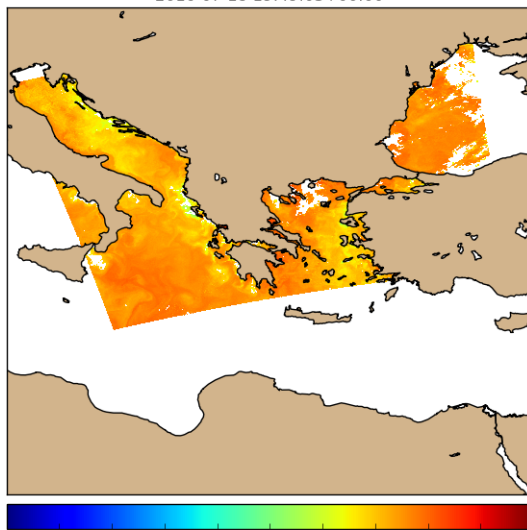
2016-07-18 20:05:54+00:00



280.0 282.5 285.0 287.5 290.0 292.5 295.0 297.5 300.0 302.5 305.0

avhrr_sst_metop_b-osisaf-l2p-v1.0 SST, cloud mask, quality >= 4

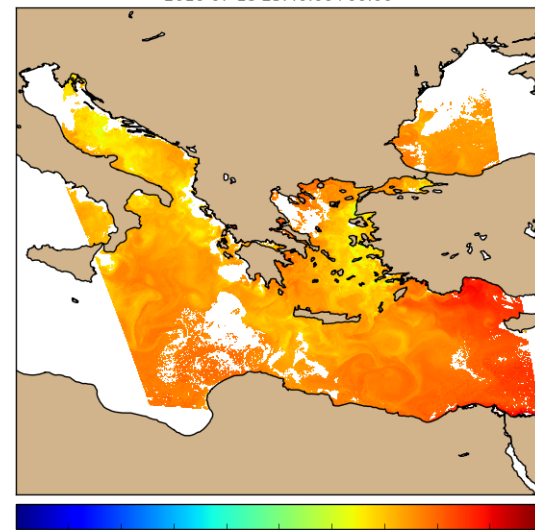
2016-07-18 19:49:03+00:00



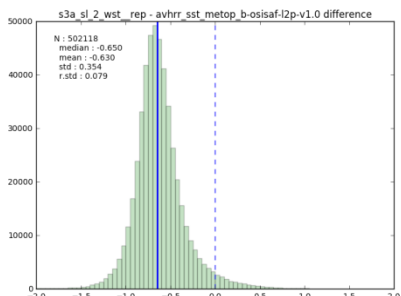
280.0 282.5 285.0 287.5 290.0 292.5 295.0 297.5 300.0 302.5 305.0

viirs_npp-ospo-l2p-v2.4 SST, cloud mask, quality >= 4

2016-07-18 23:40:00+00:00

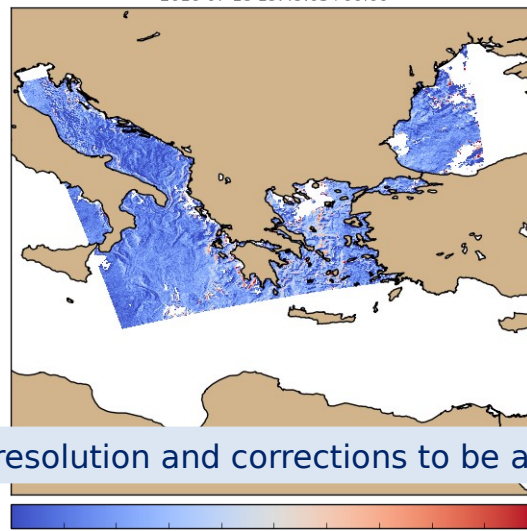


280.0 282.5 285.0 287.5 290.0 292.5 295.0 297.5 300.0 302.5 305.0



s3a_sl_2_wst_rep - avhrr_sst_metop_b-osisaf-l2p-v1.0 SST, cloud mask, quality >= 4

