



# *Satellite Oceanography: an integrated perspective*



# *How to contribute/accelerate new skills/discoveries to help reveal and model unknow unknowns from all available multi-modal satellite ocean remote sensing measurements ?*

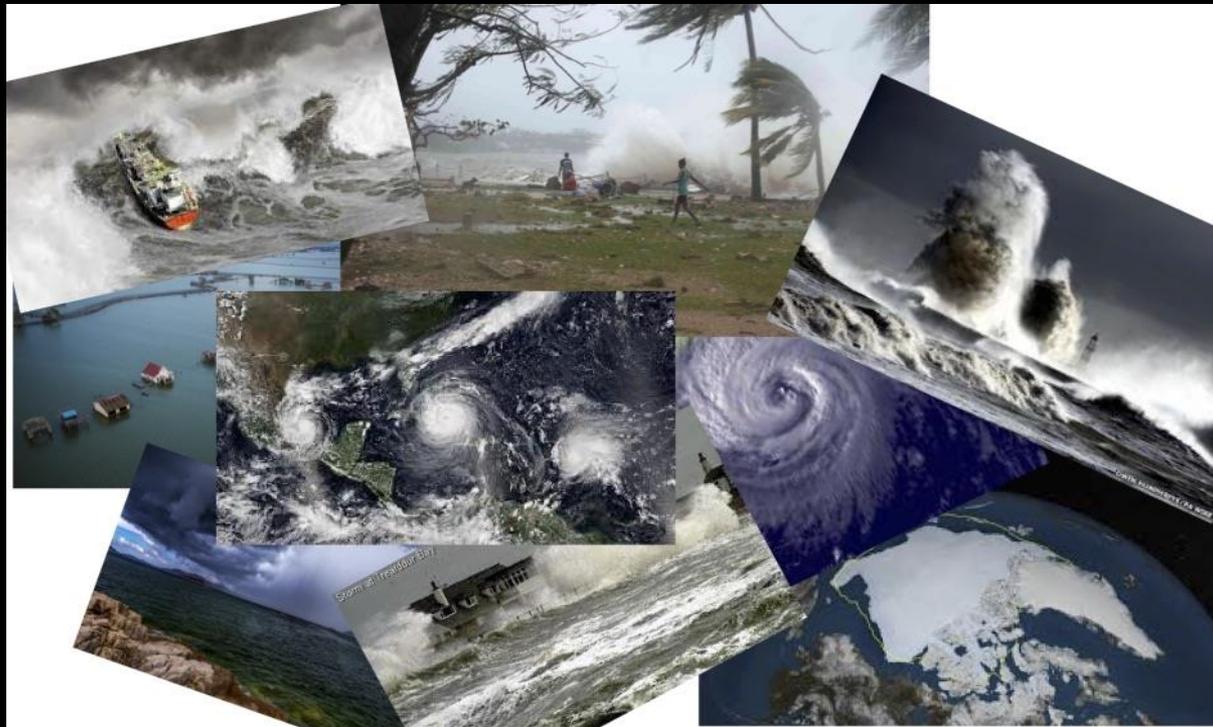
## *Some Earth Observation Challenges:*

*Upper vertical motions i.e. 3D dynamics (e.g. including time evolution) of the upper ocean, Mesoscale and submesoscale circulation as key to control the vertical ocean pump and its impact on energy transport and biogeochemical cycles*

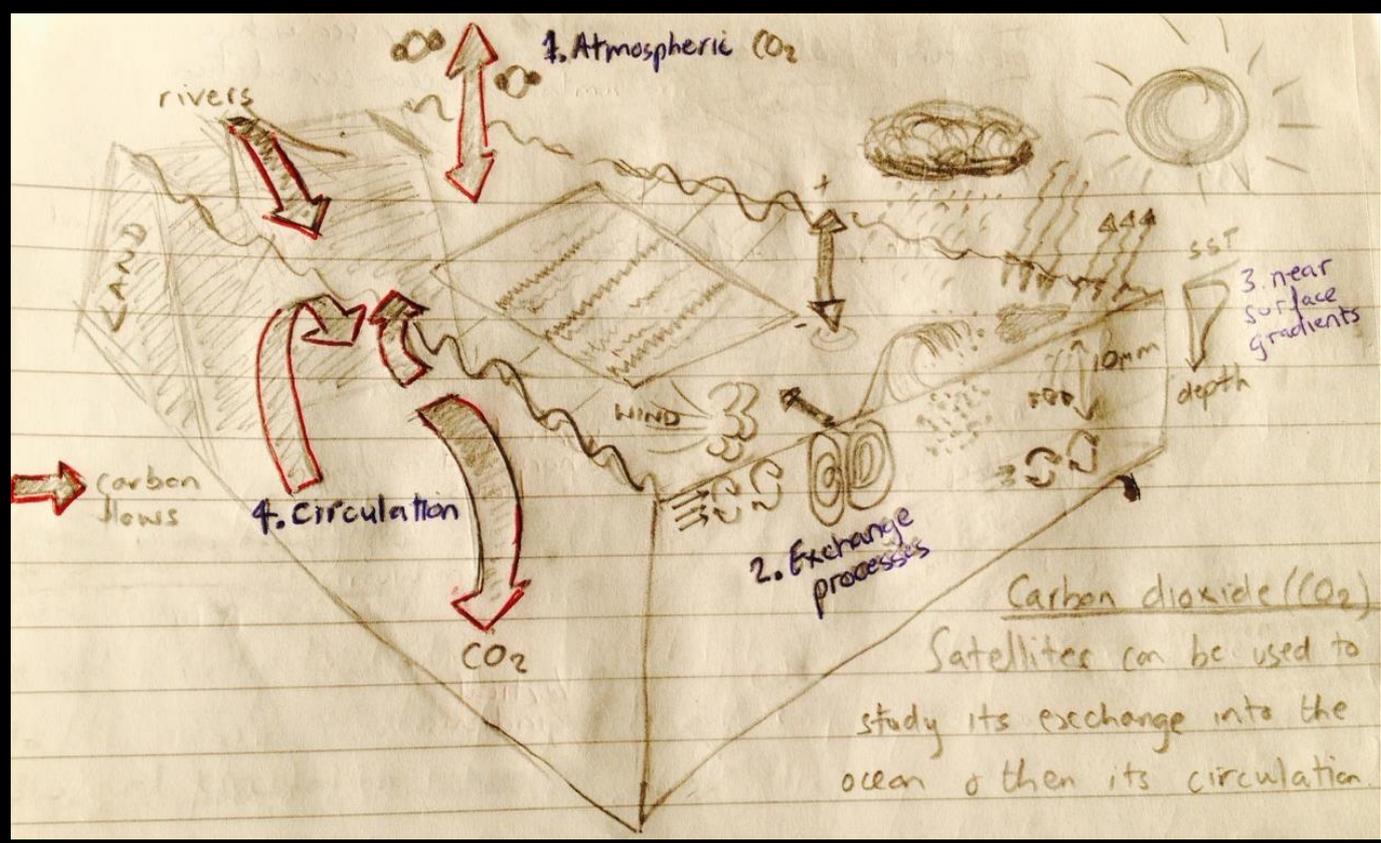
*Climate modelling due to these vast and diverse scales of fluid motions: in the upper ocean, horizontal scales as big as basins and as small as cm-mm (capillary-gravity surface waves) contribute non-negligibly to air-sea exchanges and climate, and dynamics of scales of less than 30 km, is characterized by departures from the Earth's rotation constraint, i.e. ageostrophic motions and strong impact of wind/wave transient forcings.*



*Problem: introduction of new regimes for heat, salinity and chemistry distribution which threaten the sustainability of life in the sea and increase the frequency of extreme events !*



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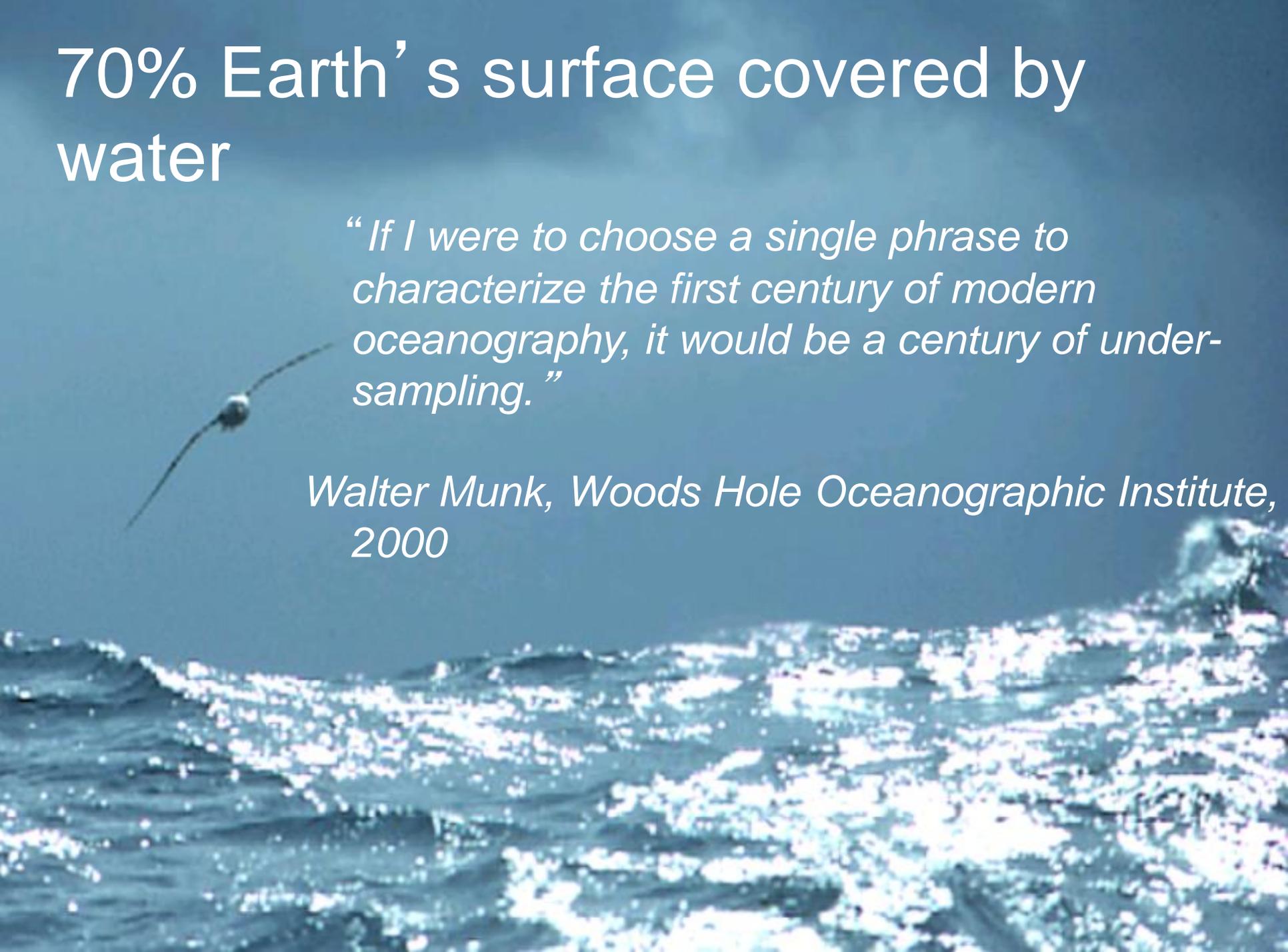
*Future goals are to contribute/accelerate to new skills/discoveries to help reveal and model unknown unknowns from all available multi-modal satellite ocean remote sensing measurements ?*

**Computational simulations have a limiting “irreducible imprecision” compared to measured quantities in the turbulent regimes of the upper ocean. This limiting feature explains the observed irreproducibility among different model schemes which are supposed to be solving the same problem. The imprecision of simulations is due to the variety of independent selections of different numerical algorithms, model parameterizations, and representations of couplings among the different processes.**

# 70% Earth's surface covered by water

*“If I were to choose a single phrase to characterize the first century of modern oceanography, it would be a century of under-sampling.”*

*Walter Munk, Woods Hole Oceanographic Institute,  
2000*



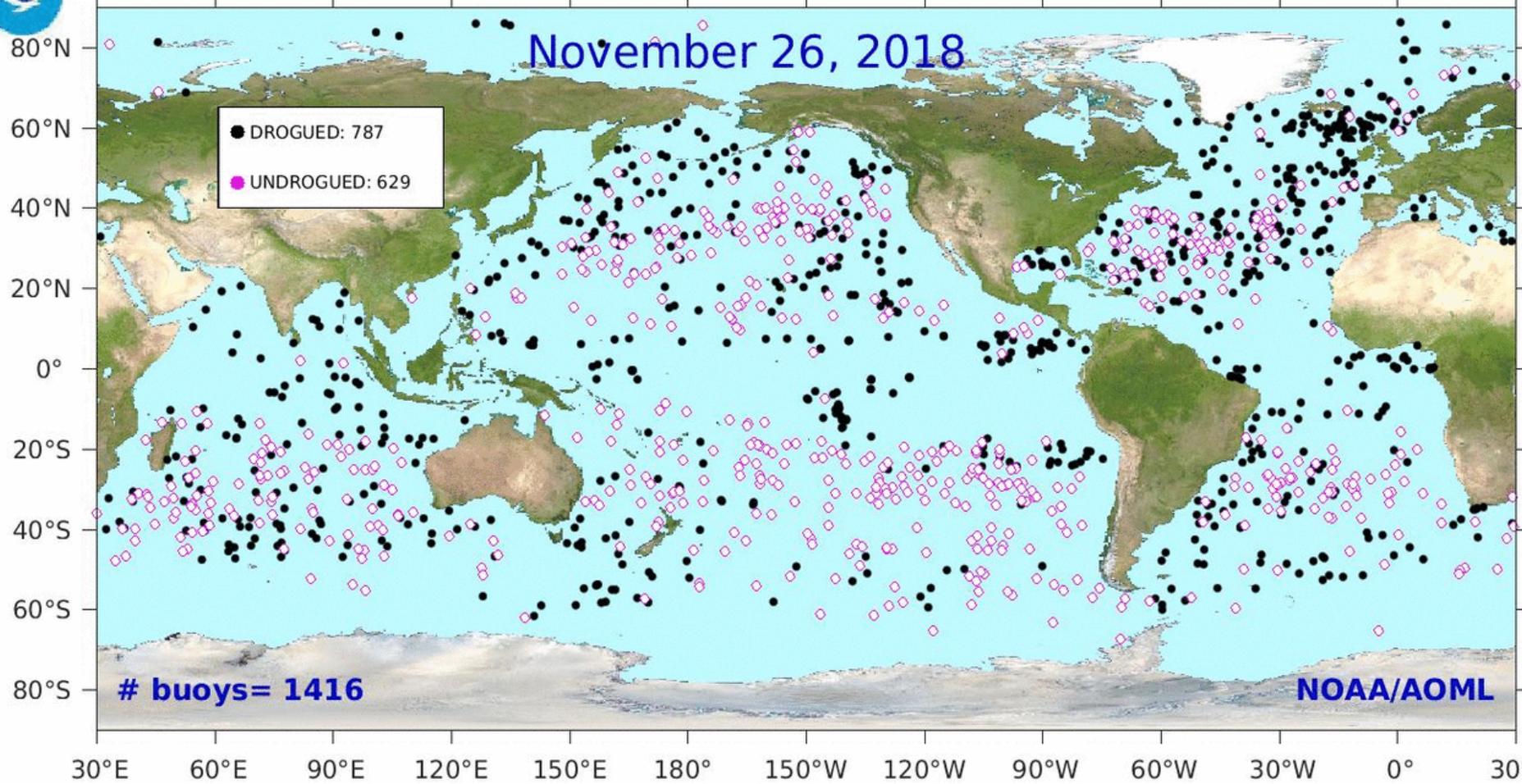


# CURRENT STATUS: DROGUED AND UNDROGUED DRIFTERS



November 26, 2018

● DROGUED: 787  
◆ UNDROGUED: 629



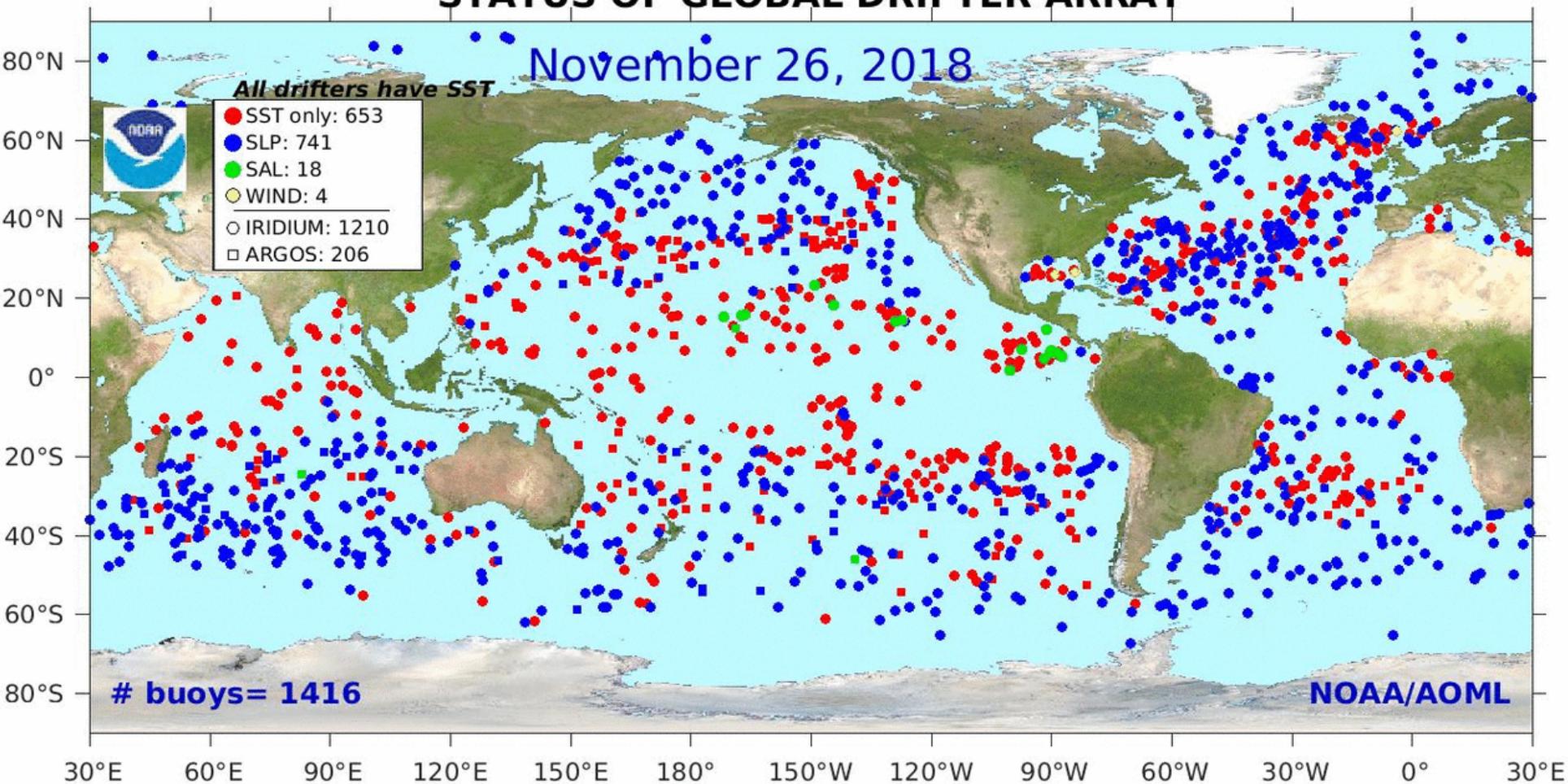
# buoys = 1416

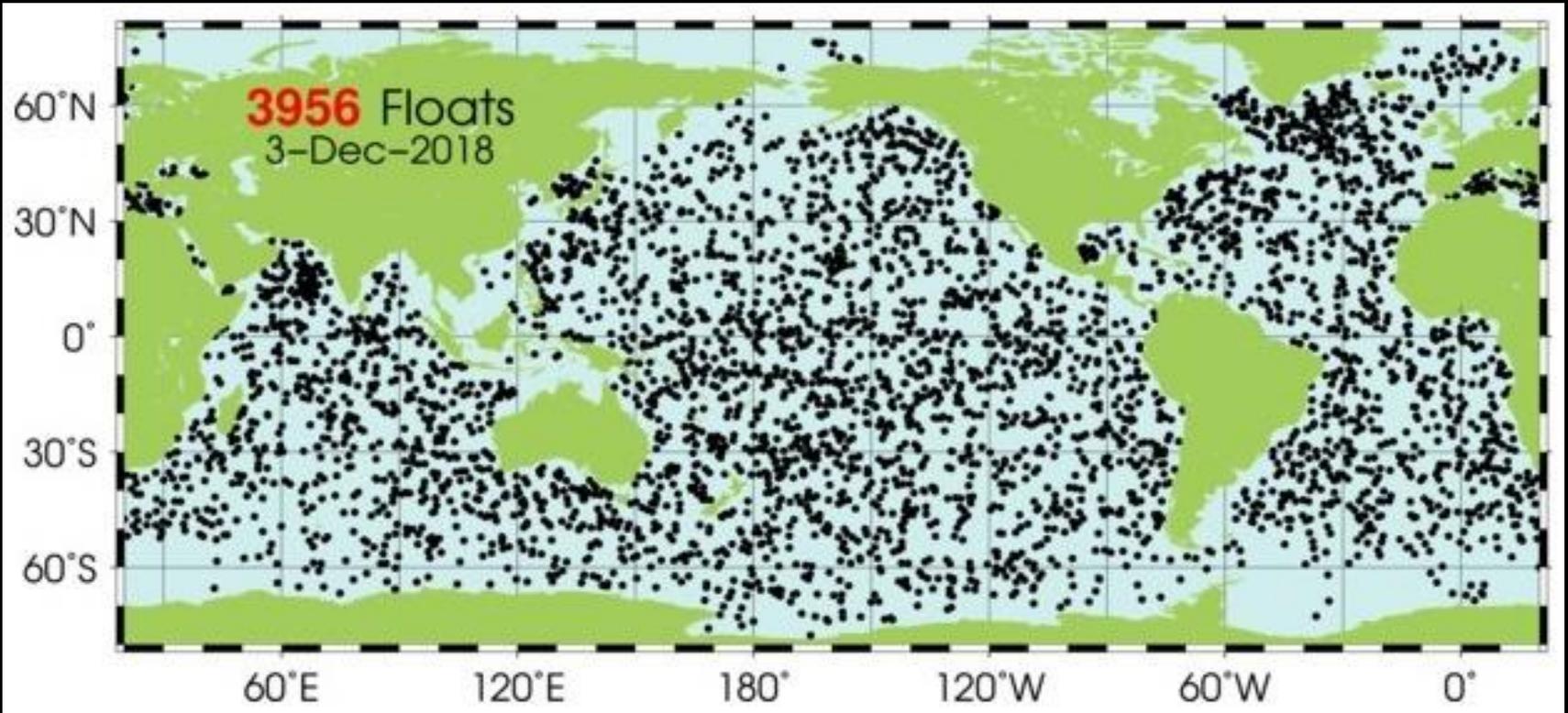
NOAA/AOML



## STATUS OF GLOBAL DRIFTER ARRAY

November 26, 2018

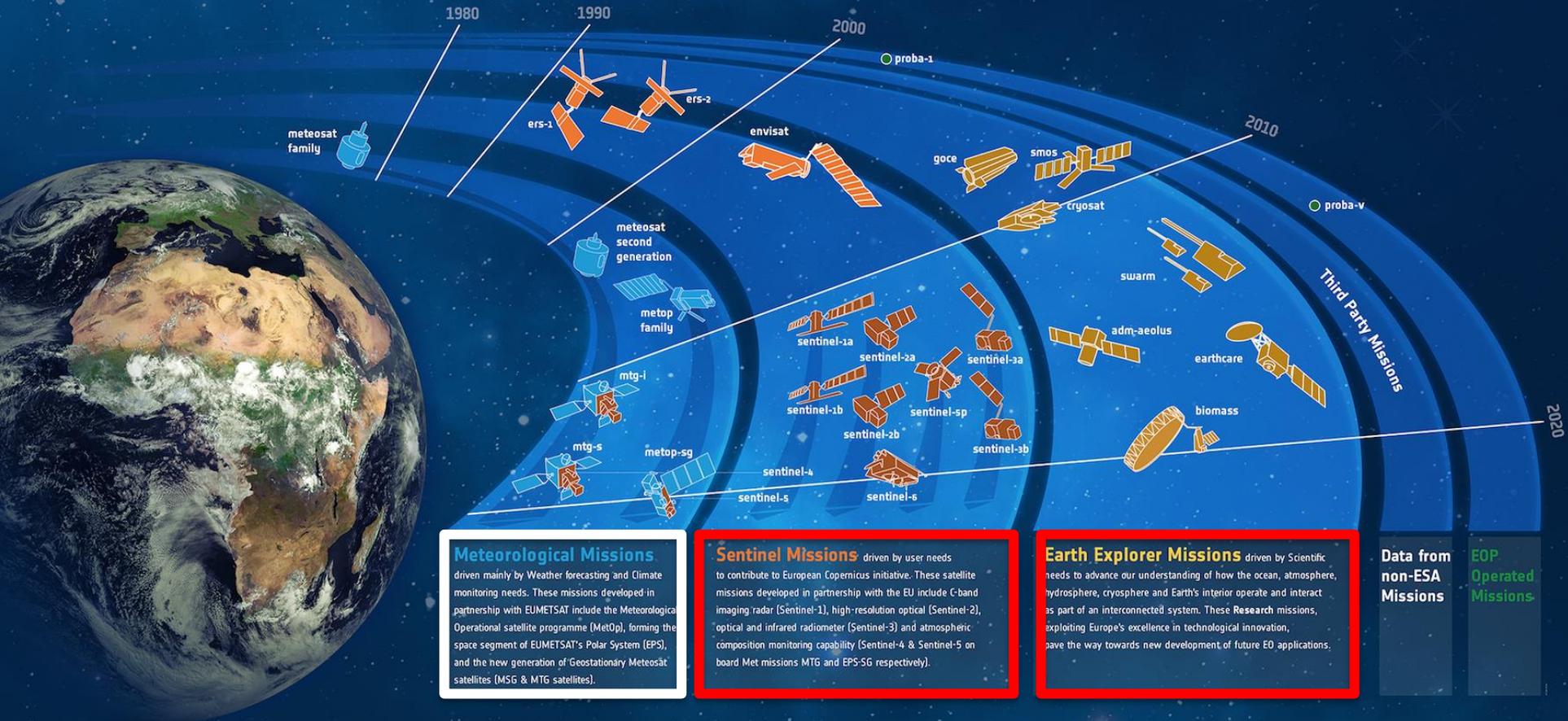




# Three Pillars of ESA Earth Observation



## THE ESA EARTH OBSERVATION PROGRAMME



**Meteorological Missions**  
 driven mainly by Weather forecasting and Climate monitoring needs. These missions developed in partnership with EUMETSAT include the Meteorological Operational satellite programme (MetOp), forming the space segment of EUMETSAT's Polar System (EPS), and the new generation of Geostationary Meteosat satellites (MSG & MTG satellites).

**Sentinel Missions** driven by user needs to contribute to European Copernicus initiative. These satellite missions developed in partnership with the EU include C-band imaging radar (Sentinel-1), high-resolution optical (Sentinel-2), optical and infrared radiometer (Sentinel-3) and atmospheric composition monitoring capability (Sentinel-4 & Sentinel-5 on board Met missions MTG and EPS-SG respectively).

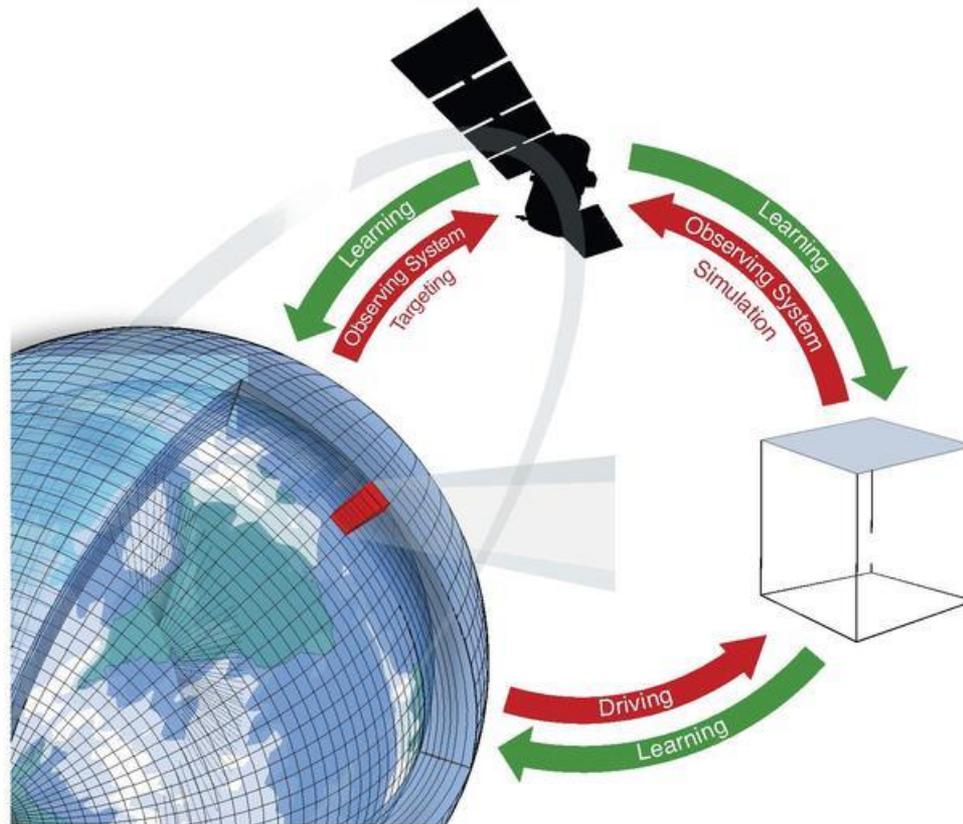
**Earth Explorer Missions** driven by Scientific needs to advance our understanding of how the ocean, atmosphere, hydrosphere, cryosphere and Earth's interior operate and interact as part of an interconnected system. These Research missions, exploiting Europe's excellence in technological innovation, pave the way towards new development of future EO applications.

**Data from non-ESA Missions** and **EOP Operated Missions**





Goal is a hierarchical system that integrates data and models (and can also be used to design observing systems)



*Optimized sampling for multi-scale dynamics*

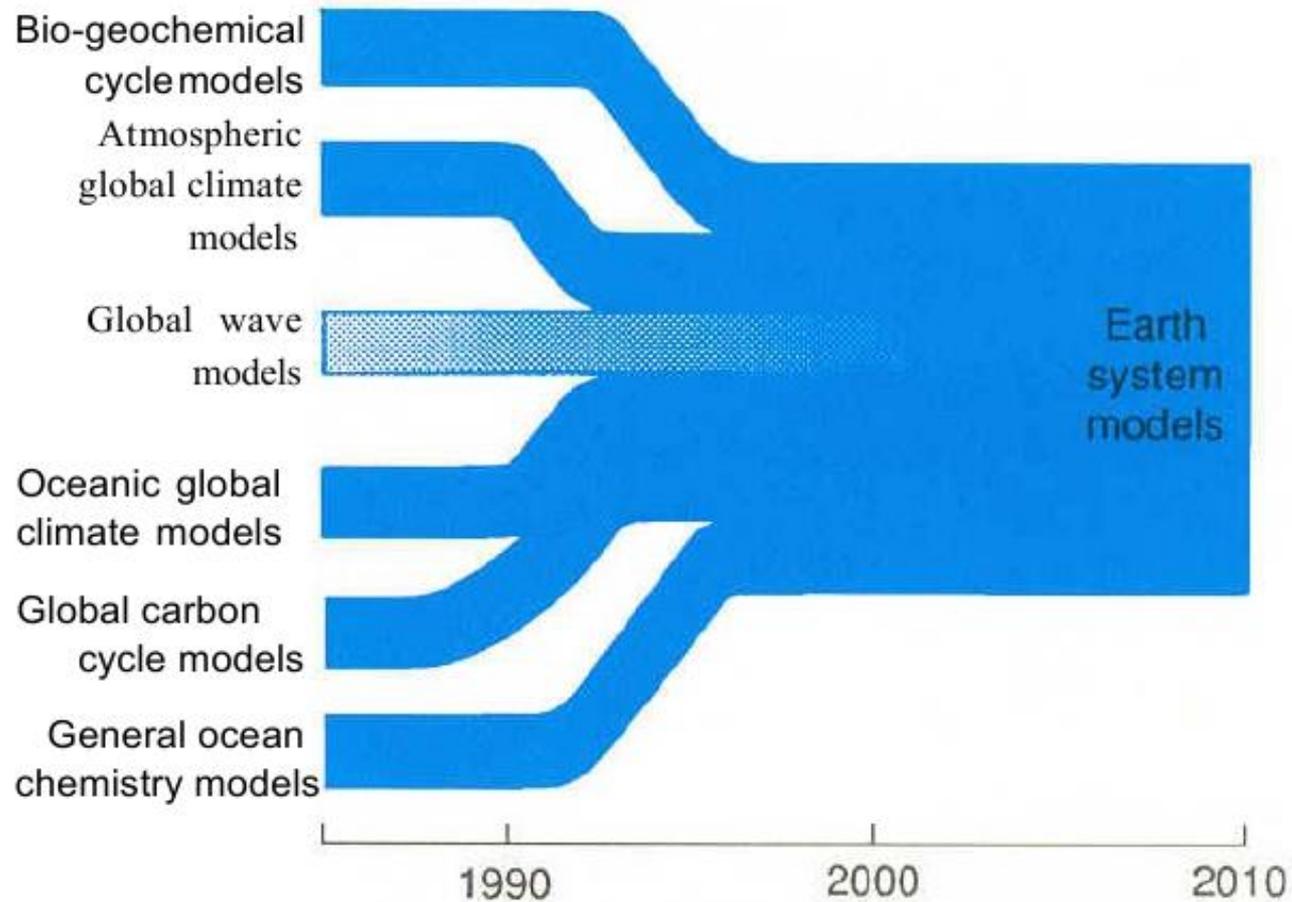
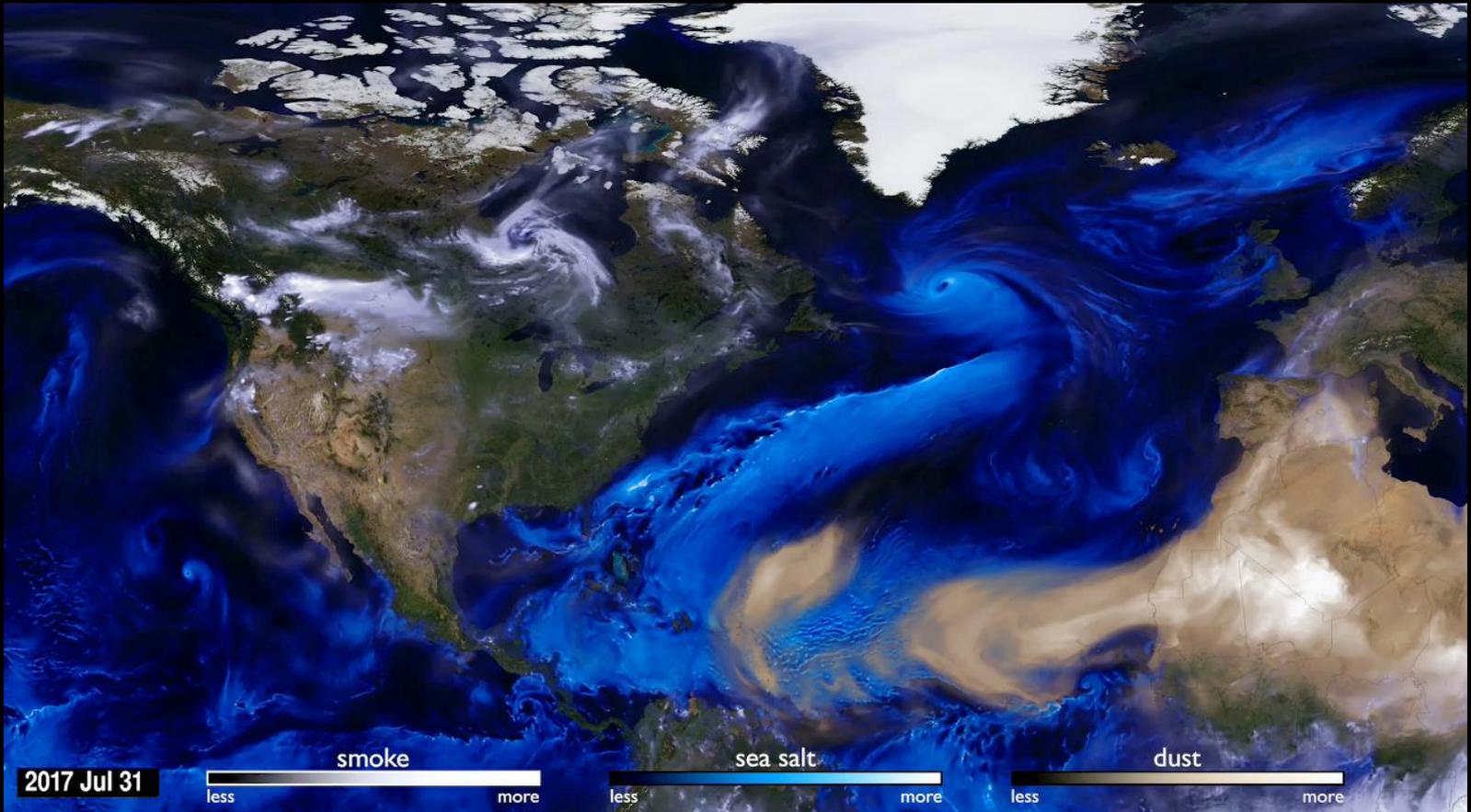
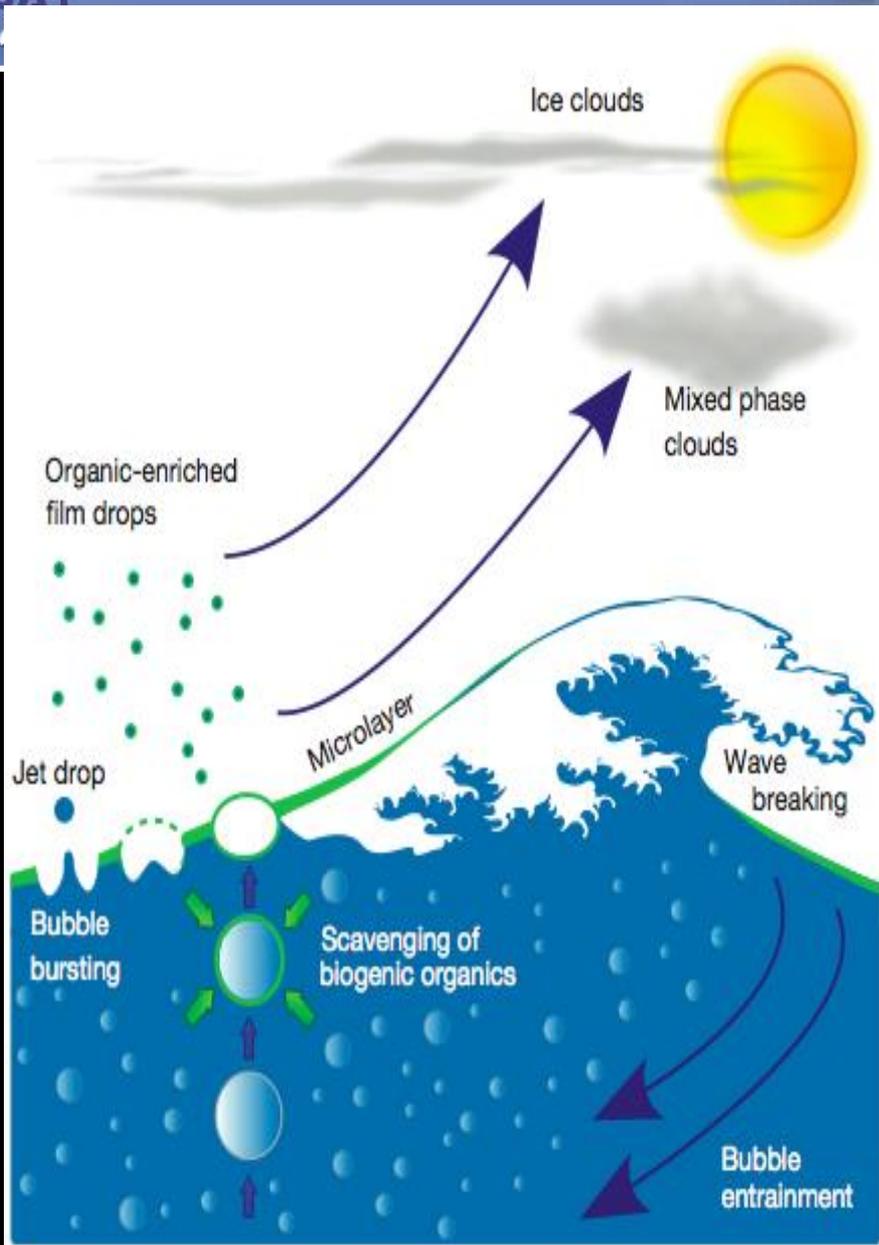


Figure 1. Future role of wave models as an essential coupling component for ocean-atmosphere-carbon-cycle models developed in the context of the World Climate and Global Change programs.





Sea-spray aerosol particles enriched in organic material are possibly generated when the air-sea interface is bursting





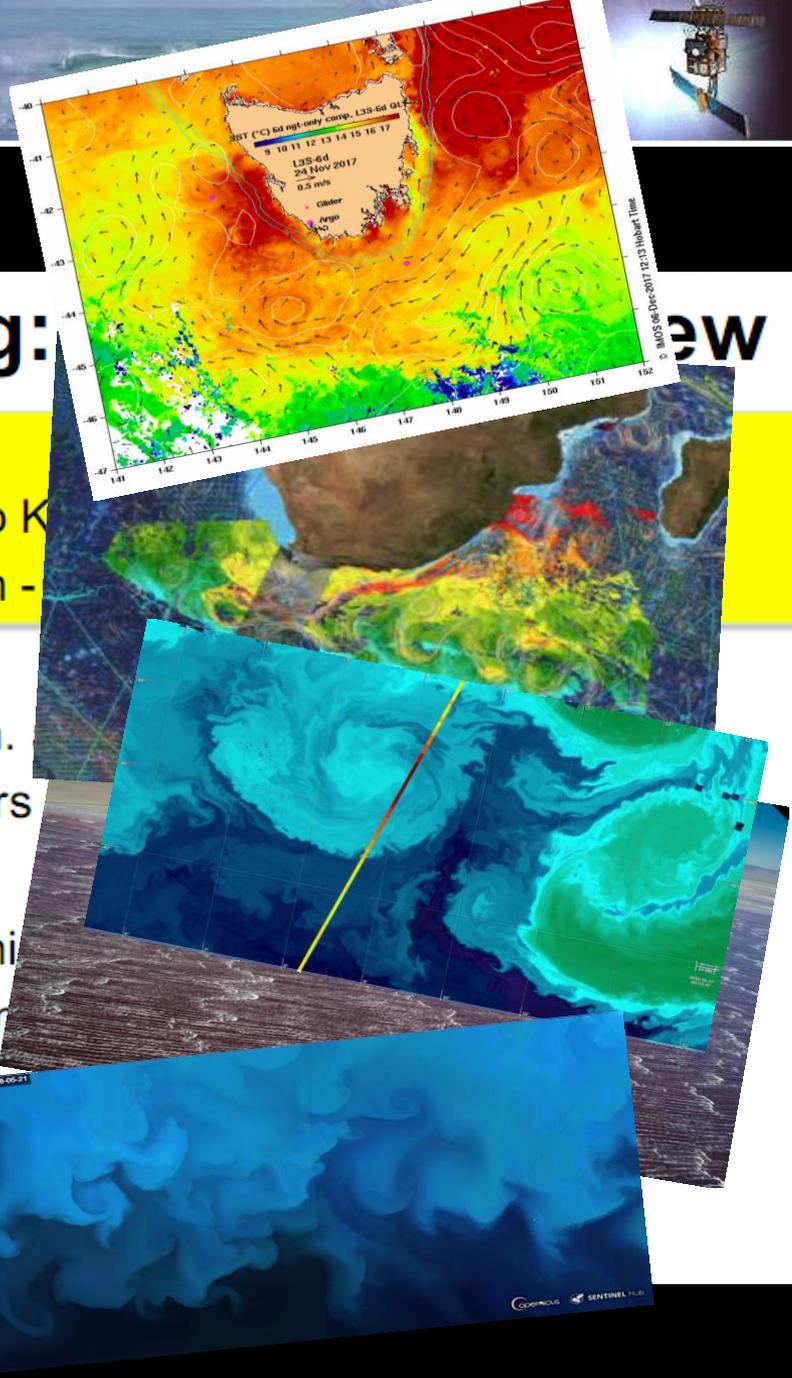
# Ocean remote sensing: a privileged view

- Spatially detailed
  - Spatial resolution from meters to Kms
  - A synoptic picture that is 100 km - 10 000 km wide
- Regularly repeated
  - Revisit intervals between 30 min. and 35 days
  - Continuously repeated over years to decades
- Global coverage
  - Satellites see the parts where ships rarely go
  - Single-sensor consistency - no intercalibration uncertainties
- Measures parameters that cannot be observed in situ
  - Surface roughness at short length scales (2-50 cm)
  - Surface slope (a few cm over 100s of kilometres)



# Ocean remote sensing:

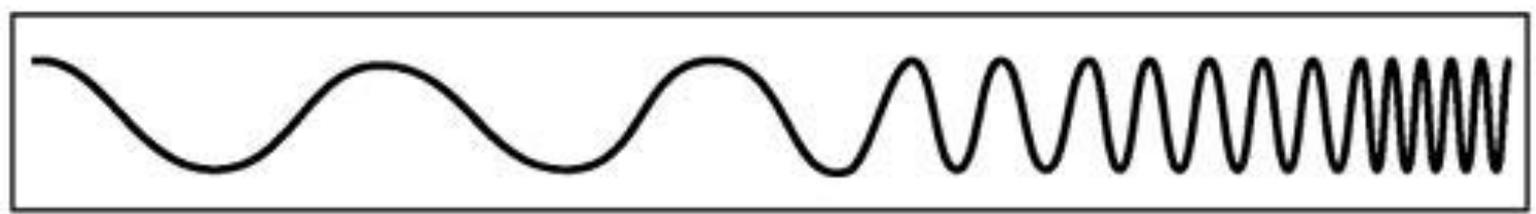
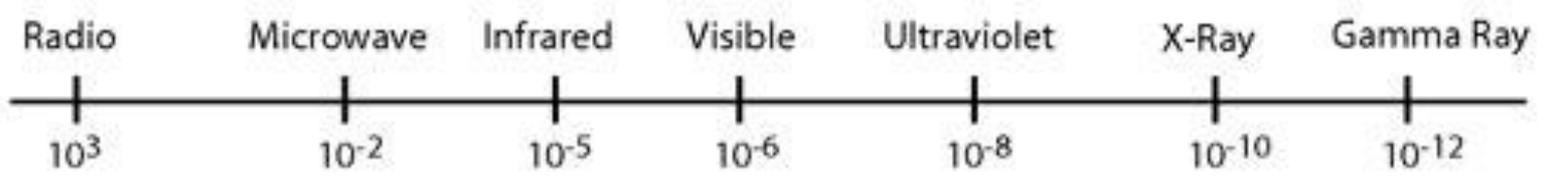
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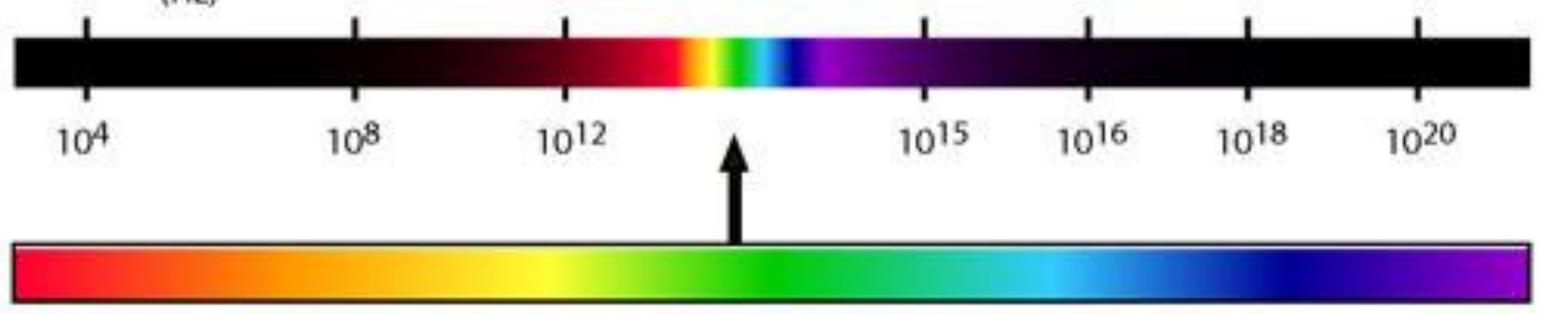


# THE ELECTRO MAGNETIC SPECTRUM

Wavelength  
(metres)



Frequency  
(Hz)