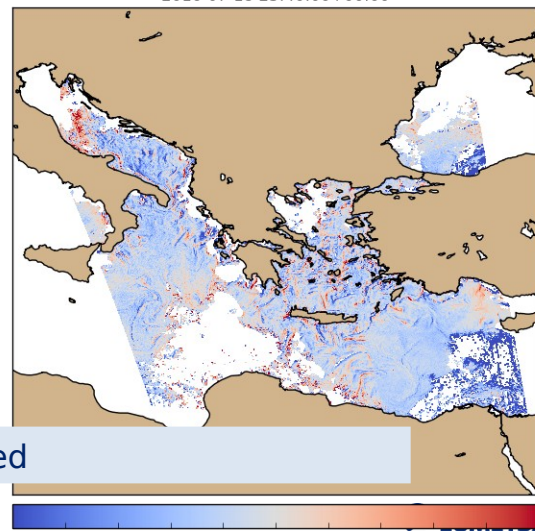
2016-07-18 19:49:03+00:00



-1.0 -0.8 -0.6 -0.4 -0.2 0.0 0.2 0.4 0.6 0.8 1.0

s3a_sl_2_wst_rep - viirs_npp-ospo-l2p-v2.4 SST, cloud mask, quality >= 4

2016-07-18 23:40:00+00:00



-1.0 -0.8 -0.6 -0.4 -0.2 0.0 0.2 0.4 0.6 0.8 1.0

Feature resolution and corrections to be analysed

JUPYTER



- <http://jupyter.org/>
- Python (but not only) in your web browser
- Embeds and mixes code, visualisation, explanations, equations in « notebooks »
- Growingly popular for interactive science
- Can run different languages (over 40)
- Can mix in some shell instructions
- Can be exported as html pages, pdf documents, .rst documents, LaTeX, python script
- Widgets for more interactivity, small task interfaces
- Complemented by **jupyterhub** which is single-user => allow multi-user access : a jupyter notebook server is spawned for each user

In S3 cal/val framework

- Quick visual development
- Sharing results with methodology
- Learning tools and libraries
- Repeating analysis scenarii (new product release, longer time series,...)
- Advanced data analysis interfaces
- (Dashboards, report production)

Interactive integration of our different pieces of software

Interactive match-up outlier investigation with Jupyter

```
In [2]: from s3analysis.slstr.mdb.analysis import get_basic_mask
from s3analysis.slstr.cloud import cloud_mask, DEFAULT_CLOUDMASK

# basic validity mask (sat angl < 55., wind speed > 6 m/s)
basic_mask = get_basic_mask(data_sat)

print "Number of match-ups : ", len(basic_mask)

print "Number of valid match-ups : ", (numpy.count_nonzero(basic_mask))
print "Number of invalid match-ups : ", (basic_mask).size - (numpy.count_nonzero(basic_mask))

# select only the match-ups where WST fields are defined
valid_sst = (
    basic_mask &
    ~numpy.ma.getmaskarray(data_sat['WST']['sst_theoretical_uncertainty']) &
    (data_sat['WST']['quality_level'] > 2) &
    (numpy.ma.fabs(data_sat['WST']['dt_analysis']) <= 5.) &
    ~numpy.ma.getmaskarray(data_insitu['water_temperature'])
)

print "Final number of valid clear sky match-ups : ", numpy.count_nonzero(valid_sst)

slstr_sst = data_sat['WST']['sea_surface_temperature'] - 273.15
insitu_sst = data_insitu['water_temperature']

cloudybox = cloud_mask(data_sat_box['WCT']['cloud_in'])
confidence = (data_sat_box['WCT']['confidence_in'][:] & 16384) > 0
```

```
print len(insitu_sst[night & valid_sst]), ' match-ups'
```



```
In [3]: # additional filter to keep only nighttime data
night = (data_insitu['solar_zenith_angle'] > 90.)
```

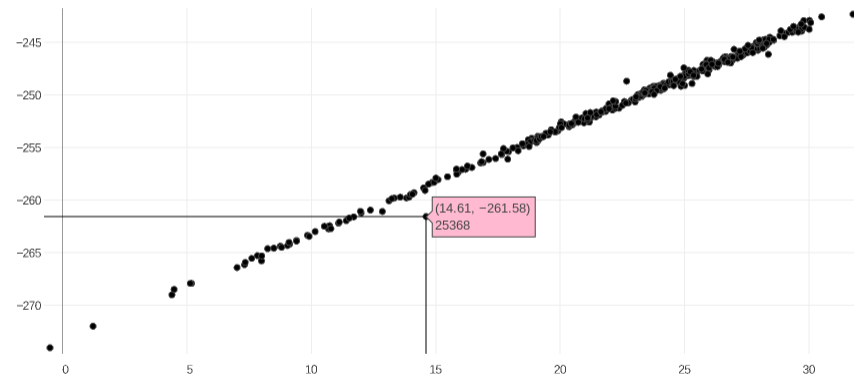
```
In [4]: # achtung! plotly needs to be installed in your environment (pip install plotly)
```

```
import plotly.graph_objs as go
import numpy as np
from plotly.offline import download_plotlyjs, init_notebook_mode, plot, iplot

# allow inline plot with plotly
init_notebook_mode(connected=True)

# Create a interactive scatterplot SST vs in situ with plotly
trace = go.Scattergl(
    x = insitu_sst[night & valid_sst],
    y = slstr_sst[night & valid_sst] - 273.15,
    text = numpy.arange(len(slstr_sst))[night & valid_sst],
    mode = 'markers',
    marker = dict(
        color = 'FFBAD2',
        line = dict(width = 1)
    )
)
data = [trace]
iplot(data)

print len(insitu_sst[night & valid_sst]), ' match-ups'
```

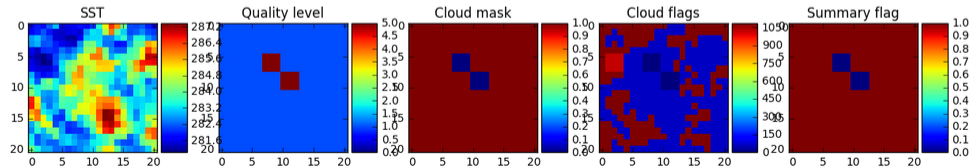
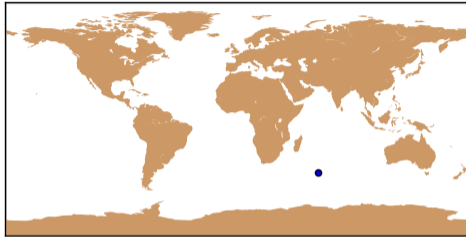


459 match-ups

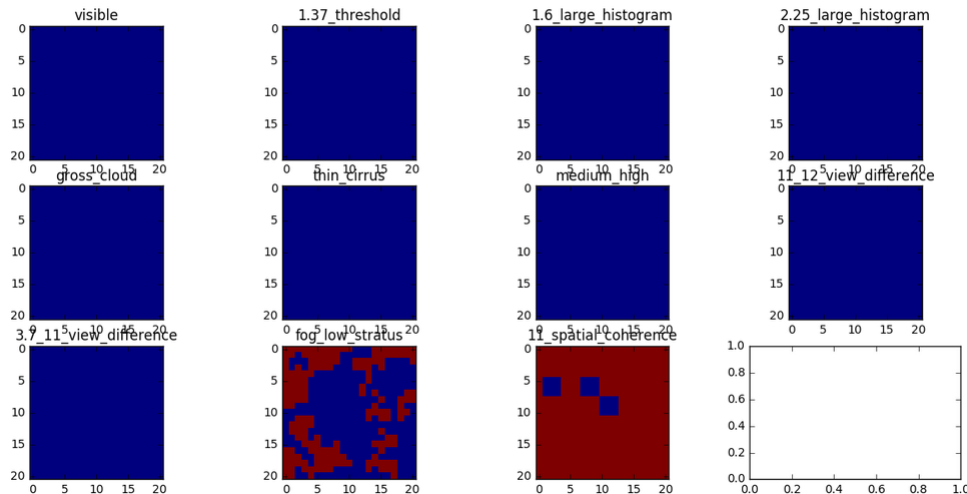
[Export to plotly >](#)

Interactive match-up outlier investigation with Jupyter

```
-----
In situ value : 14.610000 K
SST - in situ difference : -3.040000 K
Traceability:
....WST file : S3A_SL_2_WST_20170628T185854_20170628T190154_20170628T202840_0179_019_198_5220_MAR_F_NR_002.SEN3
```



```
Used mask flags : ['visible', '1.37_threshold', '1.6_large_histogram', '2.25_large_histogram', 'gross_cloud', 'thin_cirrus', 'medium_high', '11_12_view_difference', '3.7_11_view_difference', 'fog_low_stratus', '11_spatial_coherence']
```



```
# display match-up info
print "SST value : %f K" % slstr_sst[choice]
print "In situ value : %f K" % insitu_sst[choice]
print "SST - in situ difference : %f K" % (slstr_sst[choice] - insitu_sst[choice])

print "Traceability:"
print "....WST file : ", data_sat['WST']['origin'][choice]

# locate match-up on map
from mpl_toolkits.basemap import Basemap
m = Basemap()
m.drawmapboundary()
m.fillcontinents(color='#cc9966')
x, y = m(data_insitu['lon'][choice], data_insitu['lat'][choice])
m.scatter(x, y)

# plot cloud and SST
plot_mask(choice)
```

Interactive match-up outlier investigation with Jupyter

trace back to original file

Here we access the content of the original file from which the match-up was extracted, and display a larger area around the match-up location.