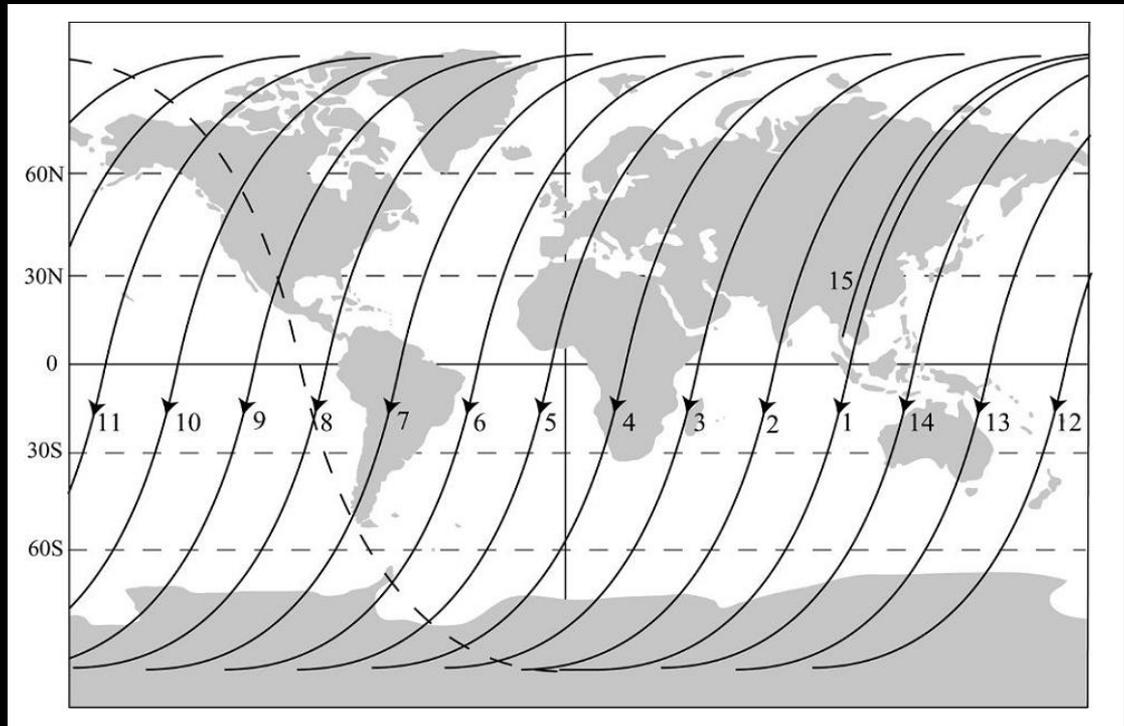
Band name	P	L	S	C	X	K <sub>u</sub>	K <sub>a</sub>	Q	V	W
	0.39	1.55	4.2	5.75	10.9	22	36	46	56	
Frequency	0.3 GHz	1.0	3.0	10	30	100 GHz				
Wavelength	100 cm	30	10	3.0	1.0	0.3 cm				

**Table 2.1.** Band letter designations used in microwave remote sensing.

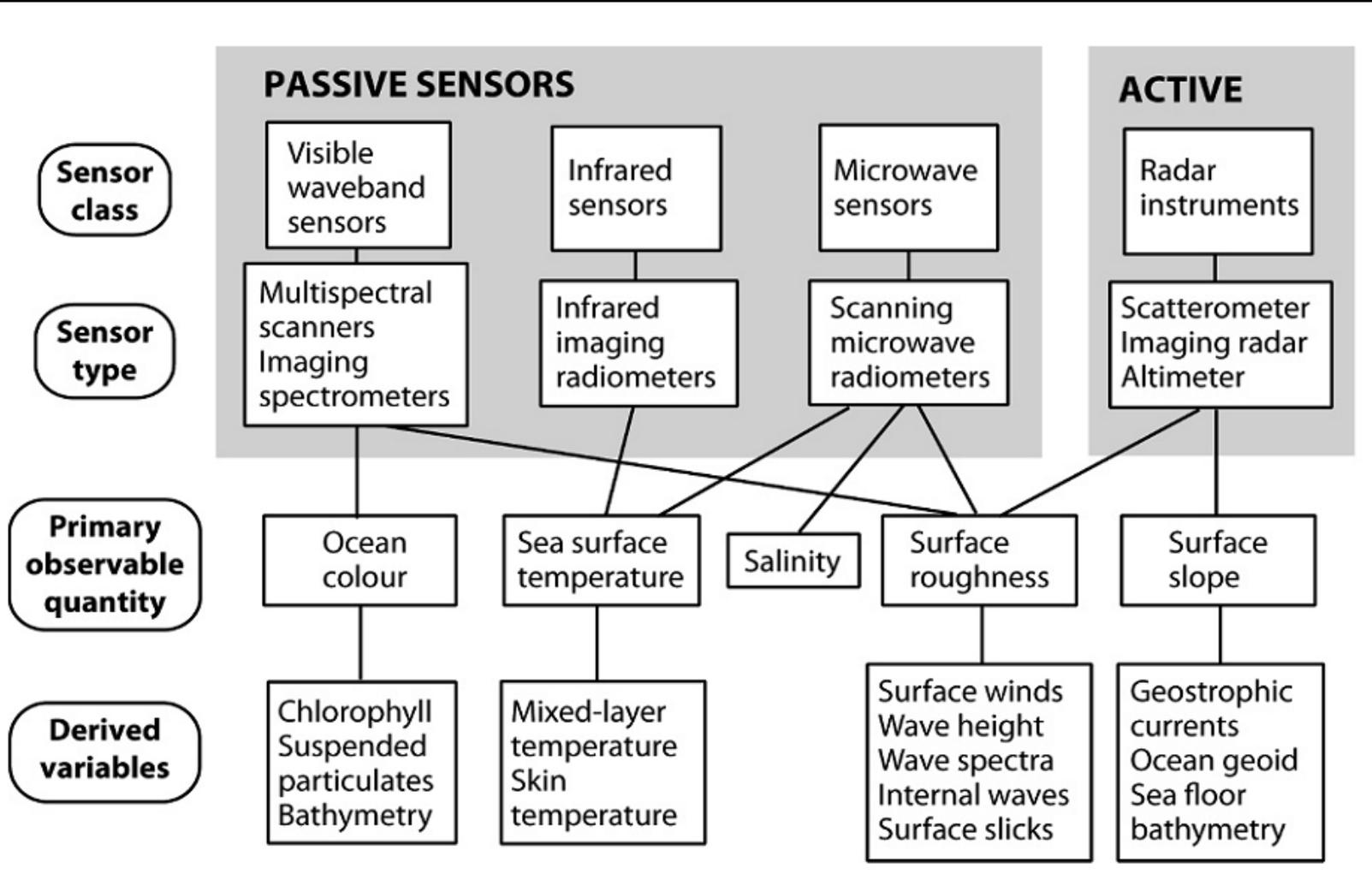
Band	Frequency (GHz)	Wavelength
P	0.225–0.390	76.9–133 cm
L	0.390–1.55	19.35–76.9 cm
S	1.55–4.20	7.14–19.35 cm
C	4.20–5.75	5.22–7.14 cm
X	5.75–10.9	2.75–5.22 cm
K <sub>u</sub>	10.9–22.0	1.36–2.75 cm
K <sub>a</sub>	22.0–36.0	8.33–13.6 mm
Q	36.0–46.0	6.52–8.33 mm
V	46.0–56.0	5.36–6.52 mm
W	56.0–100	3.0–5.36 mm

## Satellite orbits

- Geostationary sensors typically offer a revisit interval of less than 30 min and spatial resolution of 1 to 5 km.
- The polar orbiting sensor cover the whole Earth in a single day if it is the swath at least 2700 km.
- Each point on the Earth surface is viewed once from descending track and once from ascending track.



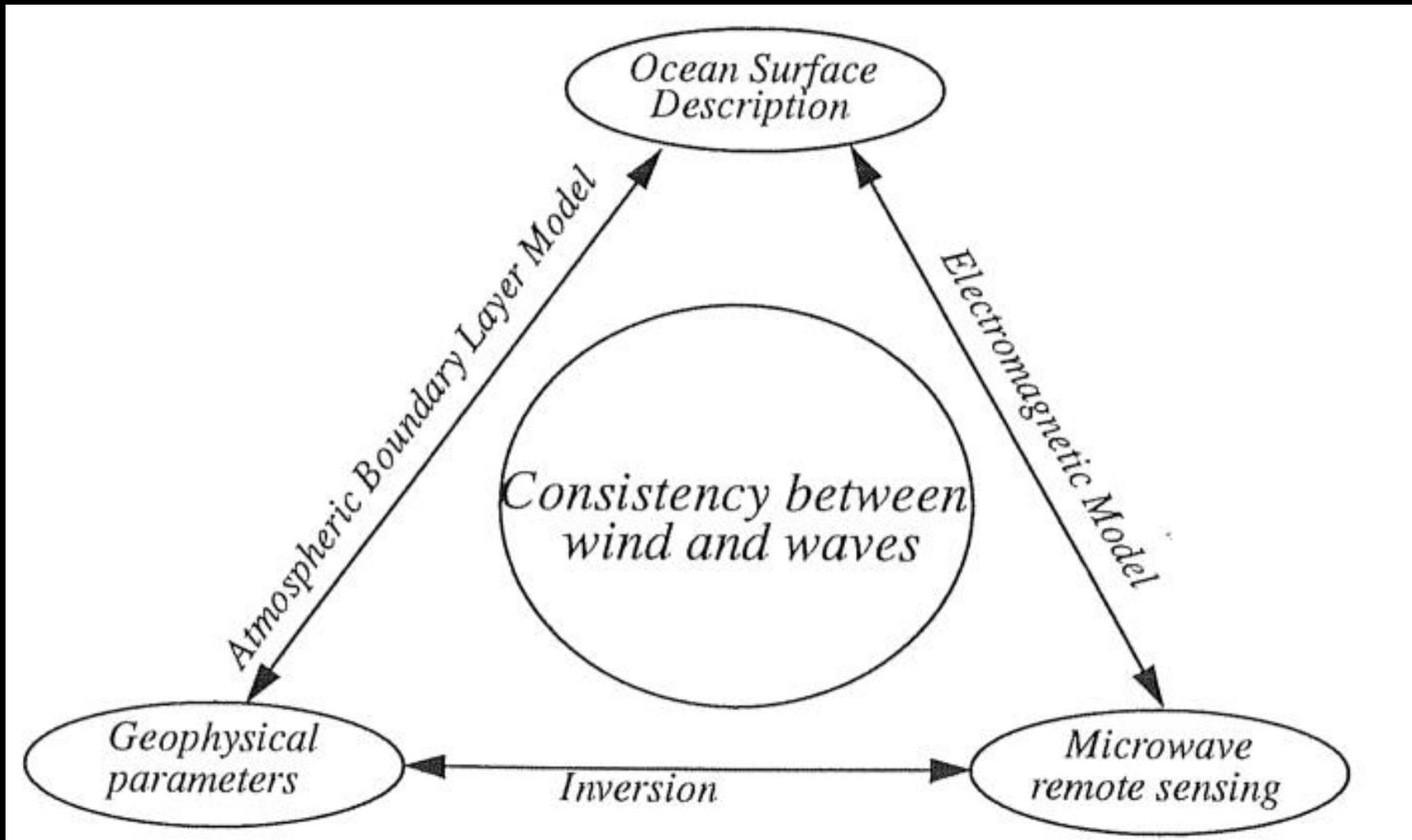
Ground track of a typical near-polar, low-Earth orbit, showing all the descending passes for one day and one ascending pass (dashed).

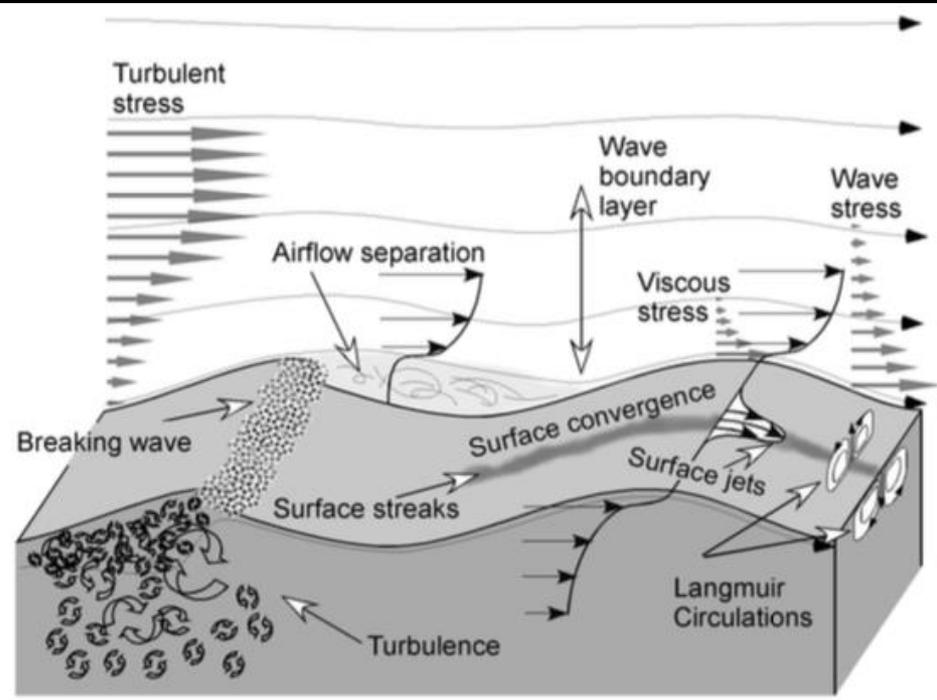


Schematic illustrating the different remote-sensing methods and classes of sensors used in satellite oceanography, along with their applications (from Robinson, 2004).



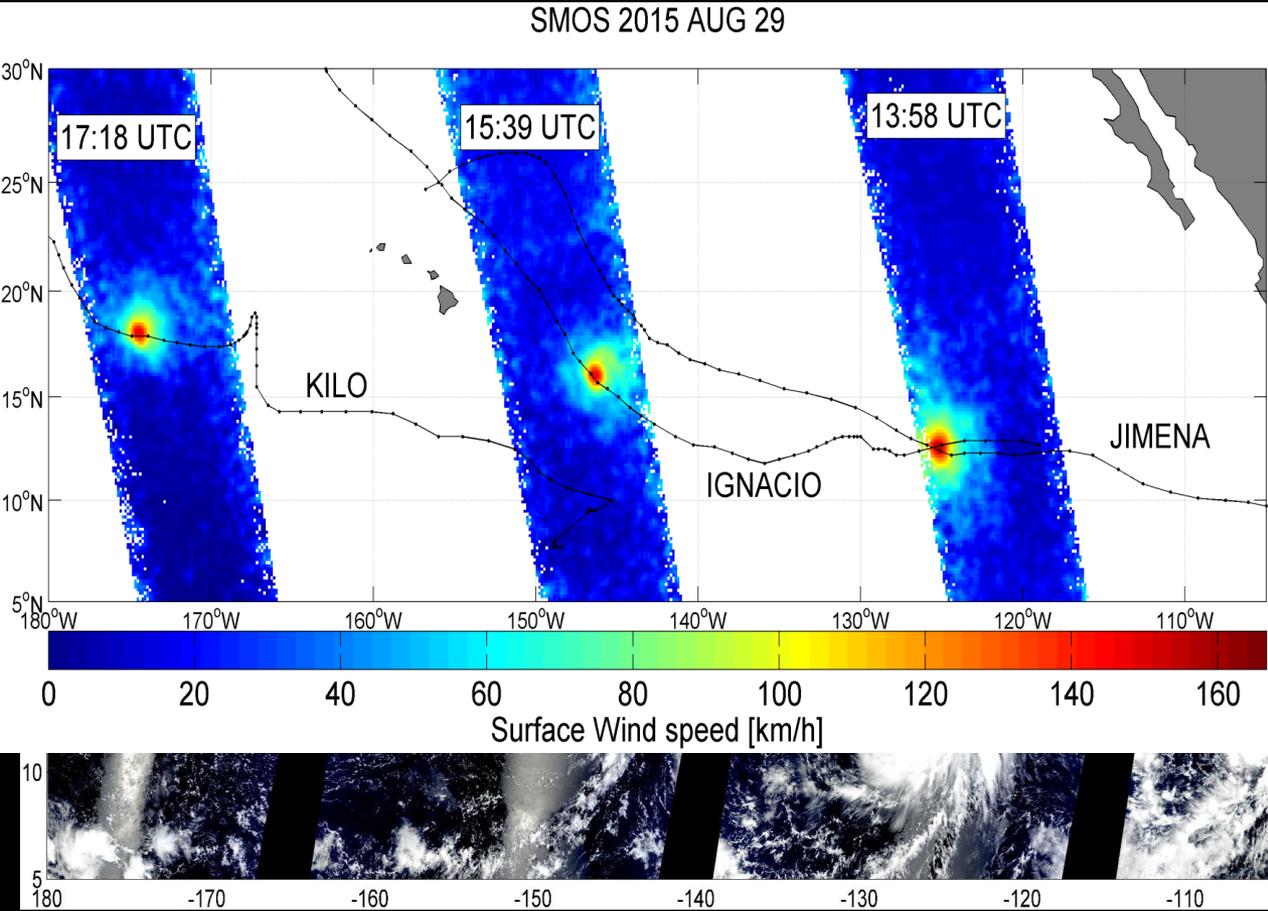
*Foremost, to understand the satellite sensor initial capability (sensor physics and spatio-temporal sampling) ->A consistent approach (T. Elfouhaily, 1997)*



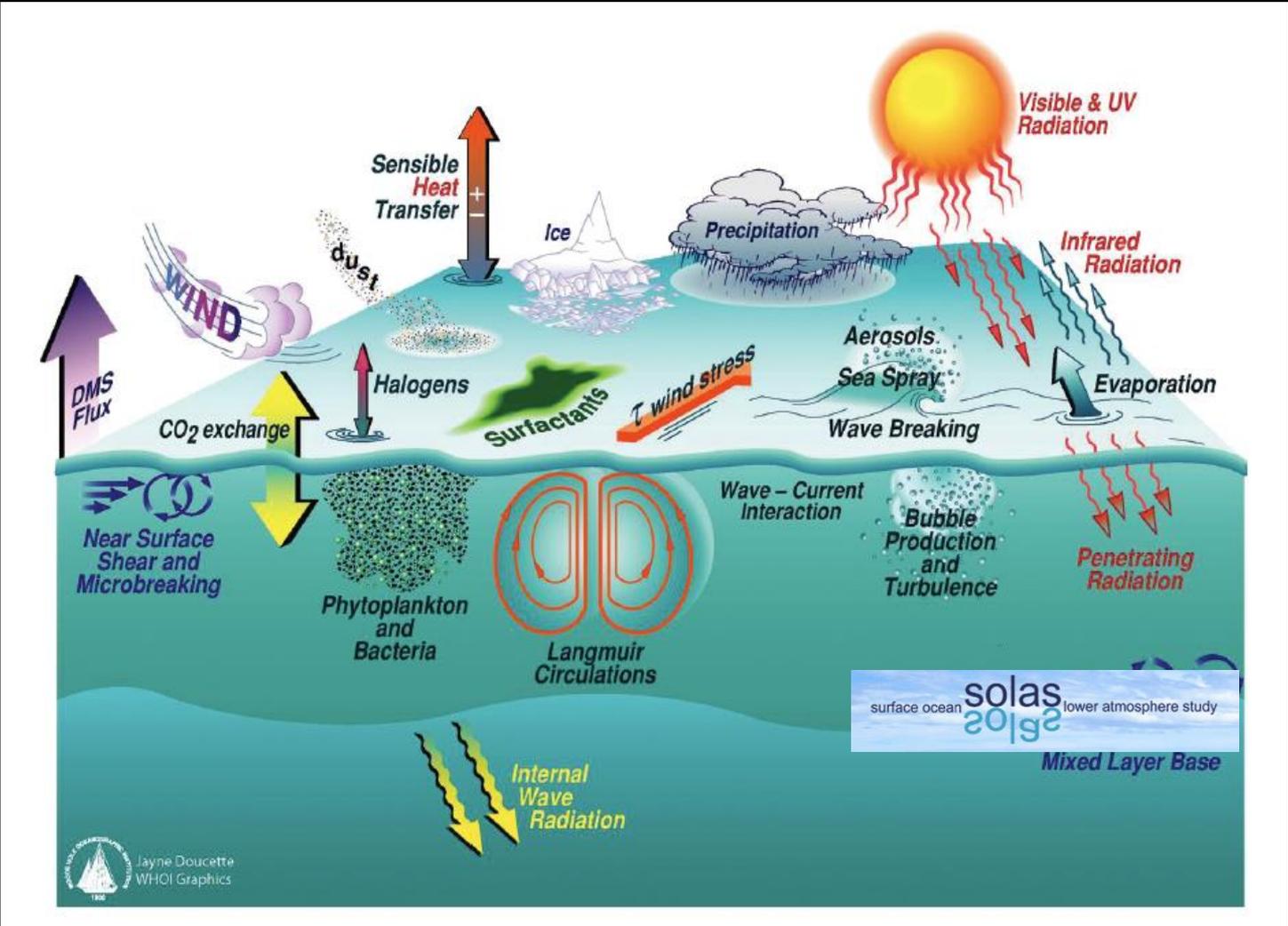




**Signatures of 3 co-evolving 2015 major Hurricanes from 22 Aug to 9 Sep in the East and Central tropical Pacific as seen from SMOS, SMAP and AMSR-2 observations (beyond others)**

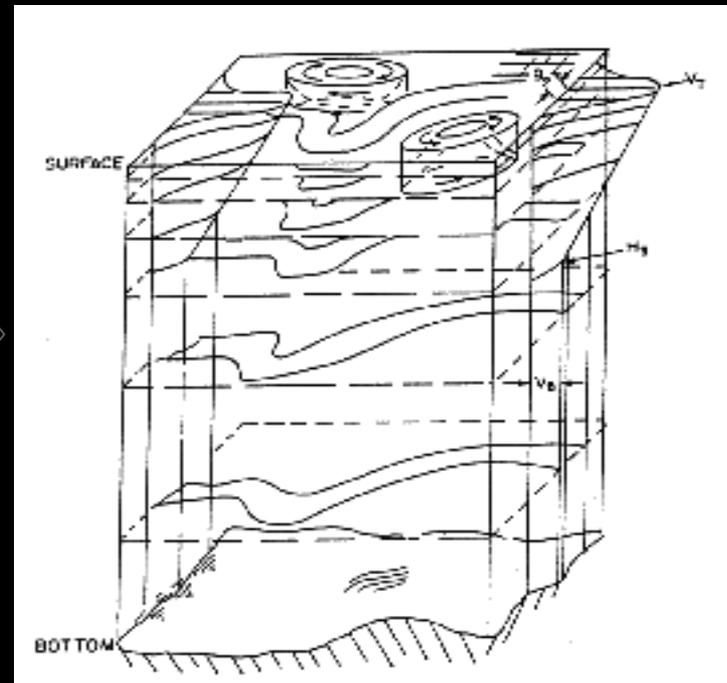
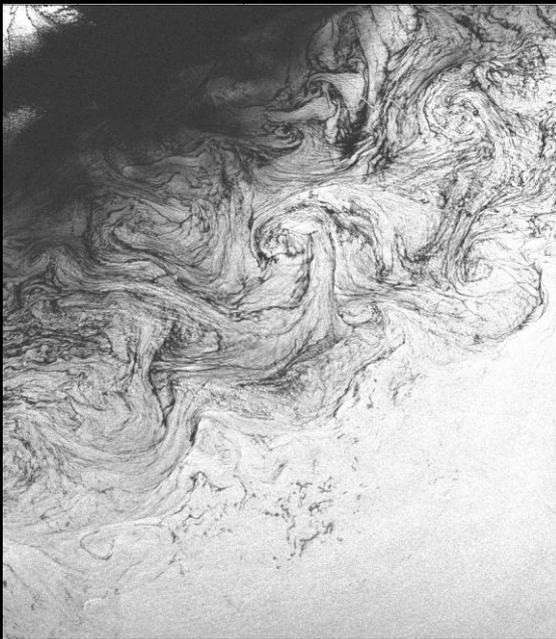