This require to have access to the original SLSTR files!

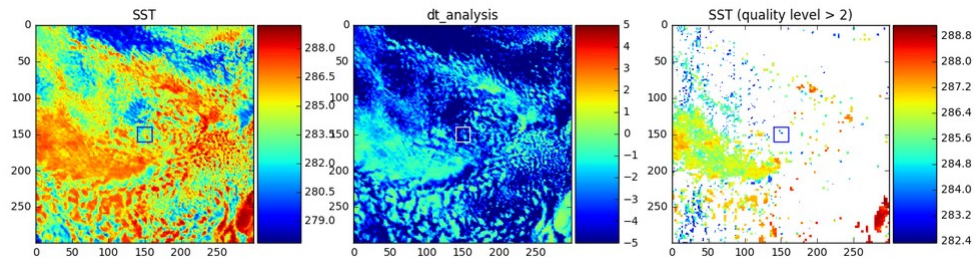
```
In [6]: print data_sat['WST']['dynamic_target_center_index'][choice]
```

```
[681 200]
```

```
In [7]: # get full path name
from naiad.utils.filelocator import FileLocator
locator = FileLocator()
fname = locator.get_full_path(data_sat['WST']['origin'][choice], 's3a_sl_2_wst_ref')

# define large subset
row, cell = data_sat['WST']['dynamic_target_center_index'][choice]
boxwidth = 300
boxheight = 300
larger_box = {'row': slice(max(0, row - boxheight / 2), row + boxheight / 2),
              'cell': slice(max(0, cell - boxwidth / 2), cell + boxwidth / 2)}

# load data into a cerbere swa=th object
from cerbere.mapper.safeslfile import SAFESLWSTFile
from cerbere.datamodel.swath import Swath
wstfile = SAFESLWSTFile(fname)
swath = Swath()
swath.load(wstfile)
```



fetch Metop image

```
In [19]: # import necessary packages
import shapely

from naiad.utils.filelocator import FileLocator
from naiad.queries.server import Server
from naiad.queries.search import SpatioTemporalSearch

from cerbere.mapper.ghrsstncfile import GHRSTNCFile
from cerbere.datamodel.swath import Swath
from cerplot.mapping import CerMap

%matplotlib inline

# provides Naiad server URL
es = Server("http://eumetsat-gses-5:9200/")

# ===== DEFINE HERE YOUR SEARCH CRITERIA =====

# define the geographical search box
lats = swath.get_lat(slices=larger_box)
lons = swath.get_lon(slices=larger_box)
area = shapely.geometry.box(lons.min(), lats.min(), lons.max(), lats.max())

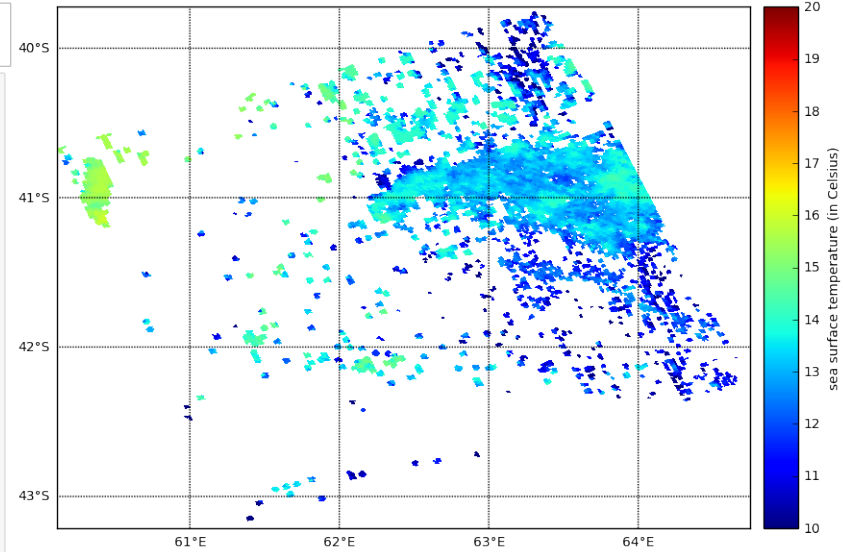
# define start and end of search interval
start = swath.get_start_time() - datetime.timedelta(hours=1)
end = swath.get_end_time() + datetime.timedelta(hours=1)

# define the naiad indice (product name) to crawl
product = 'avhrr_sst_metop_b-osisaf-l2p-v1.0'

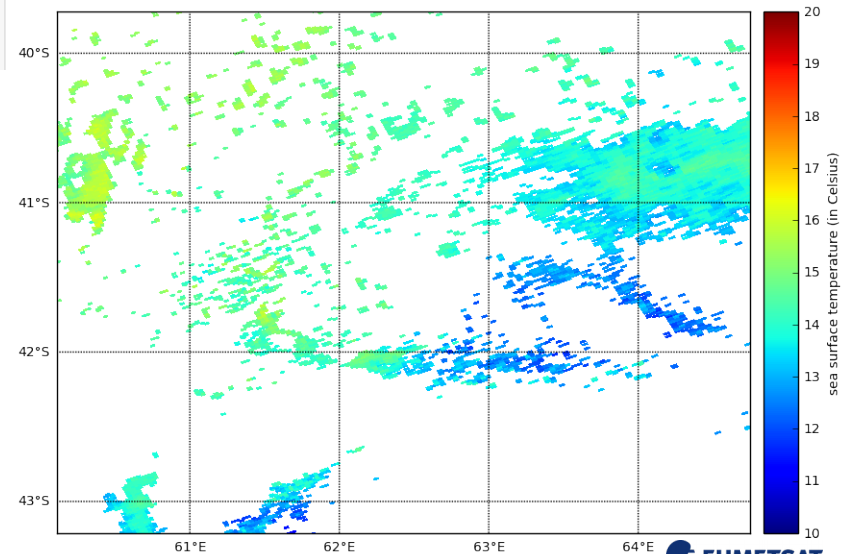
# compose the query
search = SpatioTemporalSearch([product], area, start, end)

# execute the query
res = search.run(es)
```