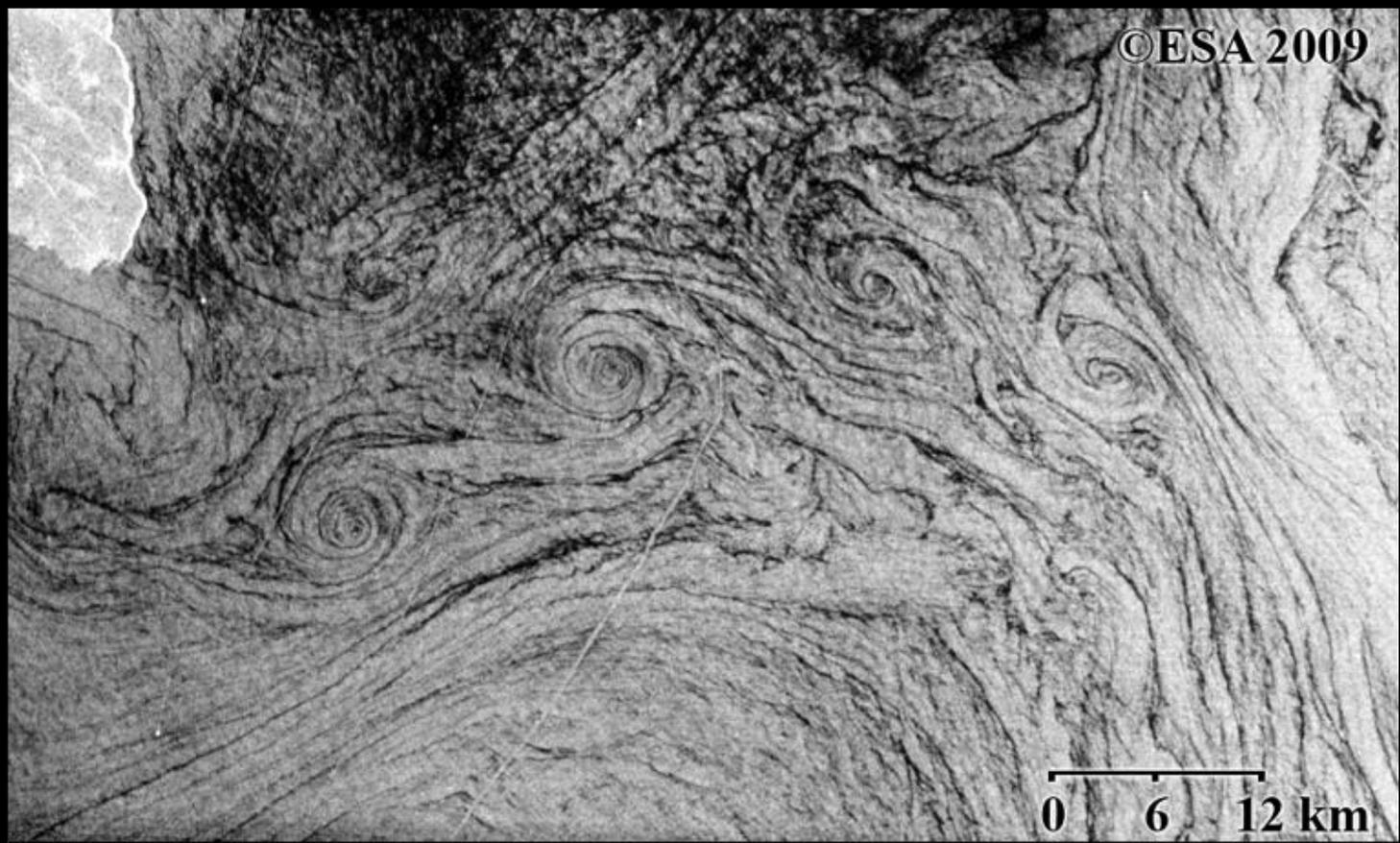
# Satellite instruments generally measure 2D surface expressions of 4D structures

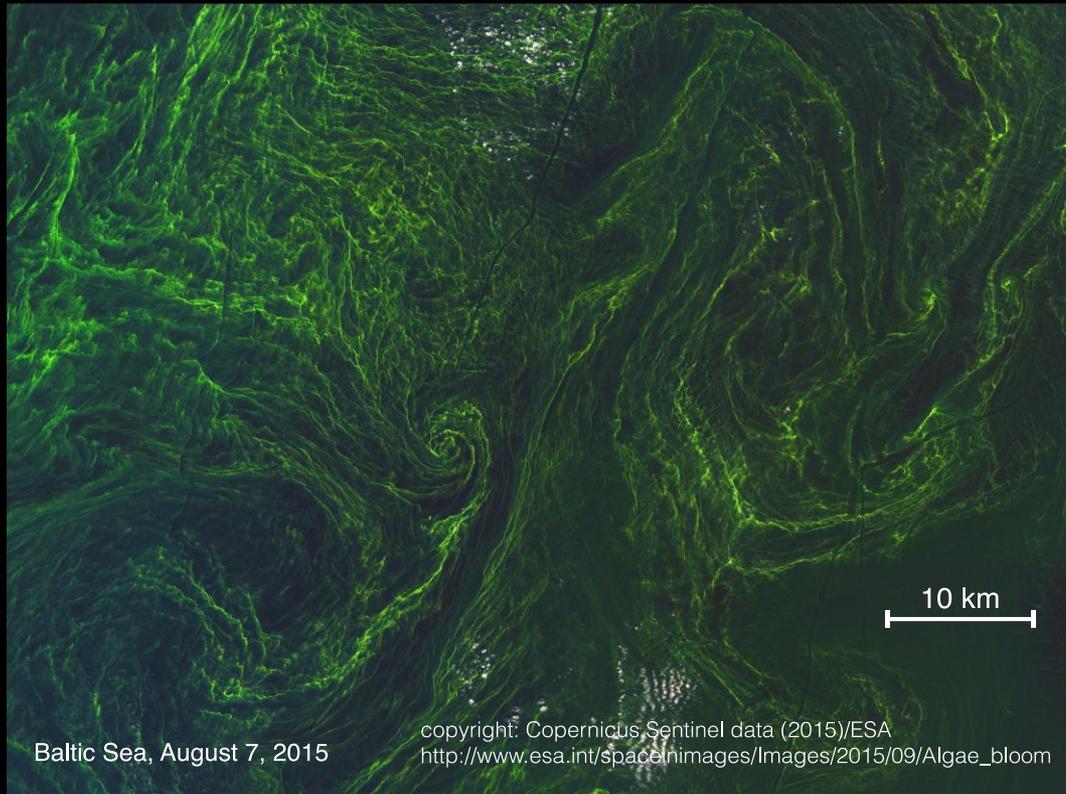




*Sub-mesoscale (10 km eddies) and high resolution radar sea surface roughness variations*

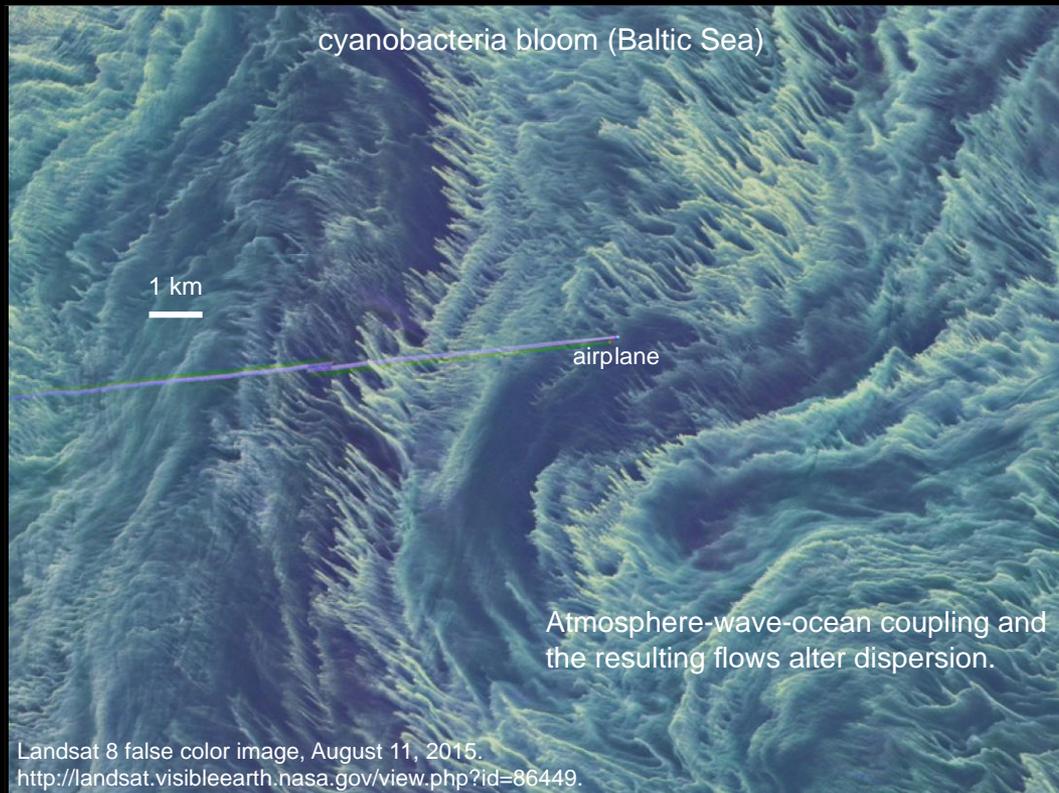




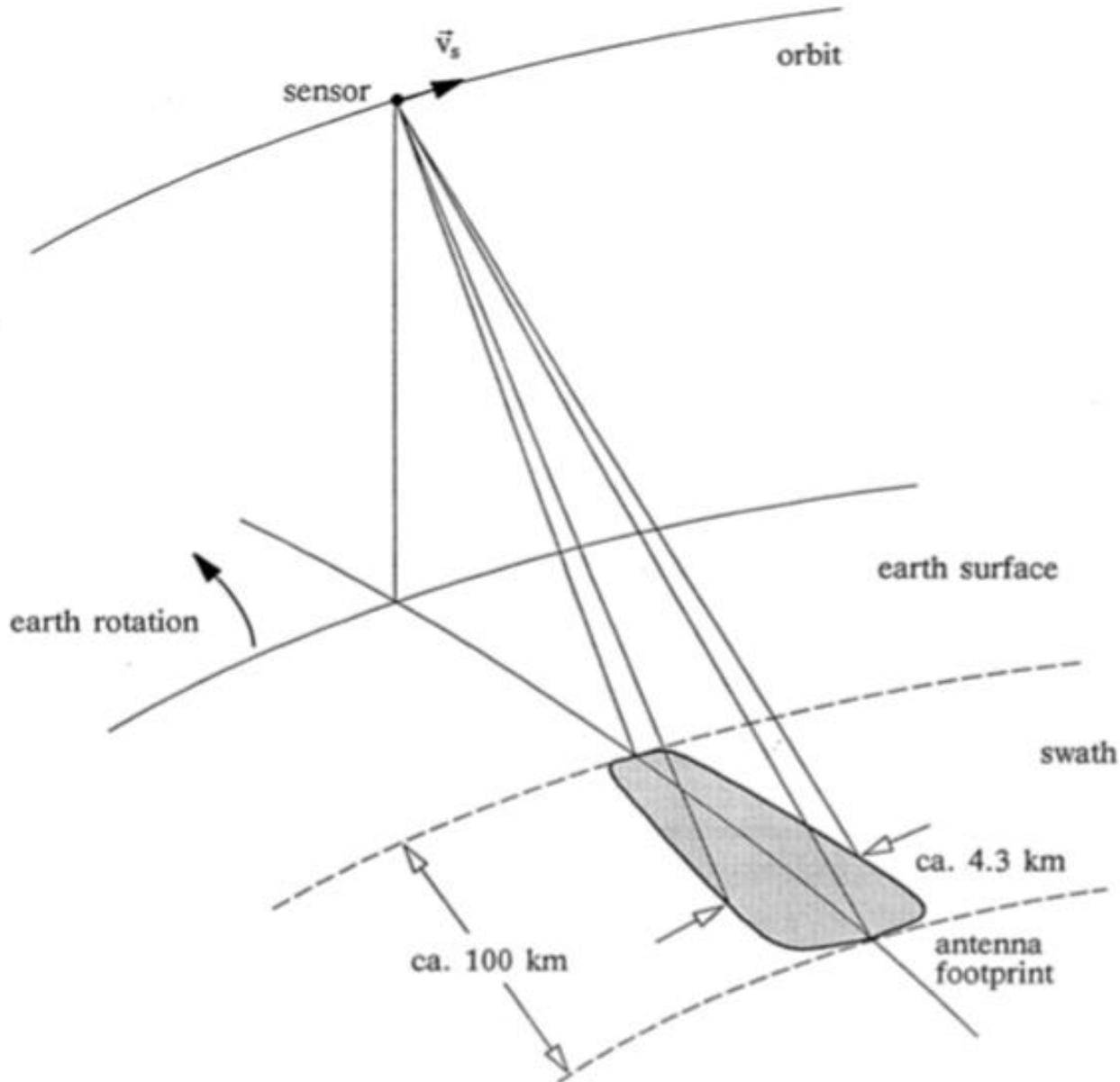


Baltic Sea, August 7, 2015

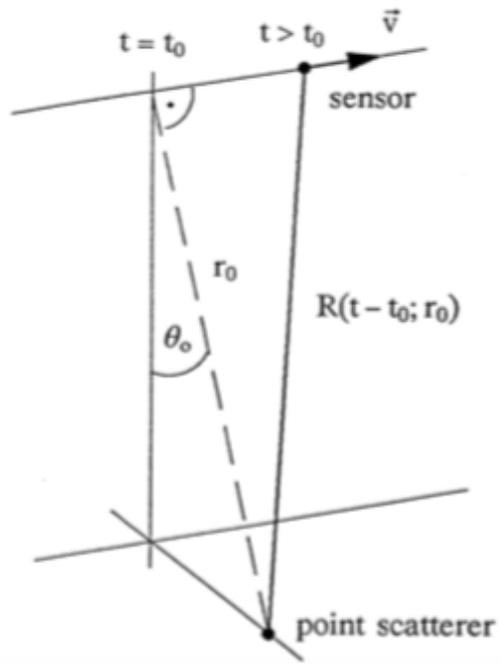
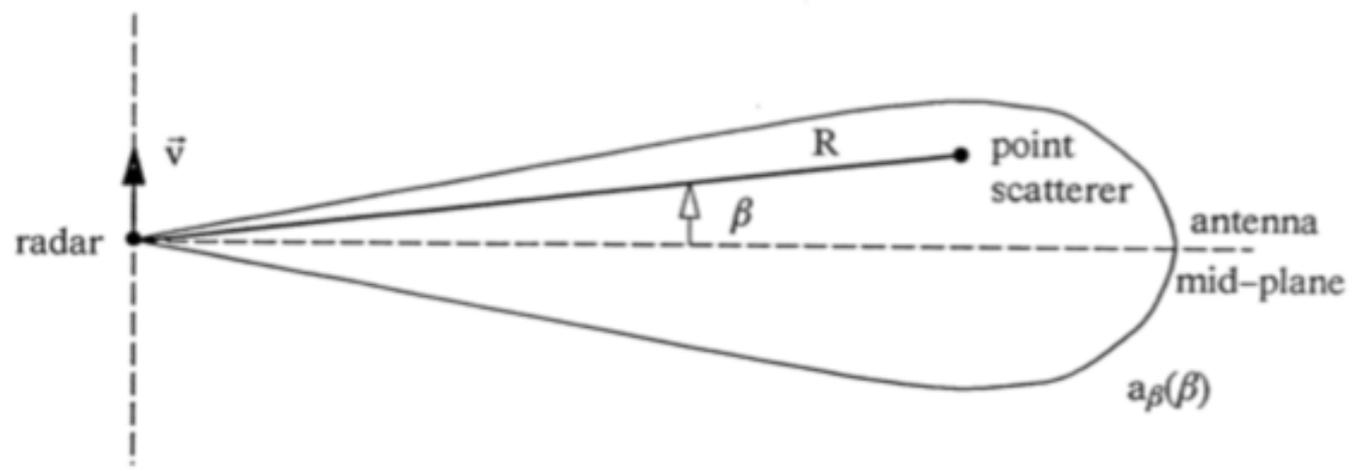
copyright: Copernicus Sentinel data (2015)/ESA  
[http://www.esa.int/spaceInimages/Images/2015/09/Algae\\_bloom](http://www.esa.int/spaceInimages/Images/2015/09/Algae_bloom)



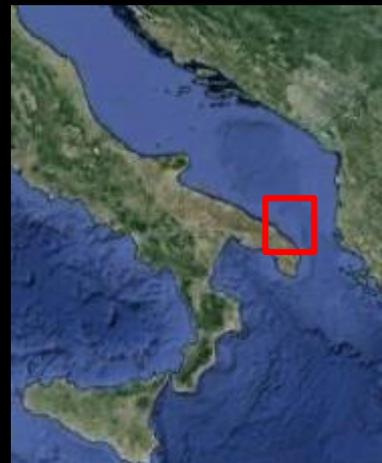
# Sensor Geometry: the SAR case



# Sensor Geometry: the SAR case







Cornwall, UK:  
wind gusts from  
land to sea from  
**S2A sunglitter.**

Oceanic and  
atmospheric  
process  
fingerprints on  
the sea surface



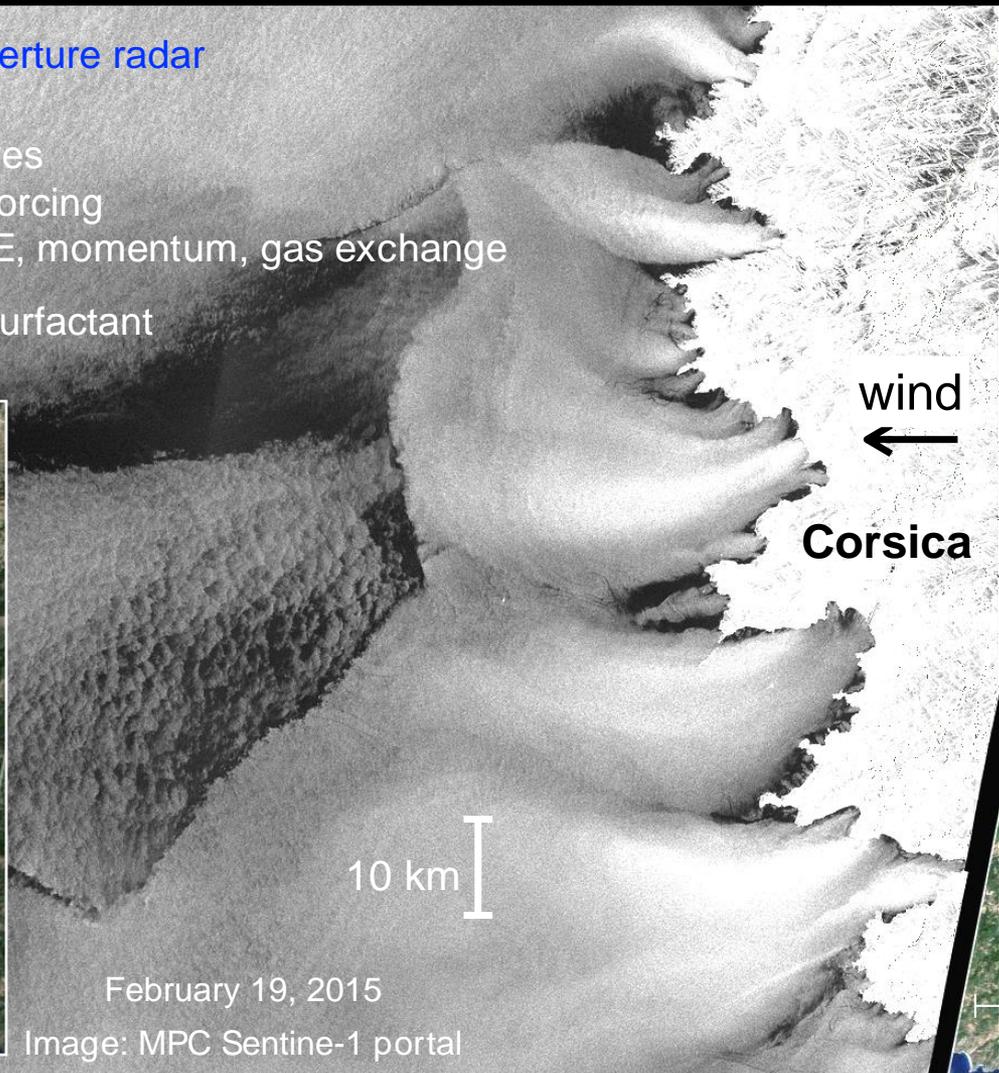
### Satellite synthetic aperture radar (SAR)

light = more short waves

~ stronger wind forcing

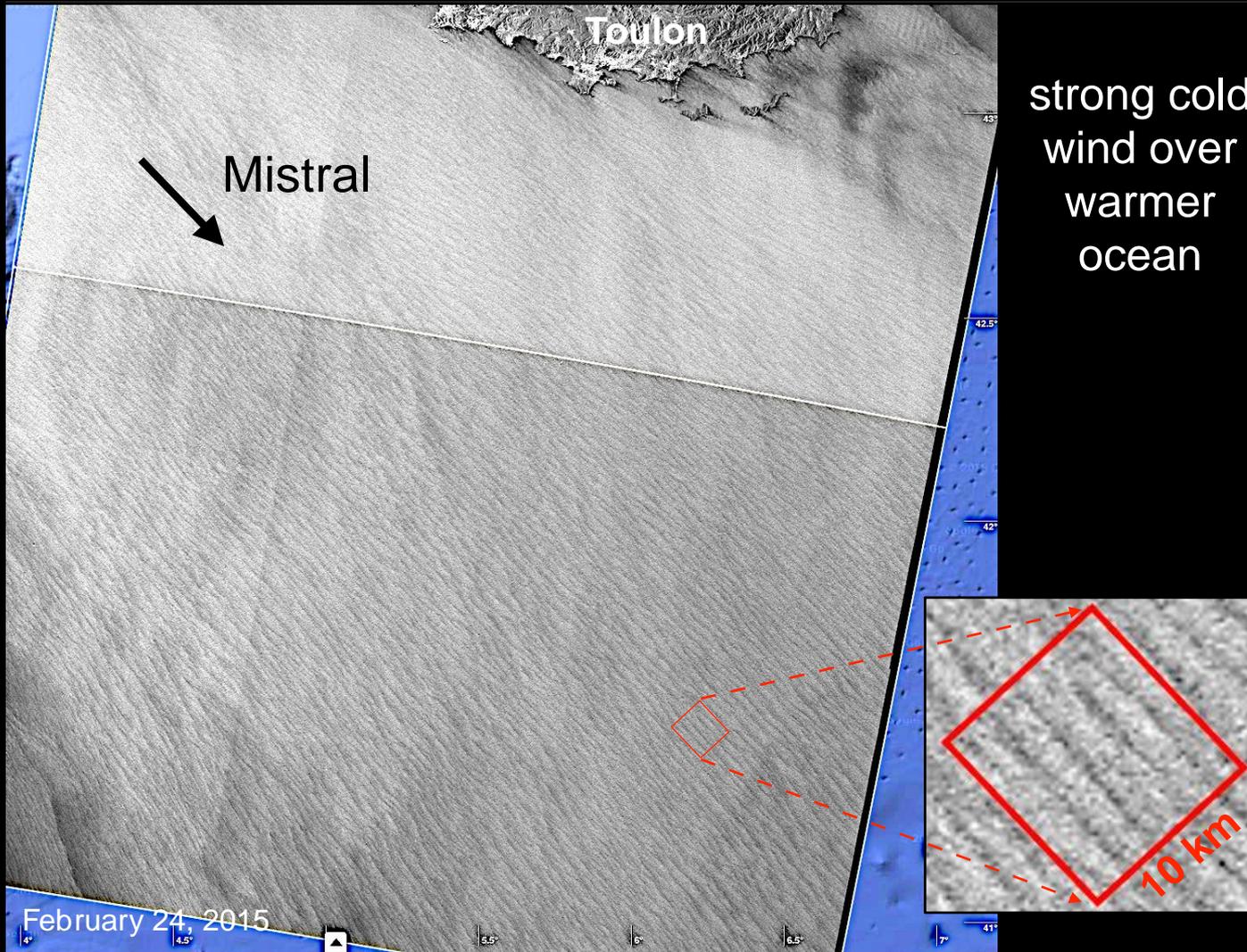
~ air-sea heat, KE, momentum, gas exchange

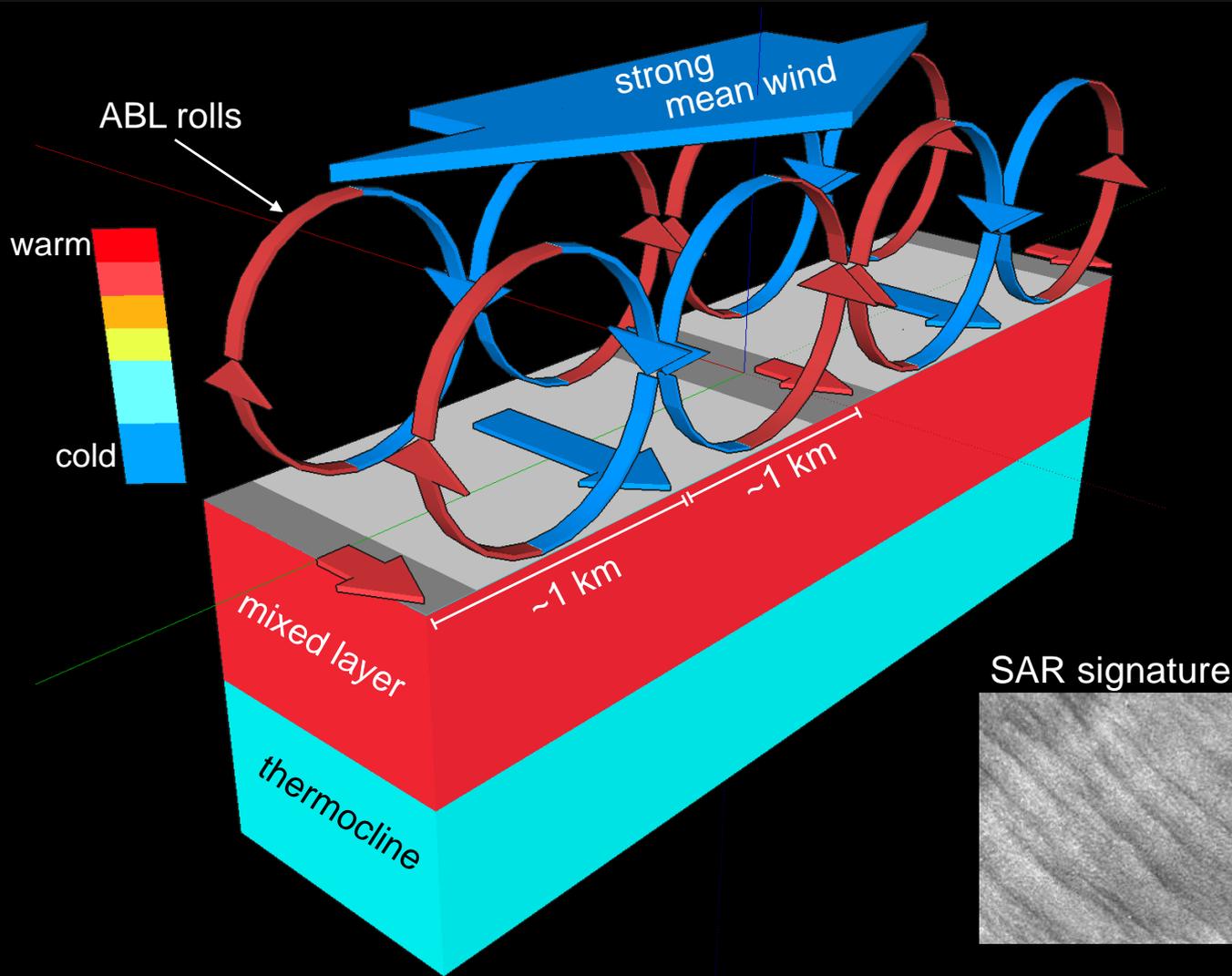
dark = weak wind or surfactant

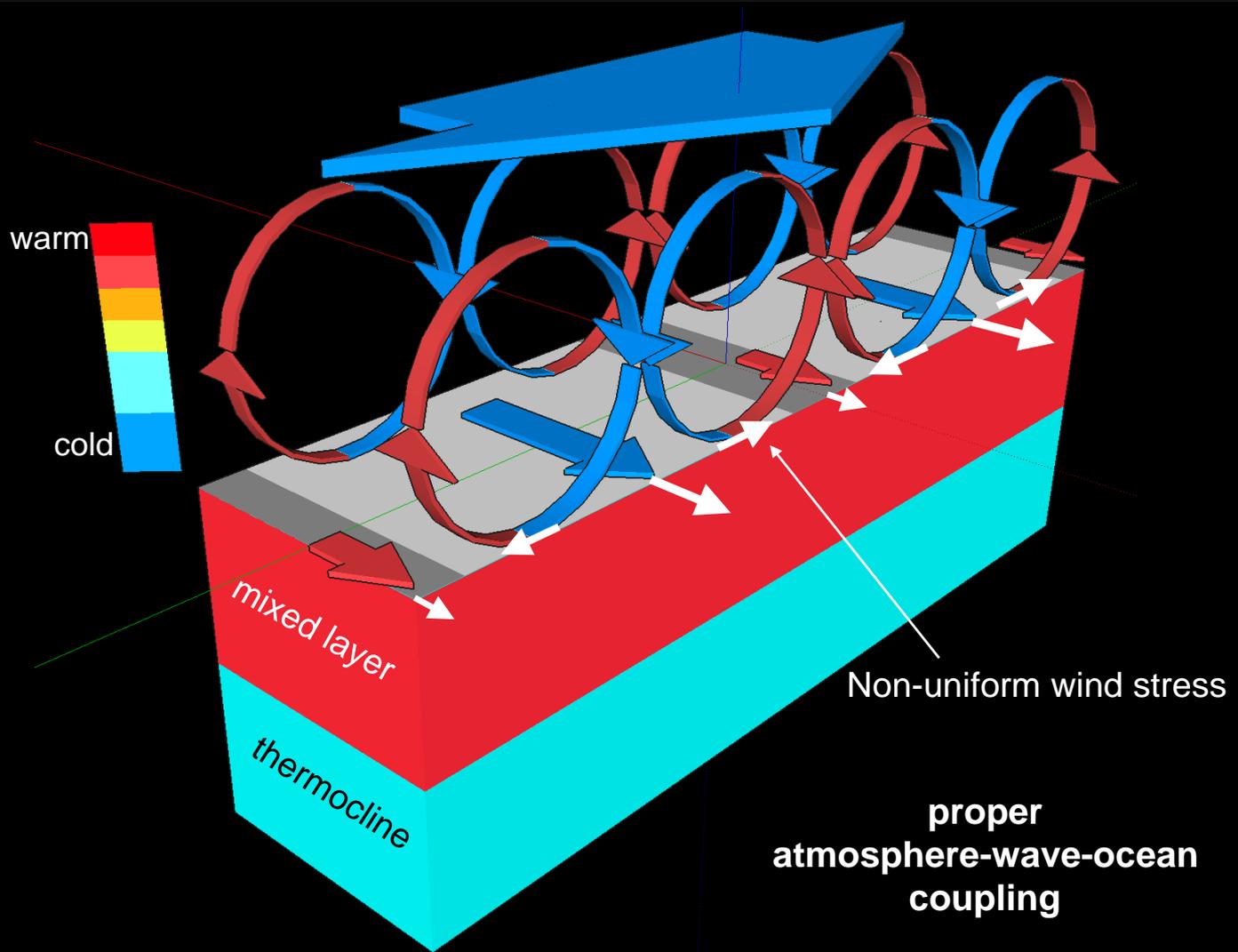


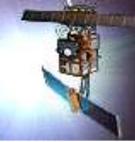
February 19, 2015

Image: MPC Sentine-1 portal

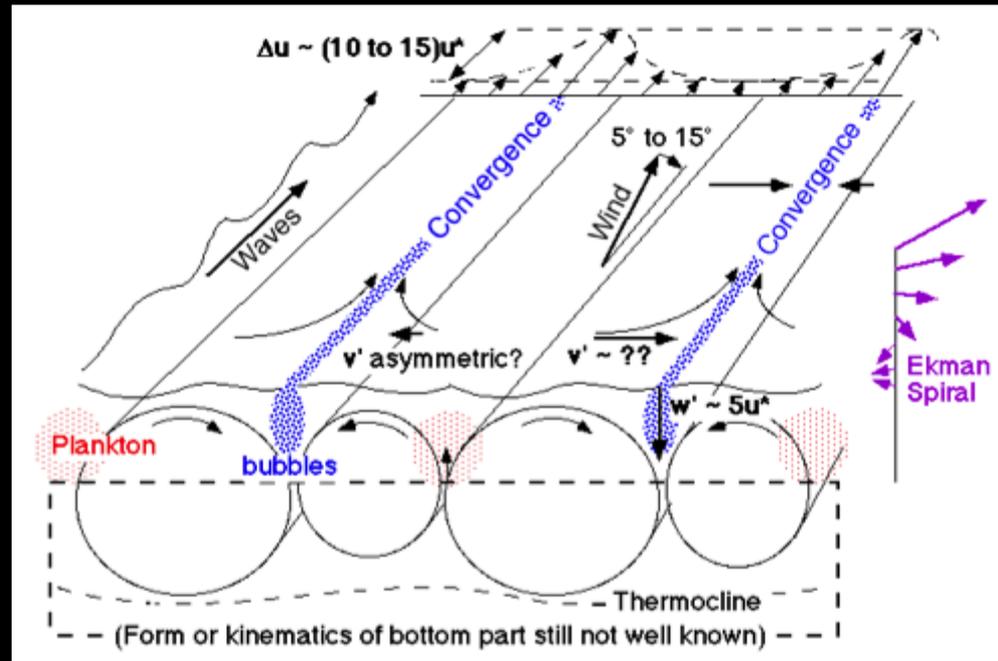








*Schematic illustration of the Langmuir circulation (first described by Langmuir, 1938). The separation scale of the convergence zones are typically 10-100 m*





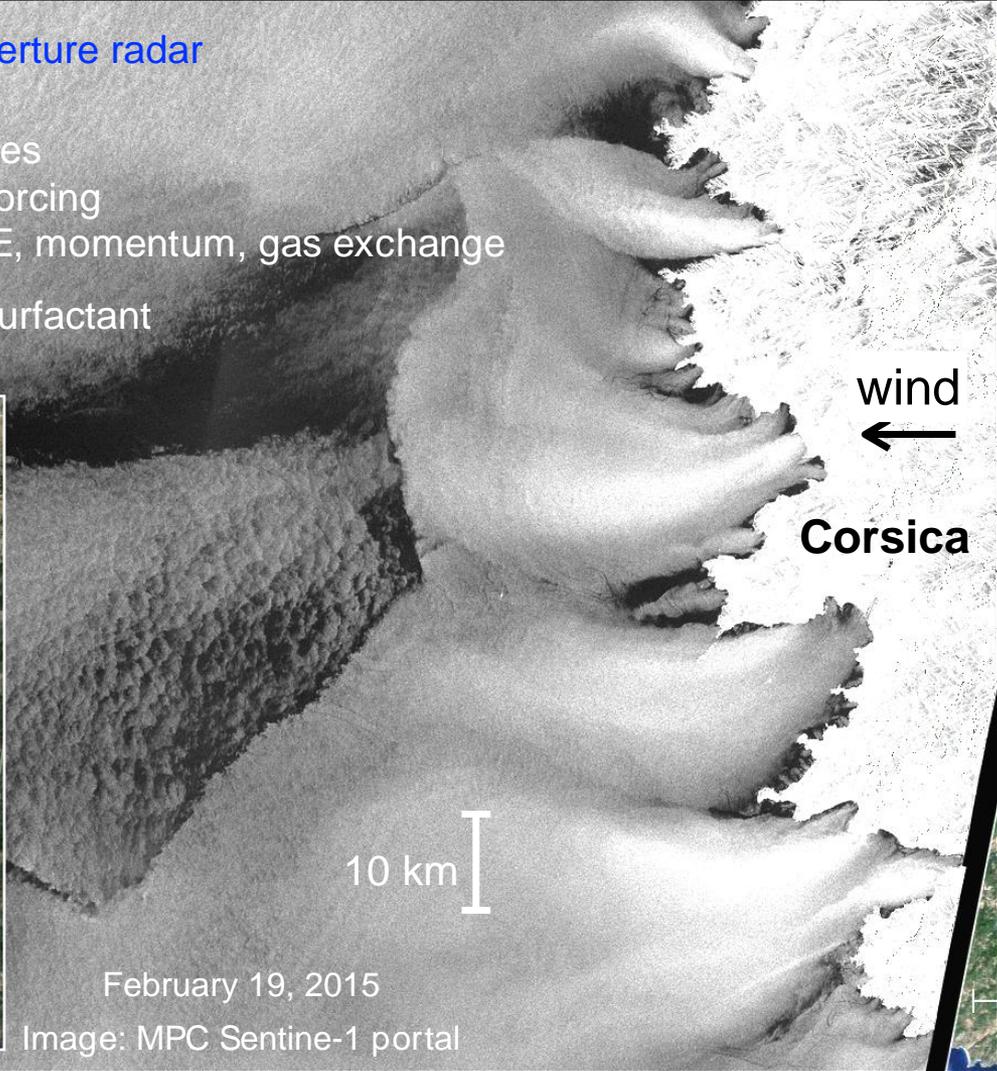
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February 19, 2015

Image: MPC Sentine-1 portal



## Inter-scale interactions

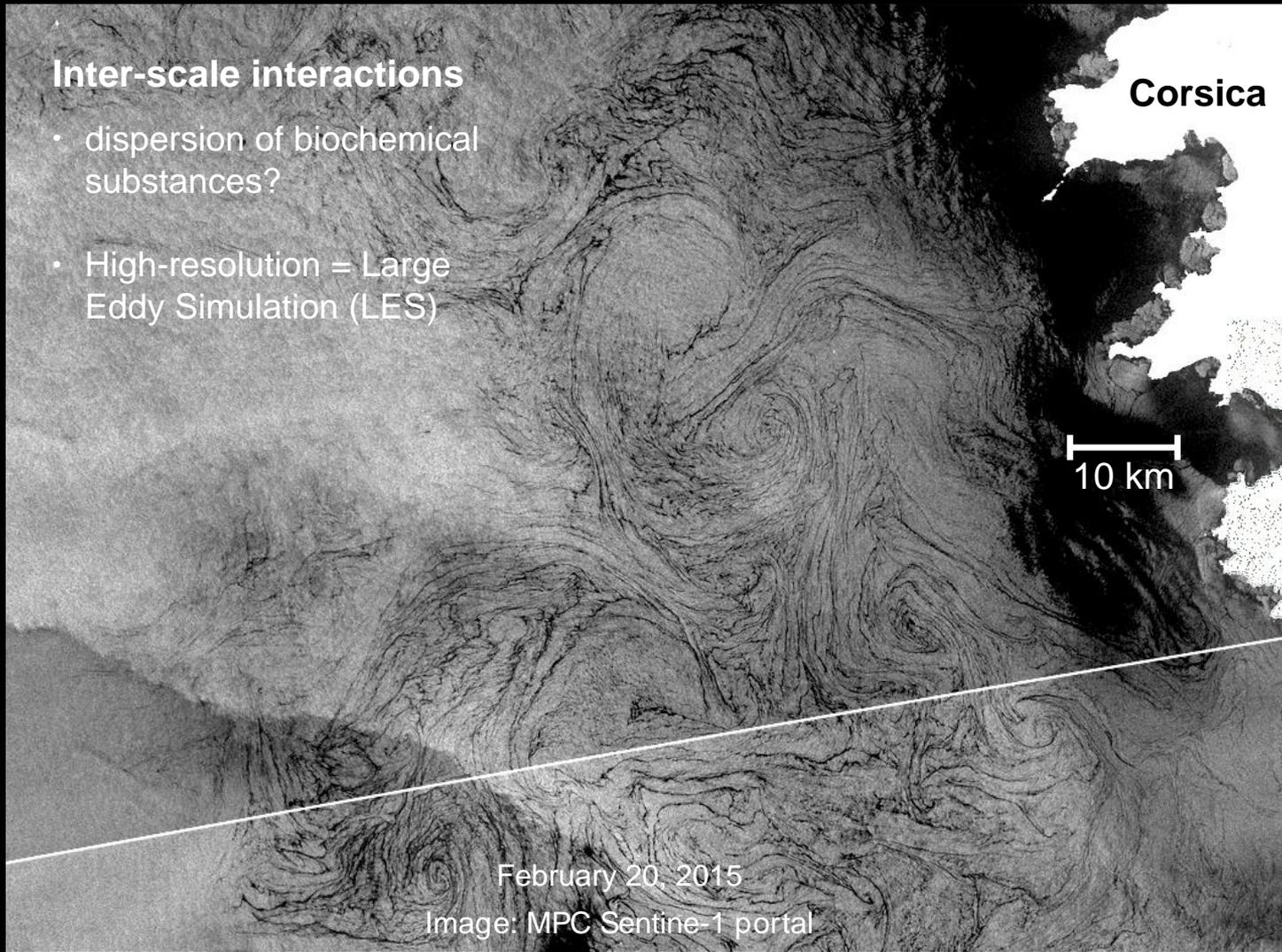
- dispersion of biochemical substances?
- High-resolution = Large Eddy Simulation (LES)

Corsica

10 km

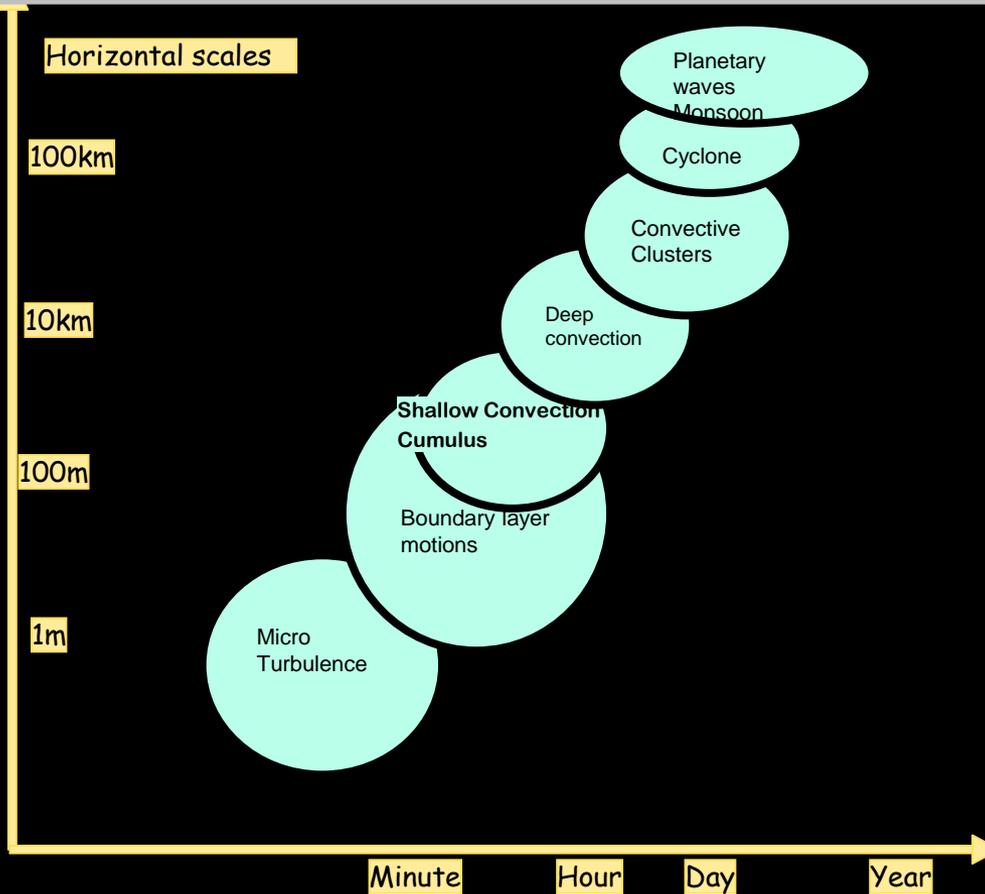
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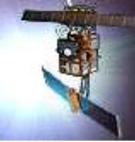
Image: MPC Sentine-1 portal



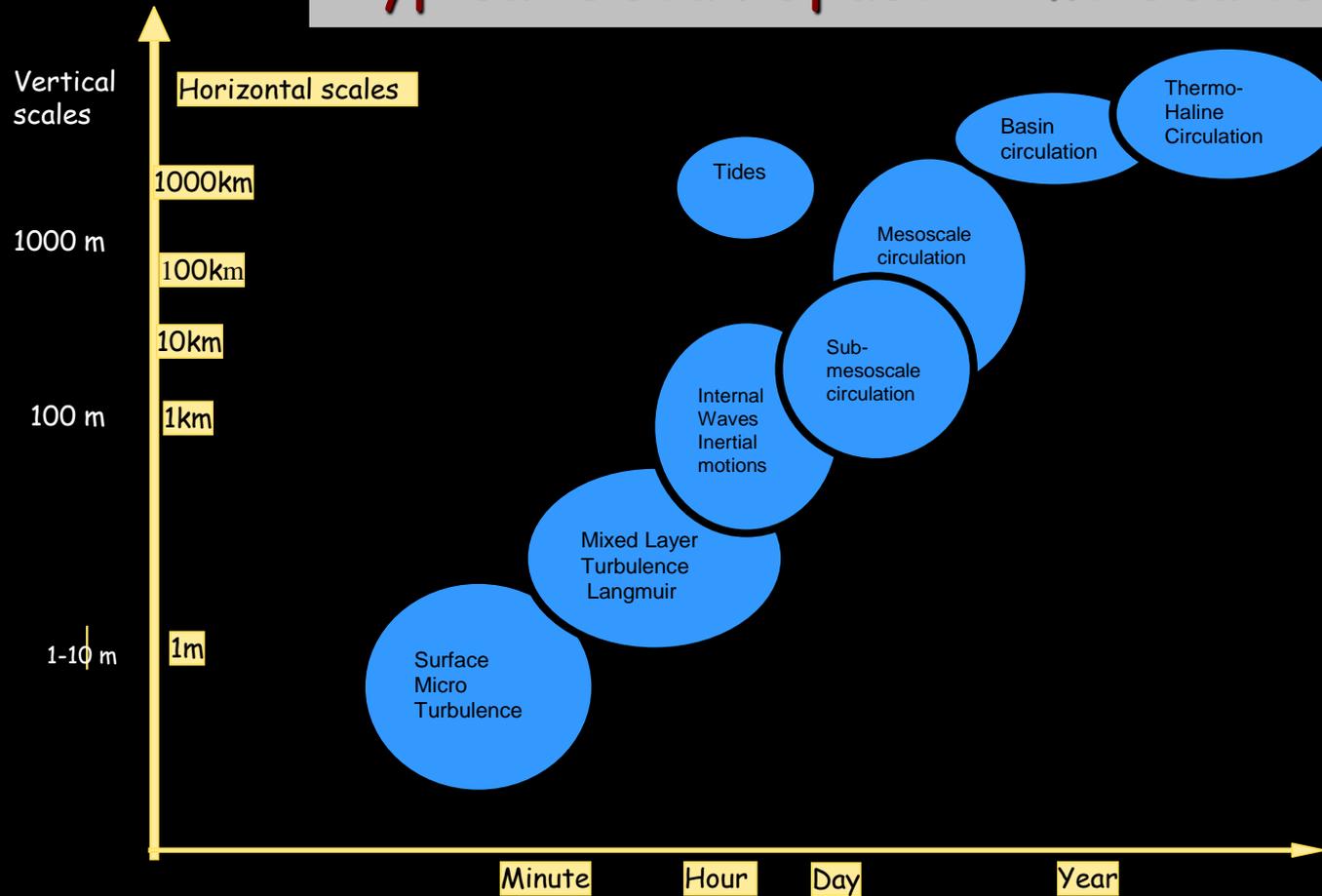


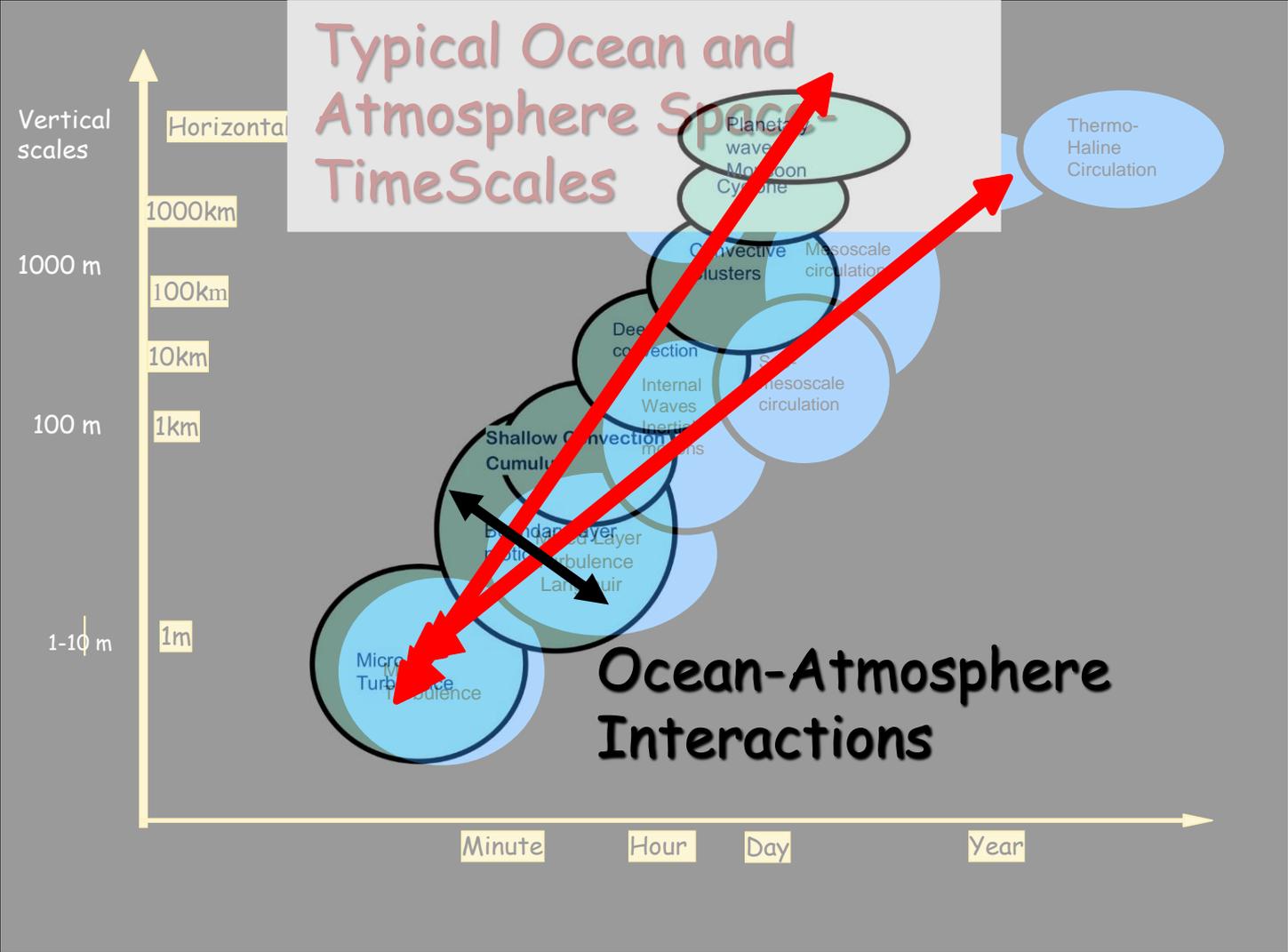
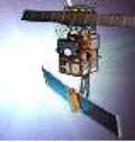
# Typical Atmosphere Space-Time scales