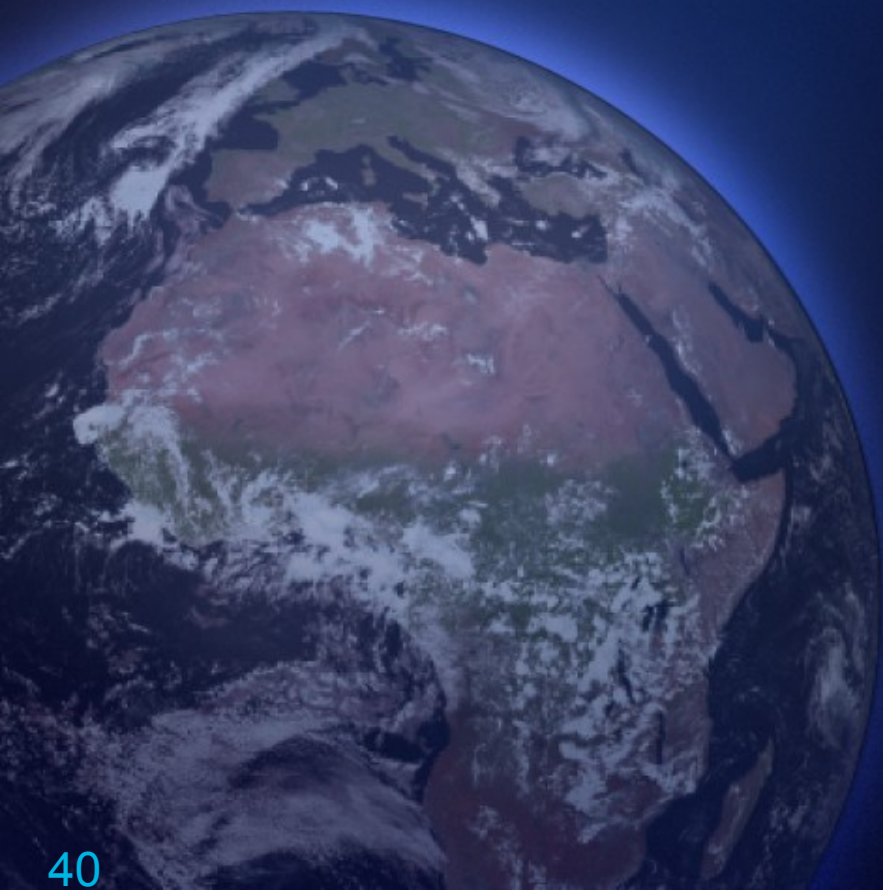
SLSTR WST - 2017-06-28T18:58:53+00:00



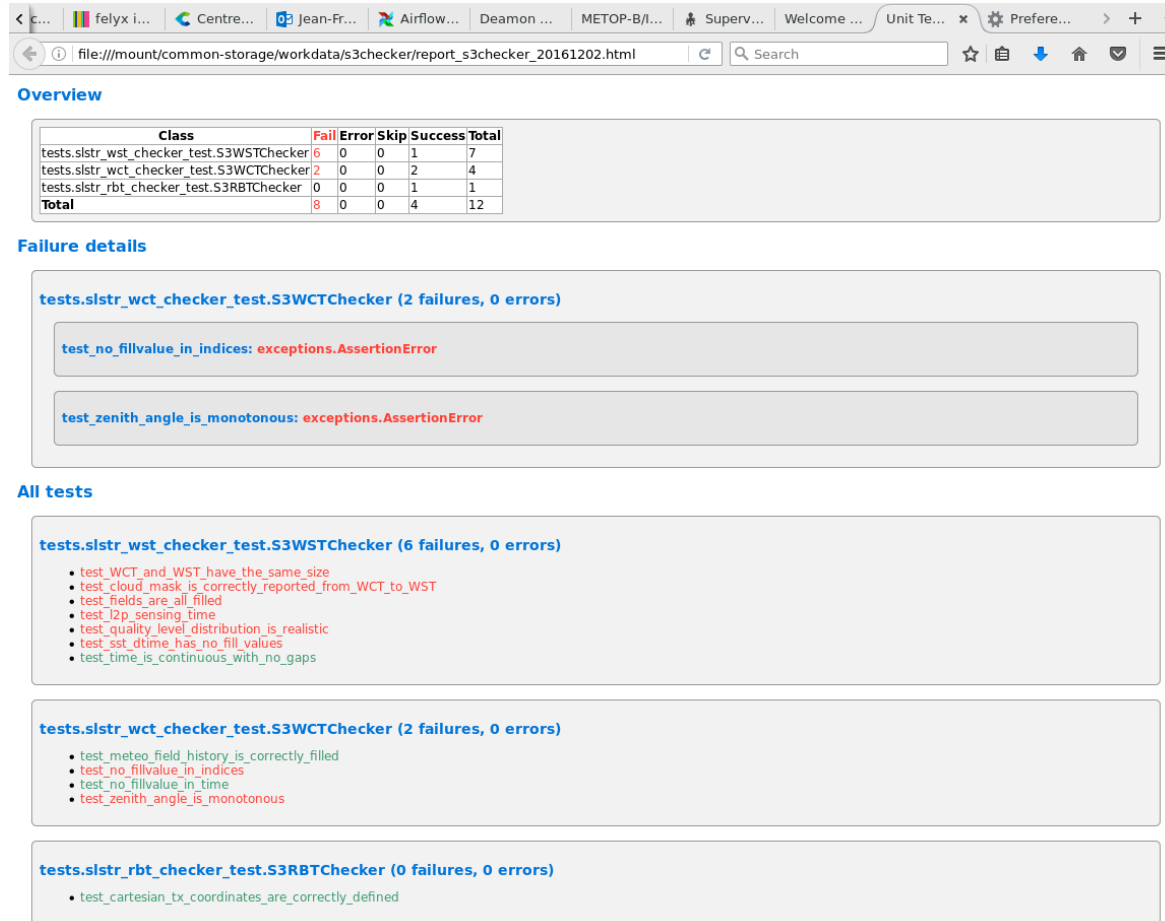
METOP AVHRR - 2017-06-28T18:46:03+00:00



MISC



Fix / regression verification : « s3checker »



The screenshot shows a web browser window with the URL `file:///mount/common-storage/workdata/s3checker/report_s3checker_20161202.html`. The page displays the following content:

Overview

Class	Fail	Error	Skip	Success	Total
tests.slstr_wst_checker_test.S3WSTChecker	6	0	0	1	7
tests.slstr_wct_checker_test.S3WCTChecker	2	0	0	2	4
tests.slstr_rbt_checker_test.S3RBTChecker	0	0	0	1	1
Total	8	0	0	4	12

Failure details

tests.slstr_wct_checker_test.S3WCTChecker (2 failures, 0 errors)

- test_no_fillvalue_in_indices: **exceptions.AssertionError**
- test_zenith_angle_is_monotonous: **exceptions.AssertionError**

All tests

tests.slstr_wst_checker_test.S3WSTChecker (6 failures, 0 errors)

- test_WCT_and_WST_have_the_same_size
- test_cloud_mask_is_correctly_reported_from_WCT_to_WST
- test_fields_are_all_filled
- test_l2p_sensing_time
- test_quality_level_distribution_is_realistic
- test_sst_dtime_has_no_fill_values
- test_time_is_continuous_with_no_gaps

tests.slstr_wct_checker_test.S3WCTChecker (2 failures, 0 errors)