# Typical Ocean Space-Time Scales







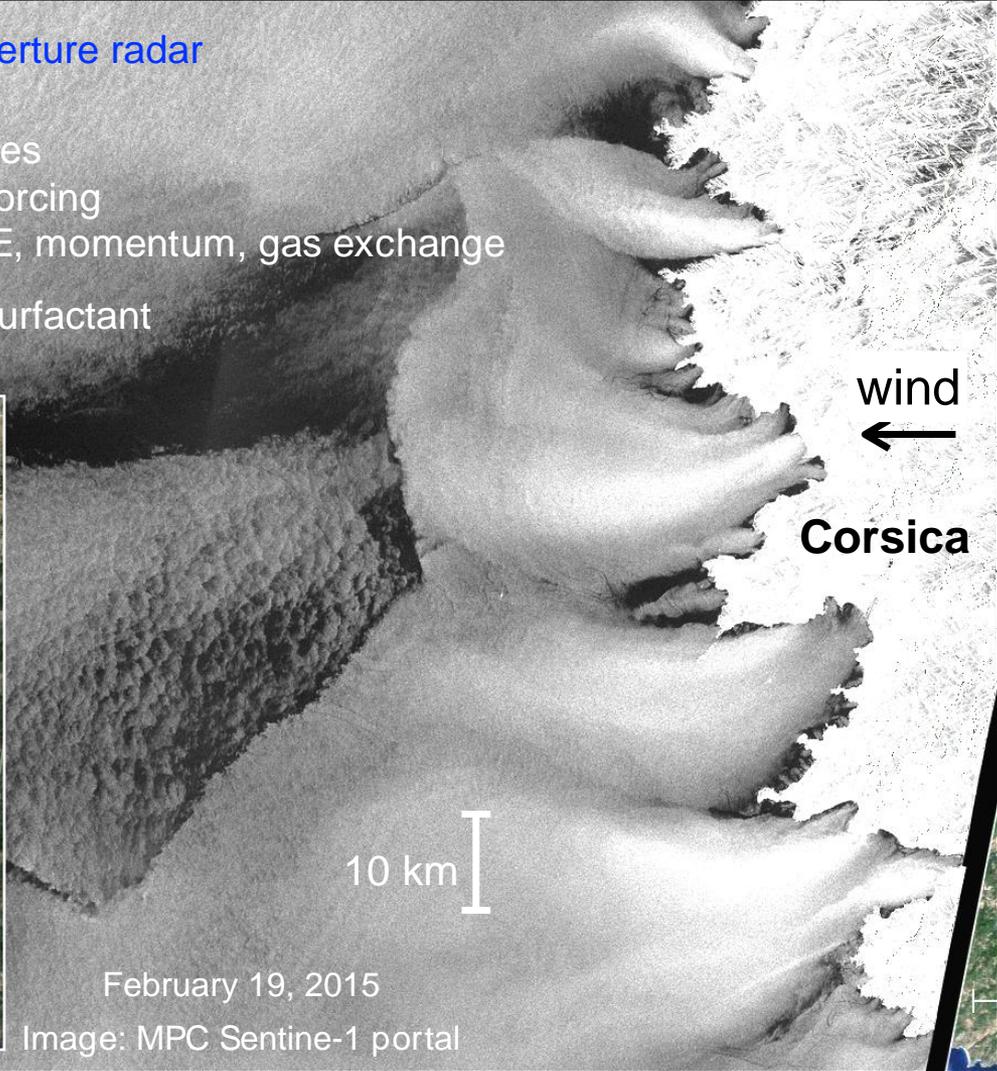
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February 19, 2015

Image: MPC Sentine-1 portal



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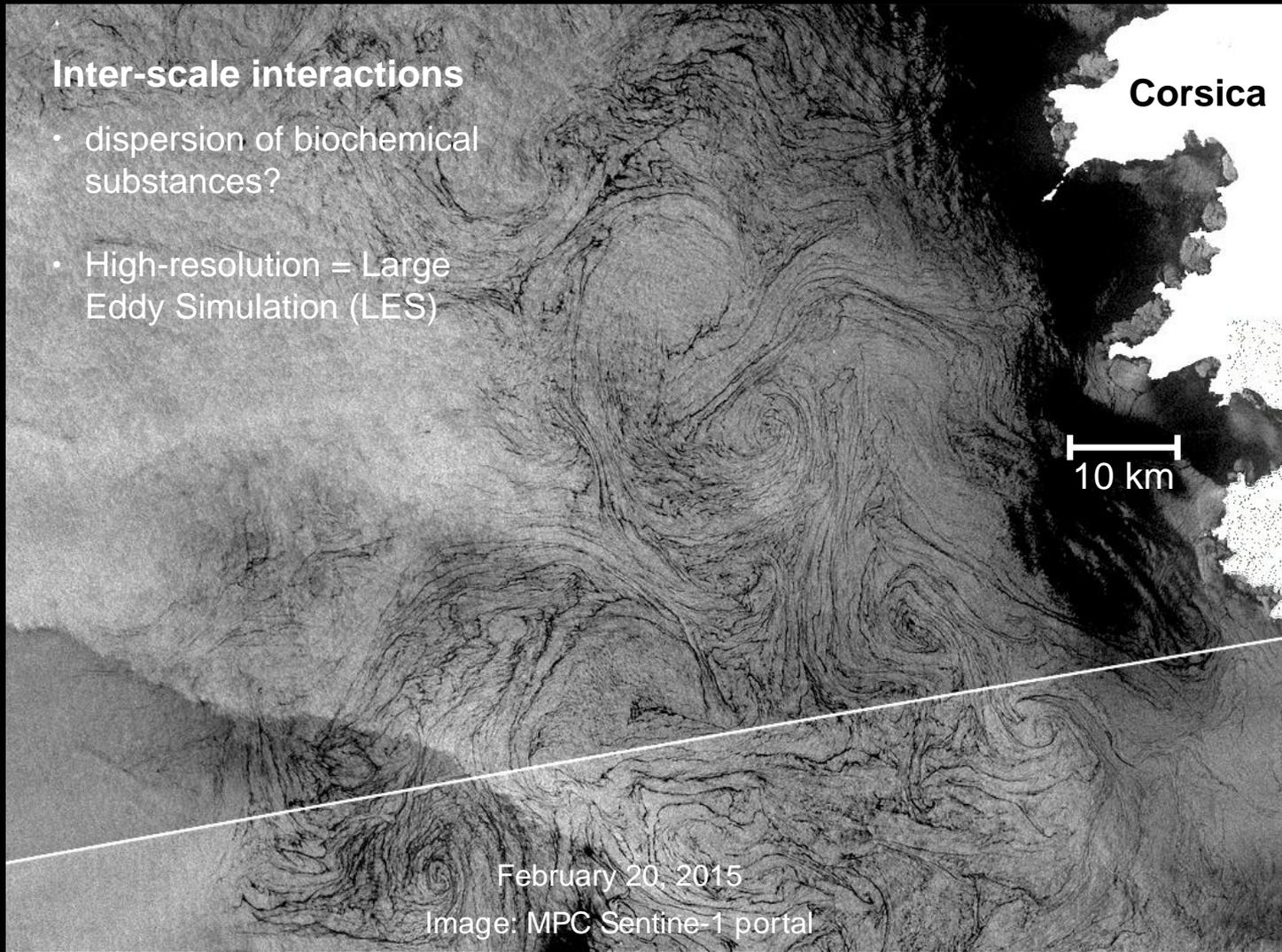
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Corsica

10 km

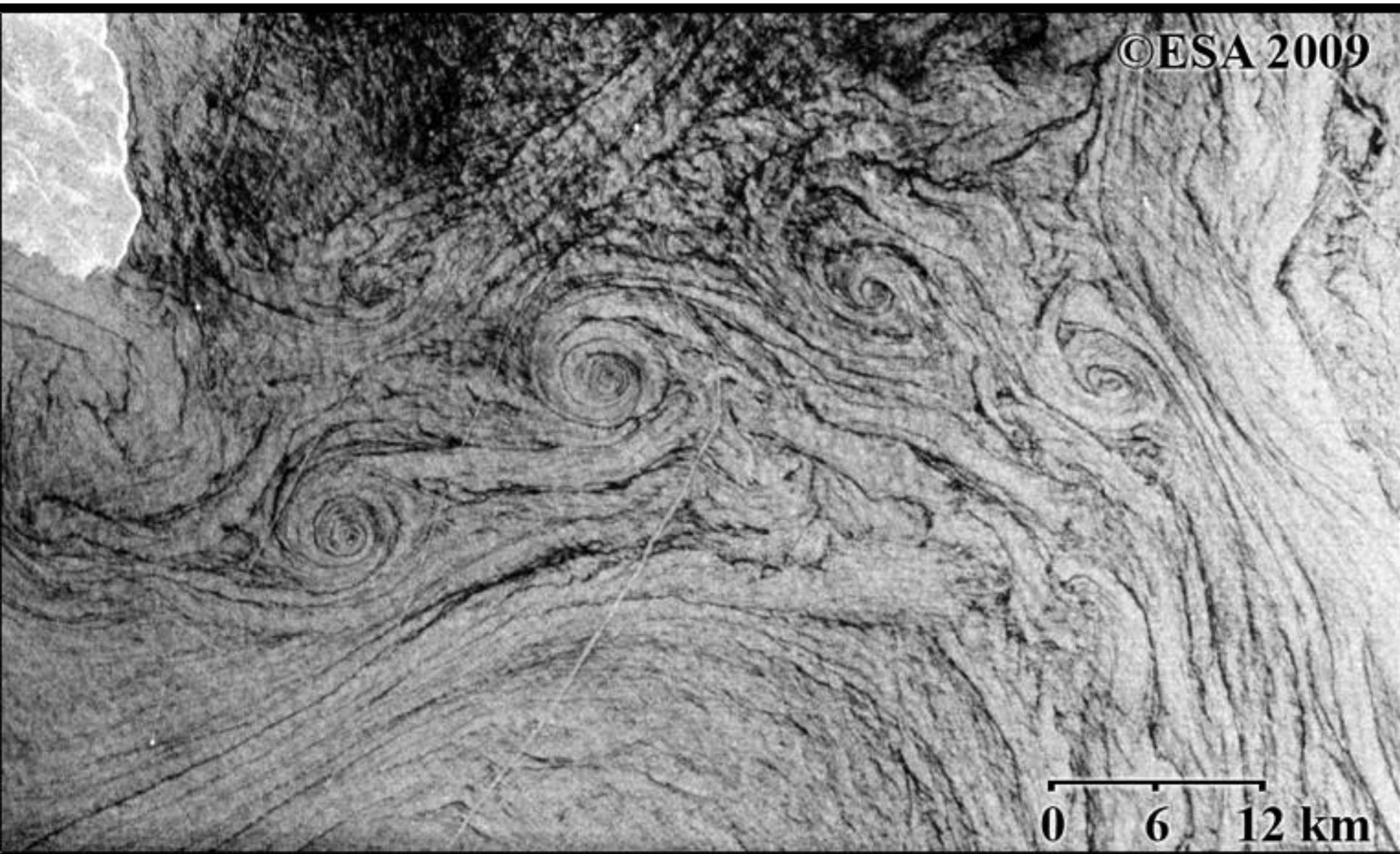
February 20, 2015

Image: MPC Sentine-1 portal





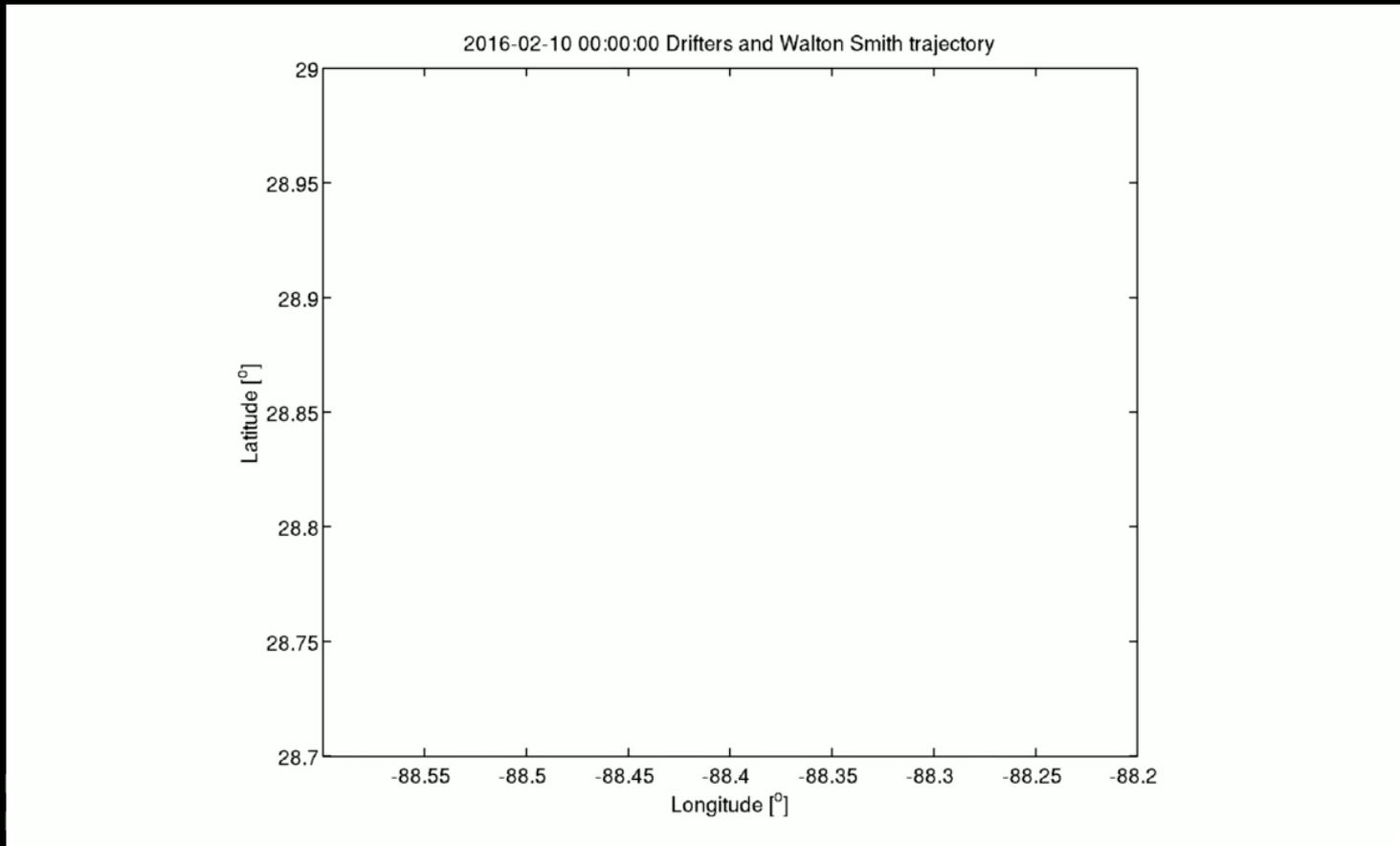
©ESA 2009



0 6 12 km

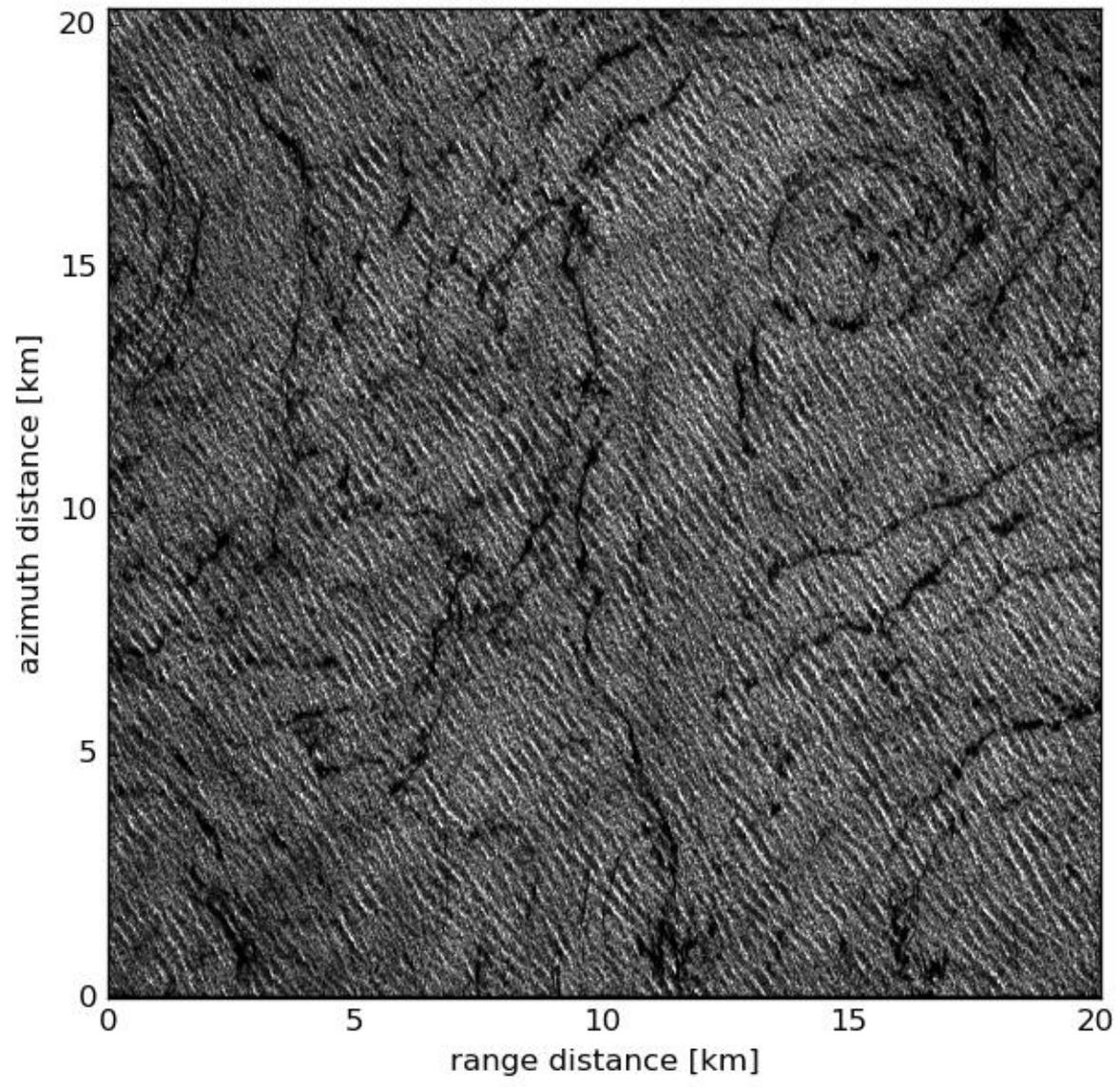


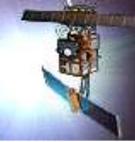
# Intense deformation field at oceanic front inferred from directional sea surface roughness observations





#049 / lon=-99.95 / lat=-27.13 / inc=23.67

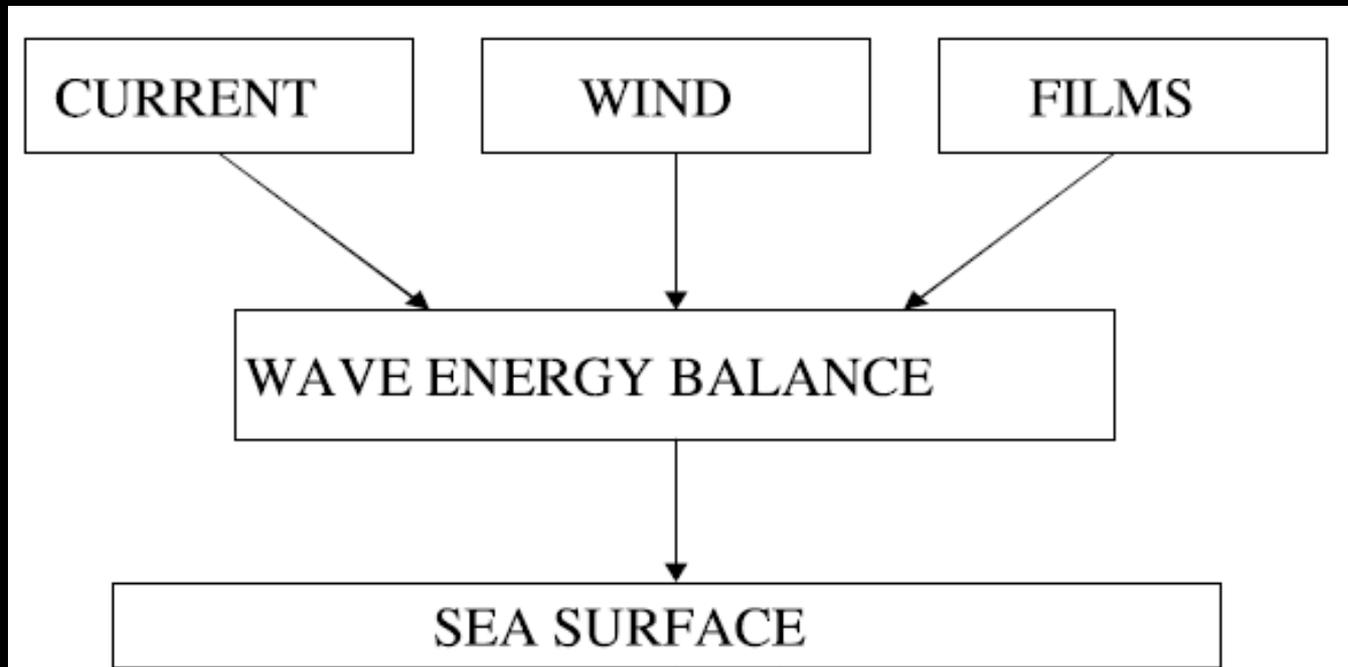




# Sea Surface Roughness changes: interpretation framework

$$\frac{\partial N(\mathbf{k})}{\partial t} + (c_{gi} + u_i) \frac{\partial N(\mathbf{k})}{\partial x_i} - k_j \frac{\partial u_j}{\partial x_i} \frac{\partial N(\mathbf{k})}{\partial k_i} = Q(\mathbf{k})/\omega$$

$$Q(\mathbf{k}) = \beta_v(\mathbf{k})\omega E(\mathbf{k}) - D(\mathbf{k}) - Q^{nl}(\mathbf{k}) + Q^{wb}(\mathbf{k})$$



$$\begin{aligned} & \frac{\partial \tilde{N}(\mathbf{k})}{\partial t} + c_{gi} \frac{\partial \tilde{N}(\mathbf{k})}{\partial x_i} \\ & = \omega^2 k^{-5} [\omega^{-1} m_k^{ij} u_{i,j} B_0 - \tilde{B}/\tau + \tilde{\beta} B_0 + \tilde{I}_{sw}] \end{aligned}$$

$$m_k^{ij} = k_j \partial \ln \tilde{N}_0 / \partial k_i$$

LETTRE XX.

De M. JEAN SPOONER,  
A. B. S.<sup>t</sup> JOHN'S CAMBRIDGE.

Gènes 1.<sup>er</sup> Mai 1822.