- test_meteo_field_history_is_correctly_filled
- test_no_fillvalue_in_indices
- test_no_fillvalue_in_time
- test_zenith_angle_is_monotonous

tests.slstr_rbt_checker_test.S3RBTChecker (0 failures, 0 errors)

- test_cartesian_tx_coordinates_are_correctly_defined

Based on python unitary test (**unittest**) framework – uses also scientific packages implemented for S3 data analysis

Configurable regridded/binner

Level 3 SST Monitoring - S3 Cal/Val - Mozilla Firefox@eumetsat-gses-1

New Tab Compa... Search... Rabbit... Marvel... http://...elyx/ elastic... Ocean ... Centre... Jean-Fr... Airflow... Airflow... Deamon ... Level 3 ... Unit Test ... Index of /... Superv...

eumetsat-gses-1/~jfpiole/s3calval/pages/l3_sst_monitoring.html

S3 Cal/Val Home Cal/Val operations Data quality PDGS Blog

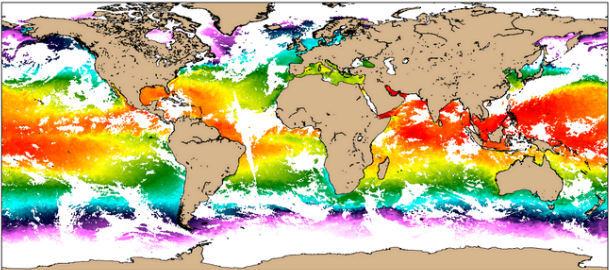
Social
Twitter (Anne O Carol)

Links
Metis
Airflow

Level 3 SST Monitoring

← Previous / 06/17/2017 / Next →

sea surface skin temperature
17 Jun 2017 - Sentinel-3A / SLSTR WST NR [OSI SAF] - night time - no cut-off
N = 1319371, min = -1.89 C, max = 34.47 C



sea surface temperature (in celsius)

EUMETSAT Copernicus

Source:

Sentinel-3A / SLSTR (WST) REF Sentinel-3A / SLSTR (WST) OPE METOP / AVHRR

difference REF/OPE difference REF/METOP-B AVHRR difference OPE/METOP-B AVHRR

Passes:

Night time Day time

Options:

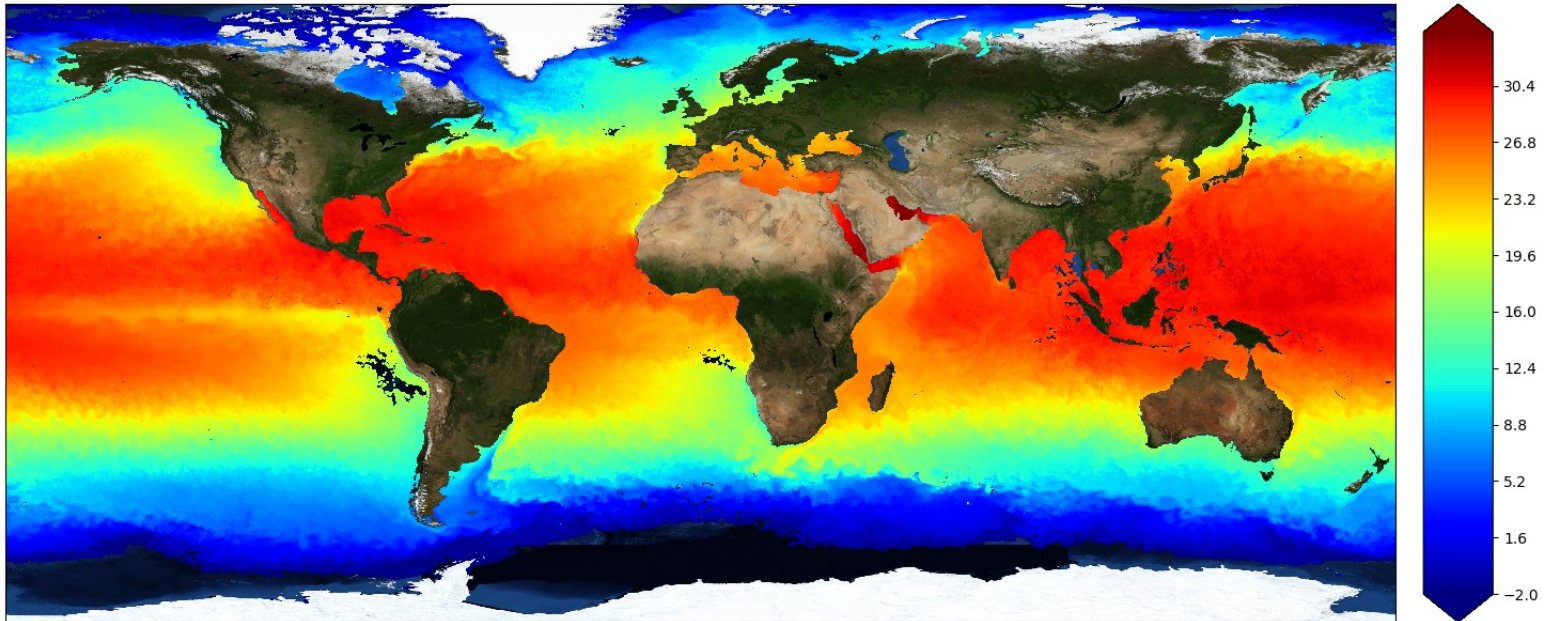
with cut-off on OPE

© 2017 Eumetsat. Powered by pelican-bootstrap3. Pelican, Bootstrap

17:31 28/06/2017

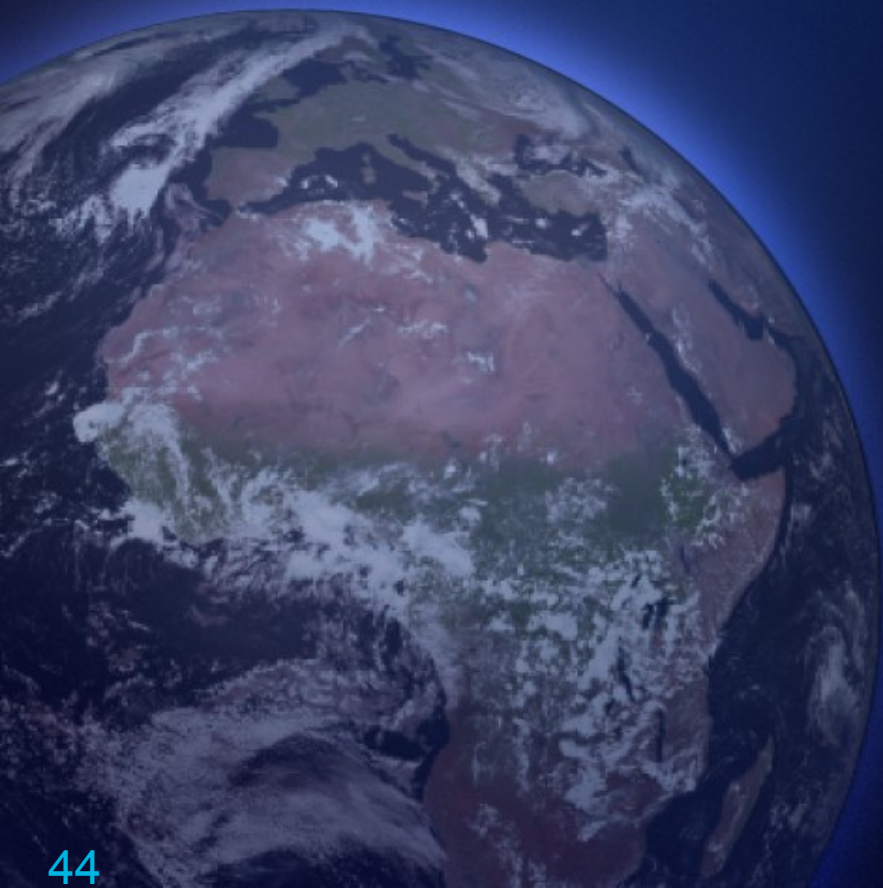
Configurable regridded/binner

Sentinel 3A SLSTR sea surface temperature (S3A_SL_2_WST) - September 2016



Control tool and outreach

CONCLUSION



conclusion

- Demonstration of usage of open source tools for a collaborative framework, in the context of SLSTR cal/val
- Here focus on solution but was an asset in S3VT, esp. match-ups which were publically available
- Emphasis on existing generic tools, avoid reinventing the wheel
- Some tools have flaws but sharing among community would help improving them
- Embedded platform and tool concept can be applied to other aspects than cal/val, in support to GHRSSST task teams, ex: CDAF implementation prototype
- Leverage on DAC dataset collections and resources for implementation of such services
- Extended version :
https://www.eumetsat.int/website/home/VisitingScientists/SciencePresentations/DAT_3571206.html