Vous m'avez fait l'honneur, M. le Baron, de me demander un extrait du mémoire que j'ai pris la liberté de vous communiquer relativement à un phénomène lumineux qui se montre sur la mer lorsque le soleil ou la lune y donnent dessus (\*), et que vous voulez avoir la bonté d'insérer dans votre *Correspondance*

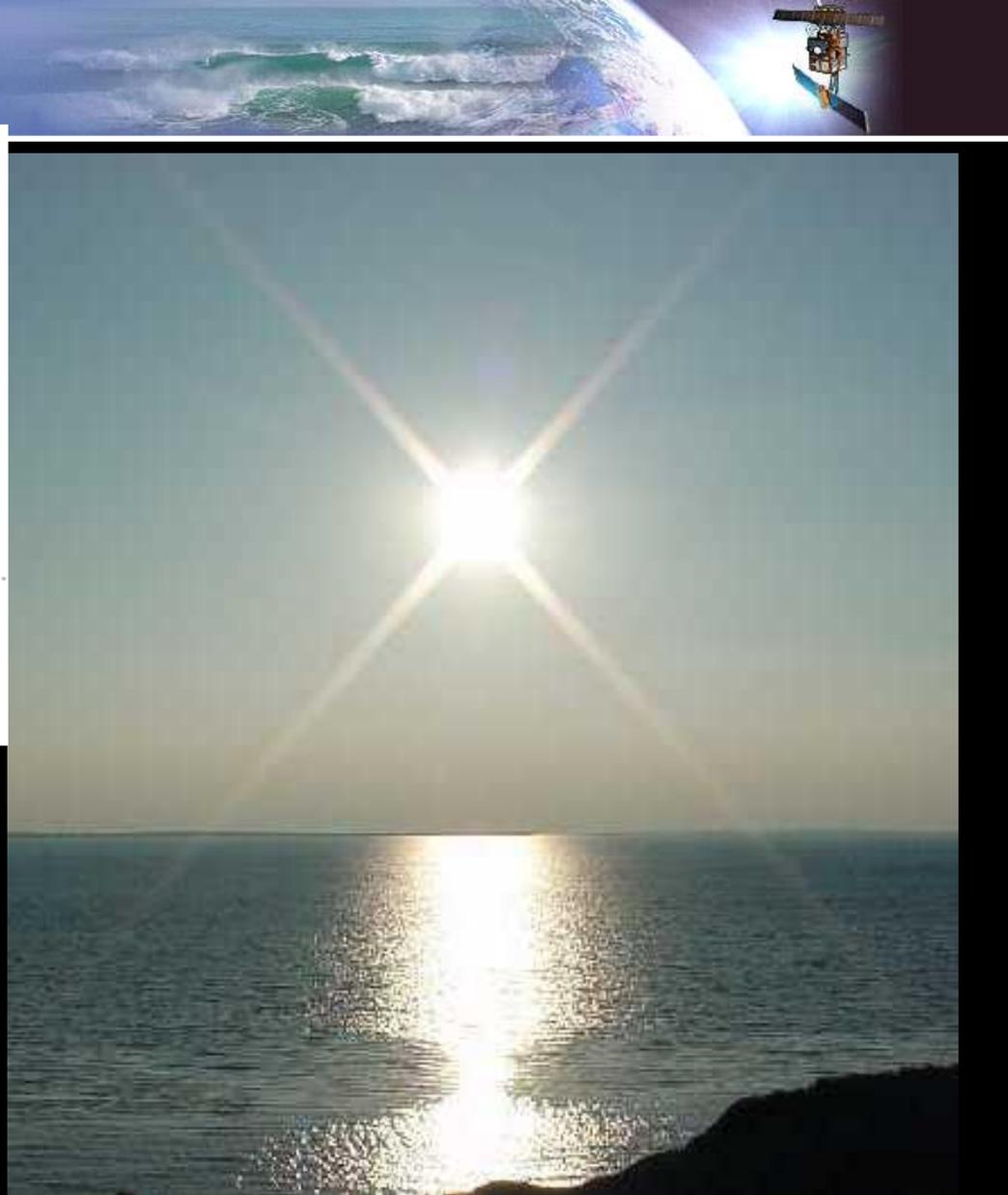
L'équation en question est:

$$\frac{a^2}{a^2 + x^2 + y^2} + \frac{2 \cos. Z a}{\sqrt{a^2 + x^2 + y^2}} + \cos.^2 Z = \frac{2 \cos.^2 J + 2 \cos.^2 J . a . \cos. Z}{\sqrt{a^2 + x^2 + y^2}} - \frac{2 \cos. J \sin. Z . x}{\sqrt{a^2 + x^2 + y^2}}$$

Par la quatrième observation.

$$A^2 = \frac{.0000013 + .0005593 + .0585262}{2 + .0005593 - 1 . 9281164} = \frac{.0590868}{.0724429}$$

De-là,  $\log. A = 1.95574725 = \log. \cosin. \text{ de } 25^\circ 26'$



## Measurement of the Roughness of the Sea Surface from Photographs of the Sun's Glitter

CHARLES COX AND WALTER MUNK  
*Scripps Institution of Oceanography,\* La Jolla, California*  
 (Received April 28, 1954)

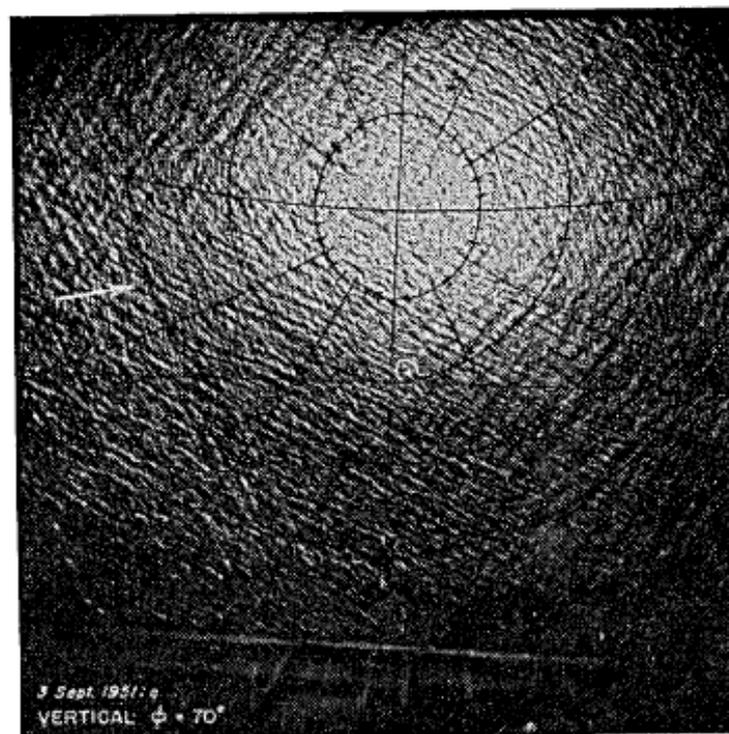
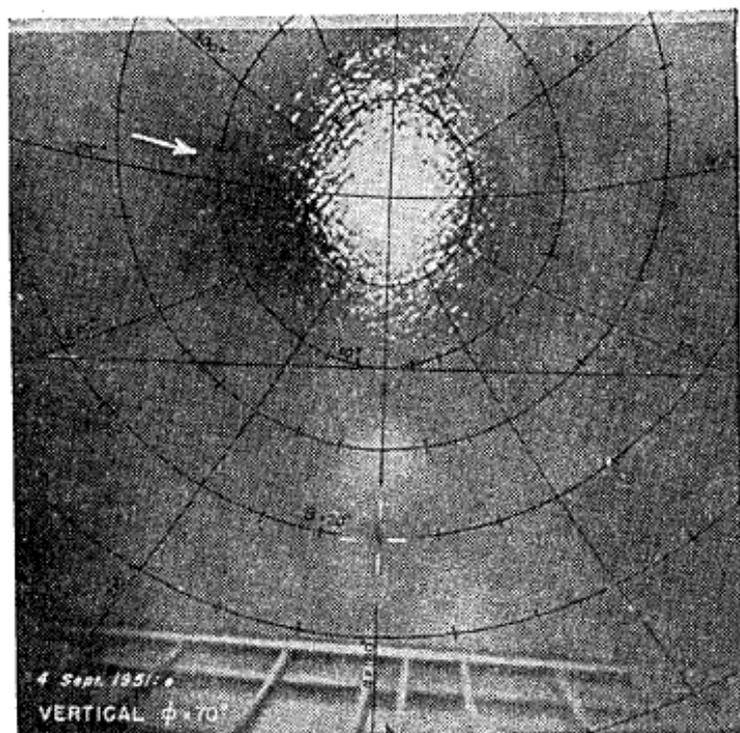


FIG. 1. Glitter patterns photographed by aerial camera pointing vertically downward at solar elevation of  $\phi=70^\circ$ . The superimposed grids consist of lines of constant slope azimuth  $\alpha$  (radial) drawn for every  $30^\circ$ , and of constant tilt  $\beta$  (closed) for every  $5^\circ$ . Grids have been translated and rotated to allow for roll, pitch, and yaw of plane. Shadow of plane can barely be seen along  $\alpha=180^\circ$  within white cross. White arrow shows wind direction. *Left*: water surface covered by natural slick, wind  $1.8 \text{ m sec}^{-1}$ , rms tilt  $\sigma=0.0022$ . *Right*: clean surface, wind  $8.6 \text{ m sec}^{-1}$ ,  $\sigma=0.045$ . The vessel *Reverie* is within white circle.

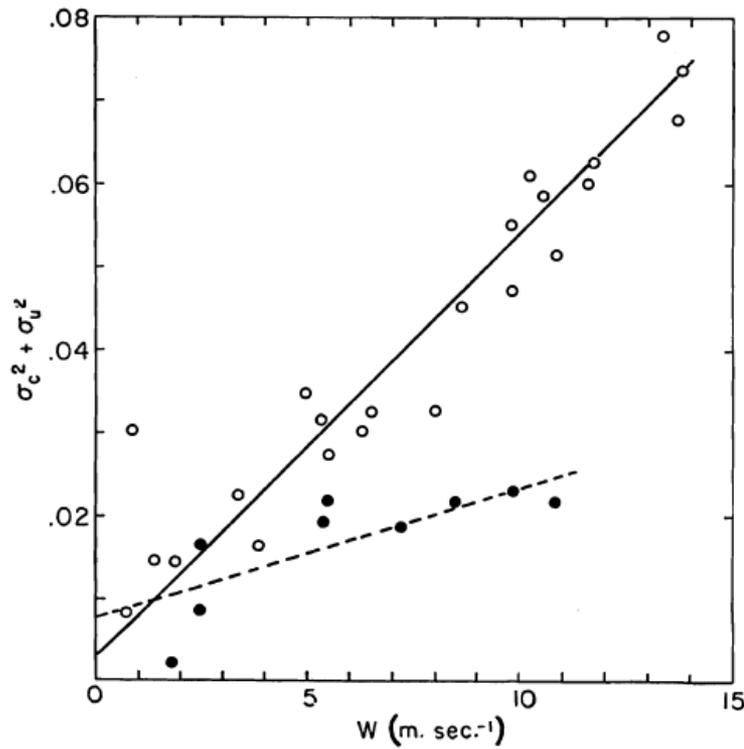
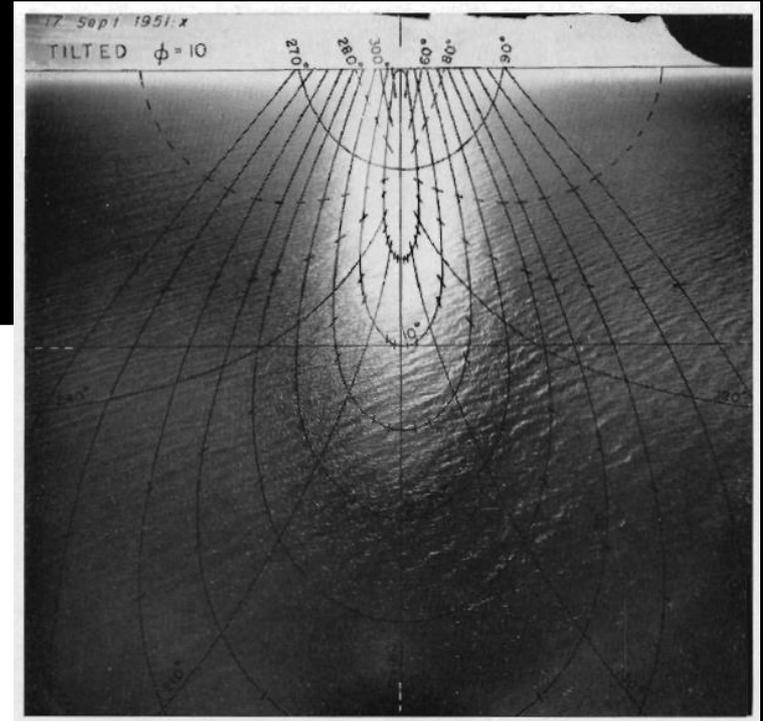
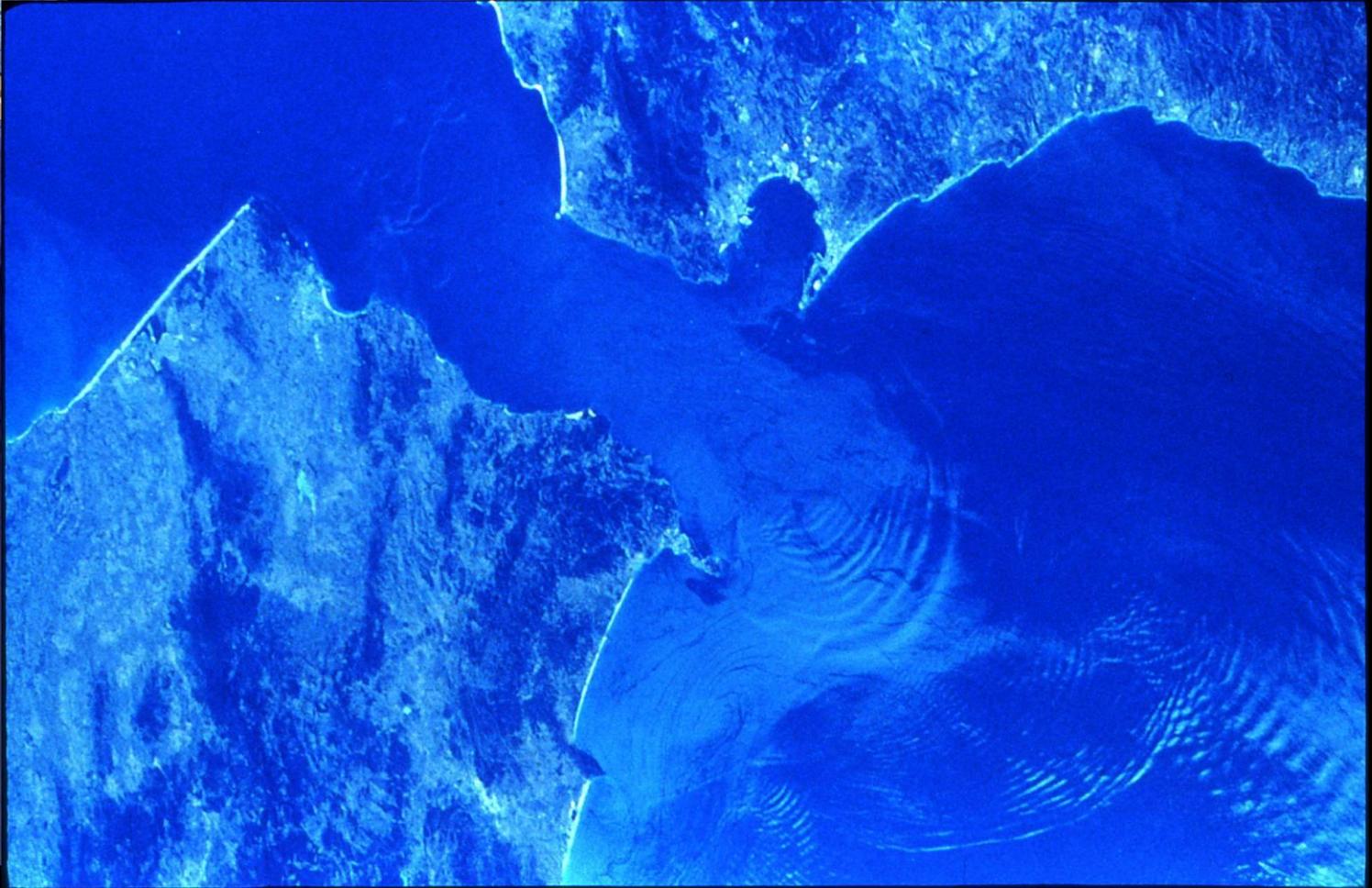


Fig. 13. Mean square slope components and their sum as functions of the wind speed  $W$  measured 41 ft. above sea level. The plot includes all analyzed data for clean sea surfaces (open circles) and slick surfaces (solid circles). Continuous lines are regression lines for clean surfaces; dashed lines for slick surfaces.



*Paul Desmond Scully-Power*  
*NASA's astronaut*



# *Gulf Stream roughness changes*



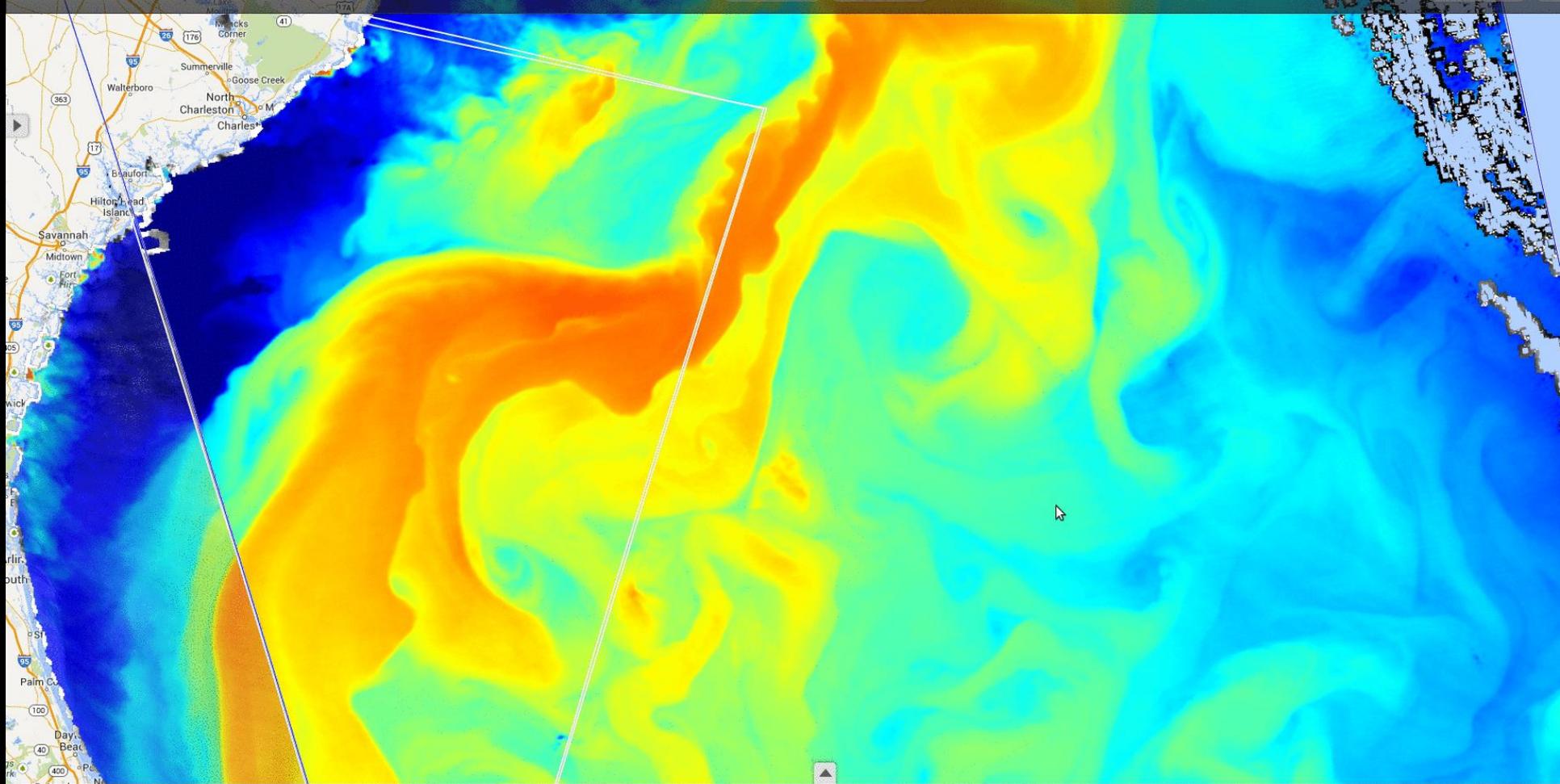
Datasets

Hotspots

Permalink

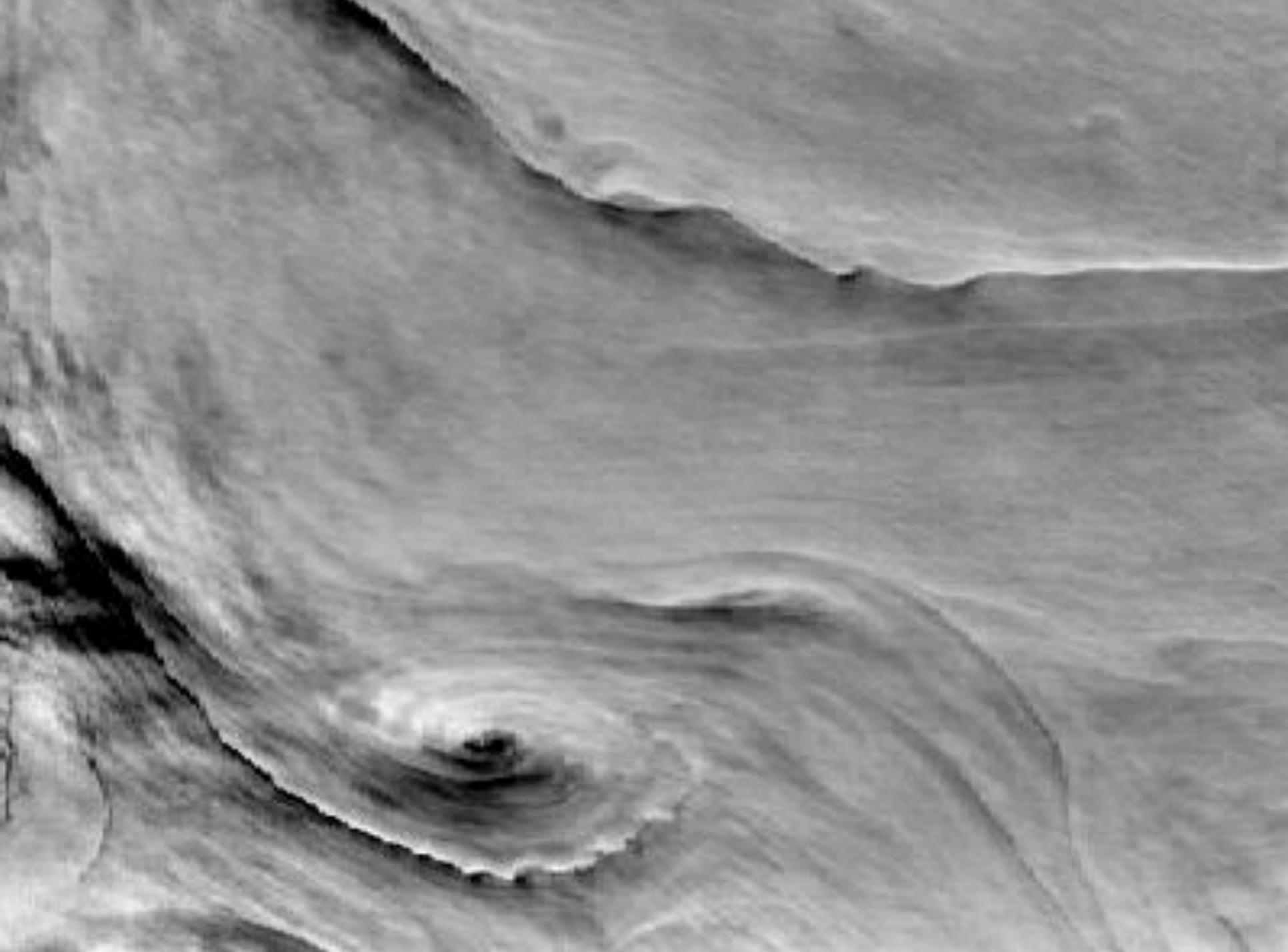
i

# SynTool Web "OCEANDATALAB"



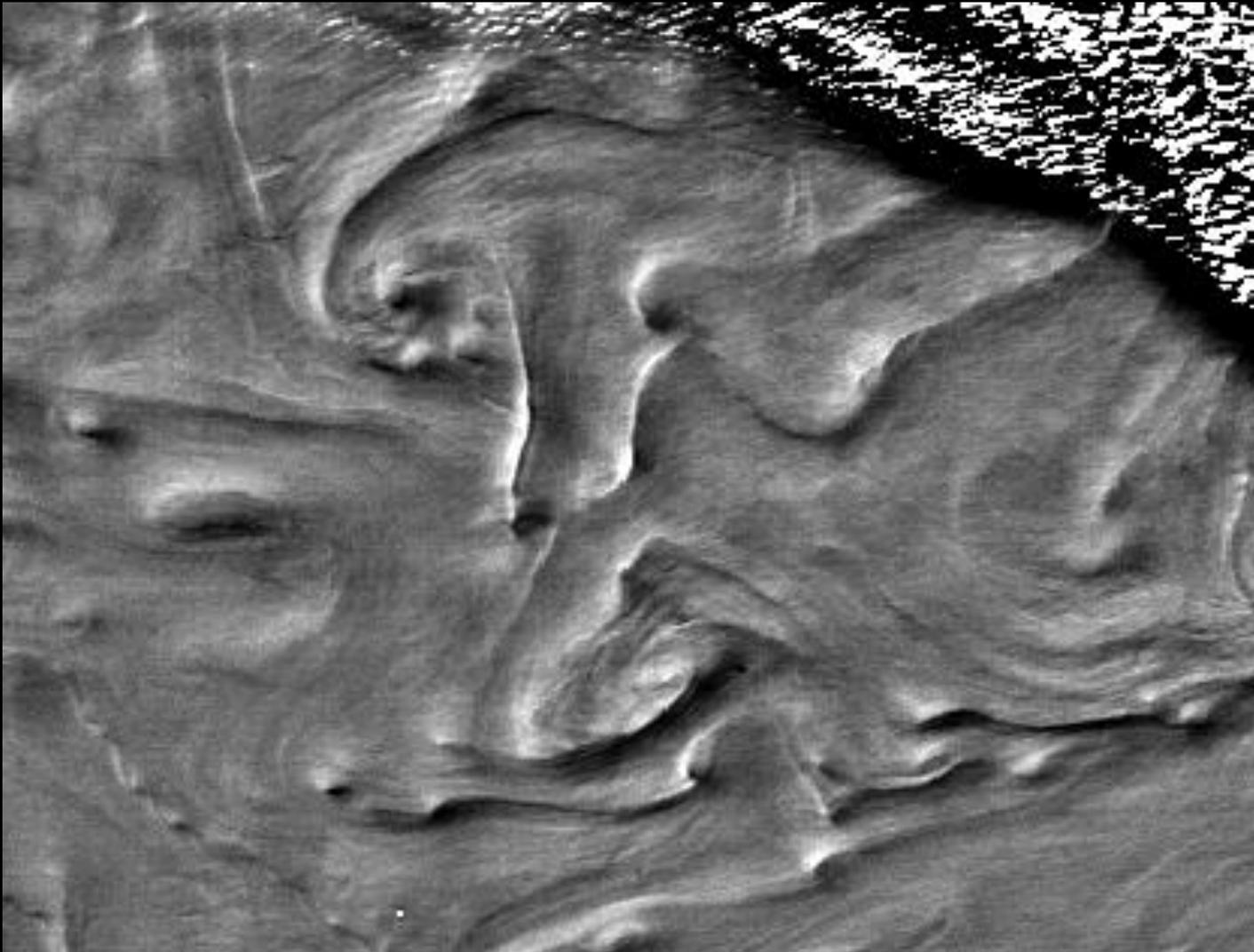
1x Daily 3-Day Weekly 100.0% datasets shown (4/4) MYD02QKM.A2010091.1805 from SST MODIS denoised (NASA, OceanDataLab)

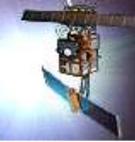
2005 2006 2007 2008 2009 2010 2011 2012  
February March April May June July August September October November



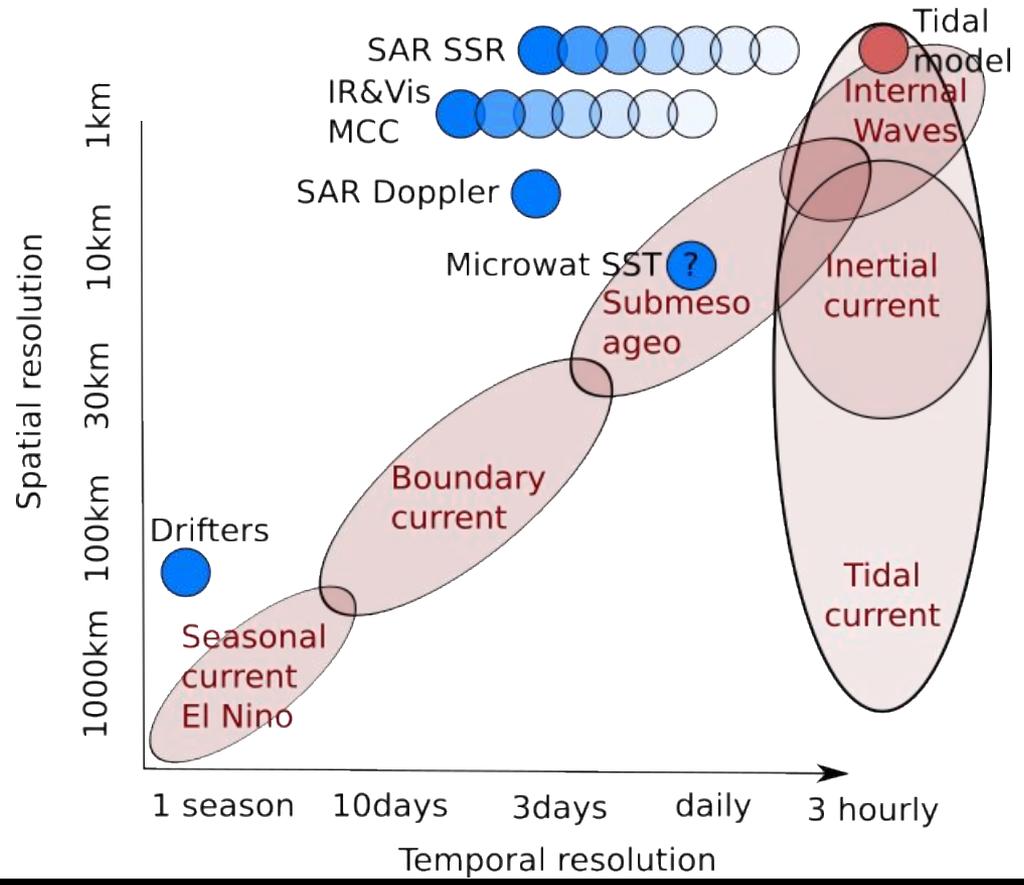


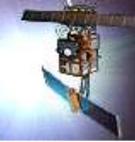
## *Miso Turbulence (Mediterranean Sea) : pearl-necklace evidences*



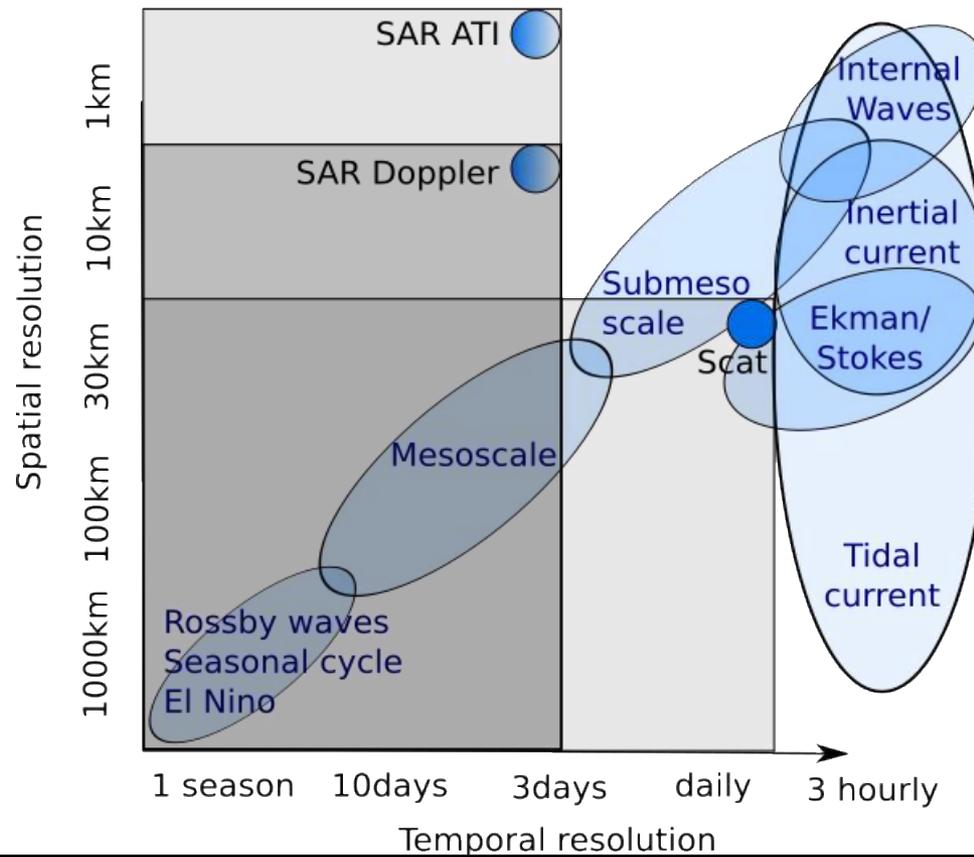


## Upper ocean ageostrophic current monitoring





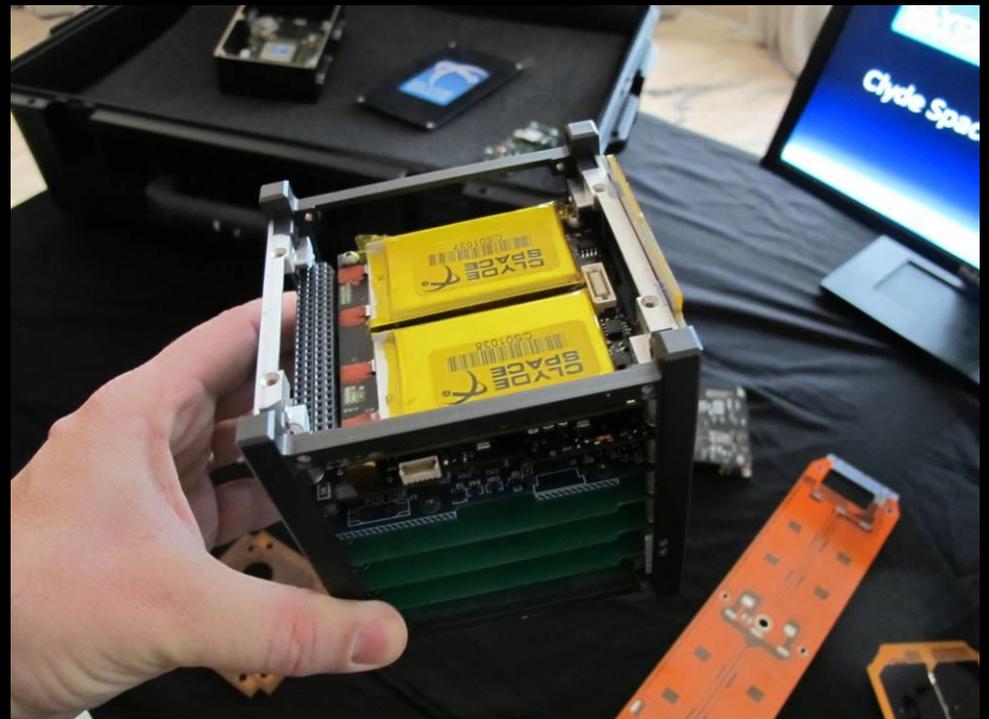
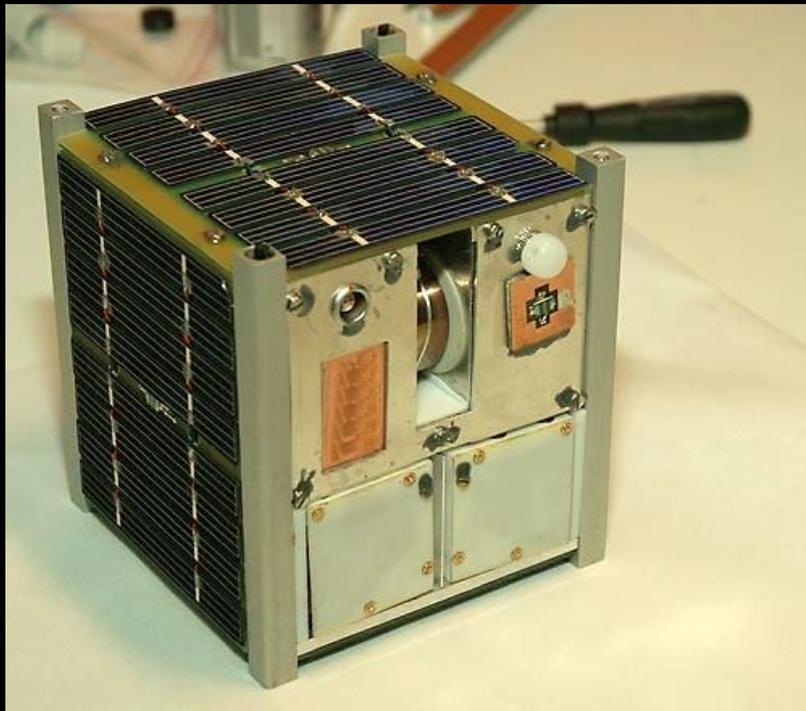
## Total ocean surface current monitoring





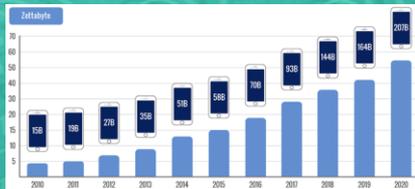
## *New Era - Nanosatellites - CubeSat*

A **CubeSat** is a type of miniaturized satellite for space research that usually has a volume of exactly 10 cm cube, and mass of no more than 1.33 kilograms.



# Big Data & AI/Data Science

Data



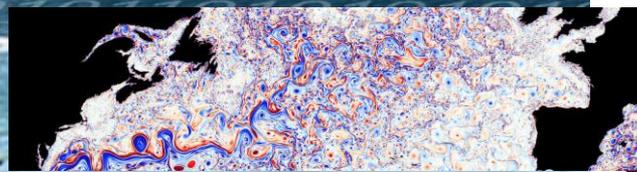
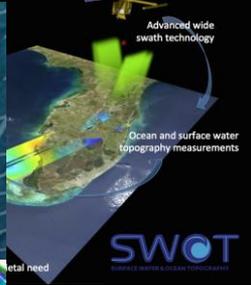
Big data infrastructure



DL/AI



# Deep Learning





# *Numerous questions and challenges*

Some of *the Living Planet Challenges* to better assess the existing pressures on the marine environment (e.g. overfishing, pollution, habitat destruction, ...) potentially leading to increased risks to global food security, economic prosperity, ...

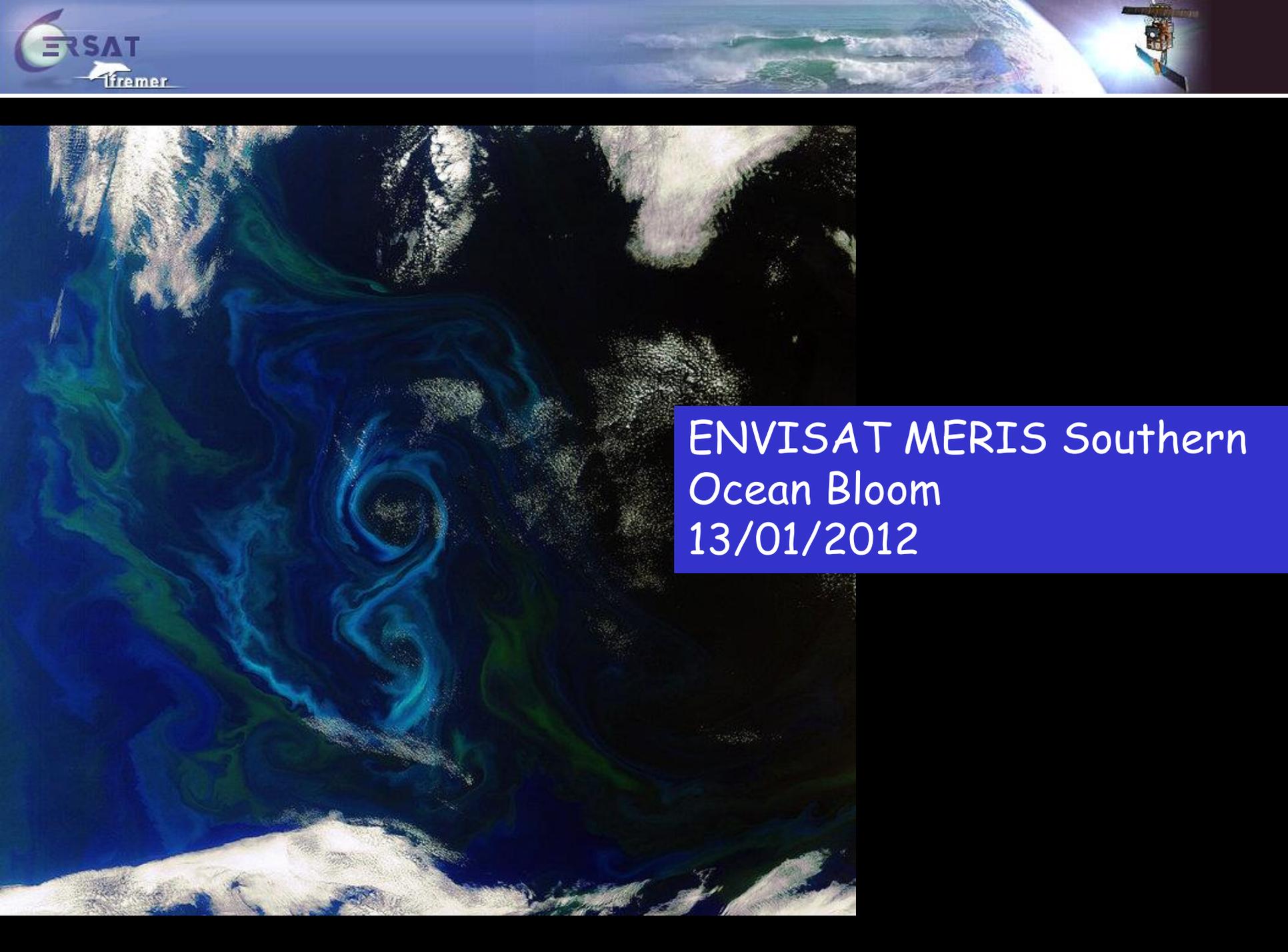
*Evolution of coastal ocean systems including the interactions with land in response to natural and human-induced environmental perturbations*

*Mesoscale and submesoscale circulation and the role of the vertical ocean pump and its impact on energy transport and biogeochemical cycles*

*Response of the marine ecosystem and associated ecosystem services to natural and anthropogenic changes,*

*Physical and biogeochemical air/sea interaction processes on different spatio-temporal scales and their fundamental role in weather and climate*

*Sea level changes from global to coastal scales and from days (e.g. storm surges) to centuries (e.g. climate change)*



ENVISAT MERIS Southern  
Ocean Bloom  
13/01/2012



## *Numerous questions and challenges :*

*How can we map the distribution of marine plastic Debris?*

*Has the Agulhas current strengthened in the last 5 years?*

*Is the surface circulation of the Black Sea and in the Mediterranean Sea stable?*

*How is the Arctic Ocean changing ?*

*How is marine biodiversity changing, locally, regionally, globally ?*

*What is the extent of ocean acidification ?*

*Are western boundary currents changing, the Gulf Stream ?*

*How can ship routing be optimised ?*

*Why and where is regional sea level changing?*

*How are our coastal regions changing?*

*How can we map estuary systems from space?*

Most observations are not yet sufficiently explored and used, limited to 'low-hanging fruits', and necessity to better optimize analysis to reveal multi-scale dynamics

- ... Synergy between high and medium resolution observations to reveal mean states and trends, near-surface ocean-atmosphere dynamics, local and non-local interactions, convergence/divergence surface fronts and numerous roughness contrasts

Atmospheric and Oceanic observations generally produce high quality data, but it is often too sparse (many gaps where information is missing, and/or often too local in both space and time)

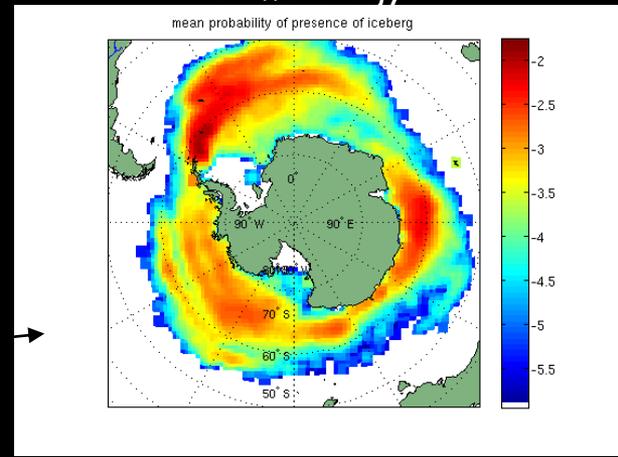
How can we use observed data in combination with the physical knowledge of stochastic processes in nonlinear dynamical systems to estimate and model those effects on the variability of computationally resolvable scales of motion that are caused by the small, rapid, unresolvable scales of fluid motion that upscaling in data assimilation leaves out?



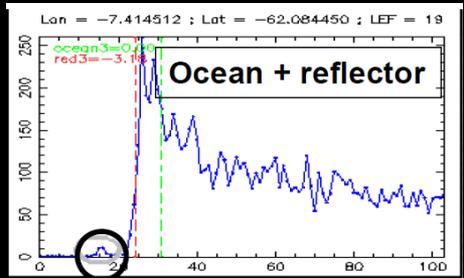
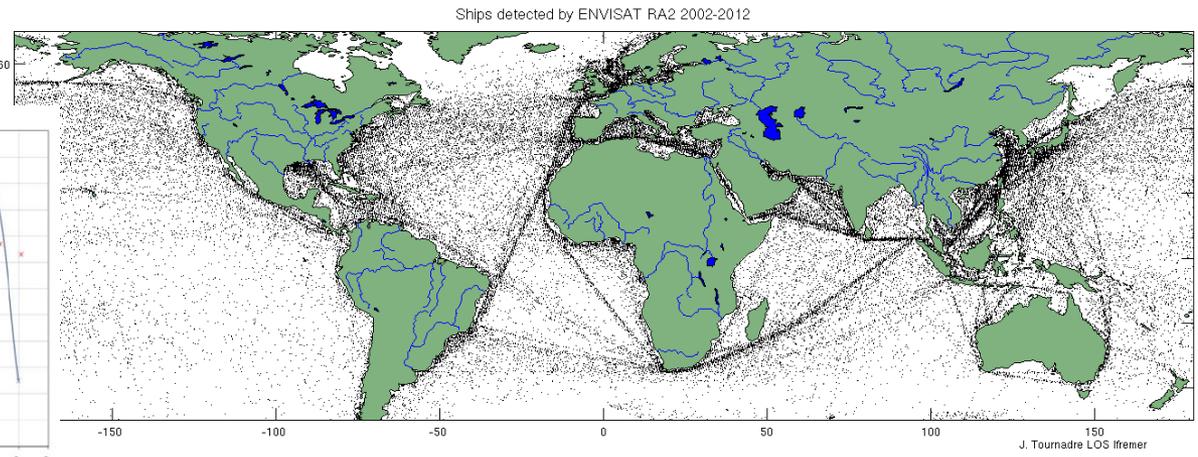
Analysis of altimeter wave forms :  
ERS 1 & 2, Envisat, Jason 1 & 2, Cryosat, AltiKa (12 TB)

Disposing of a sandbox with permanent access to all data and processing power greatly ease bridging the gap between initial idea and full demonstration / long term assessment

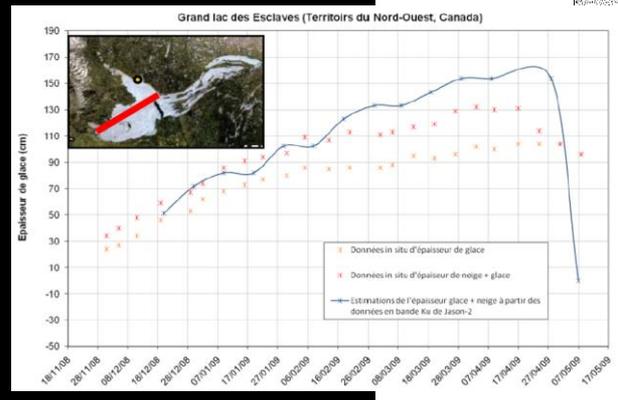
## Iceberg detection & climatology



## Ship detection

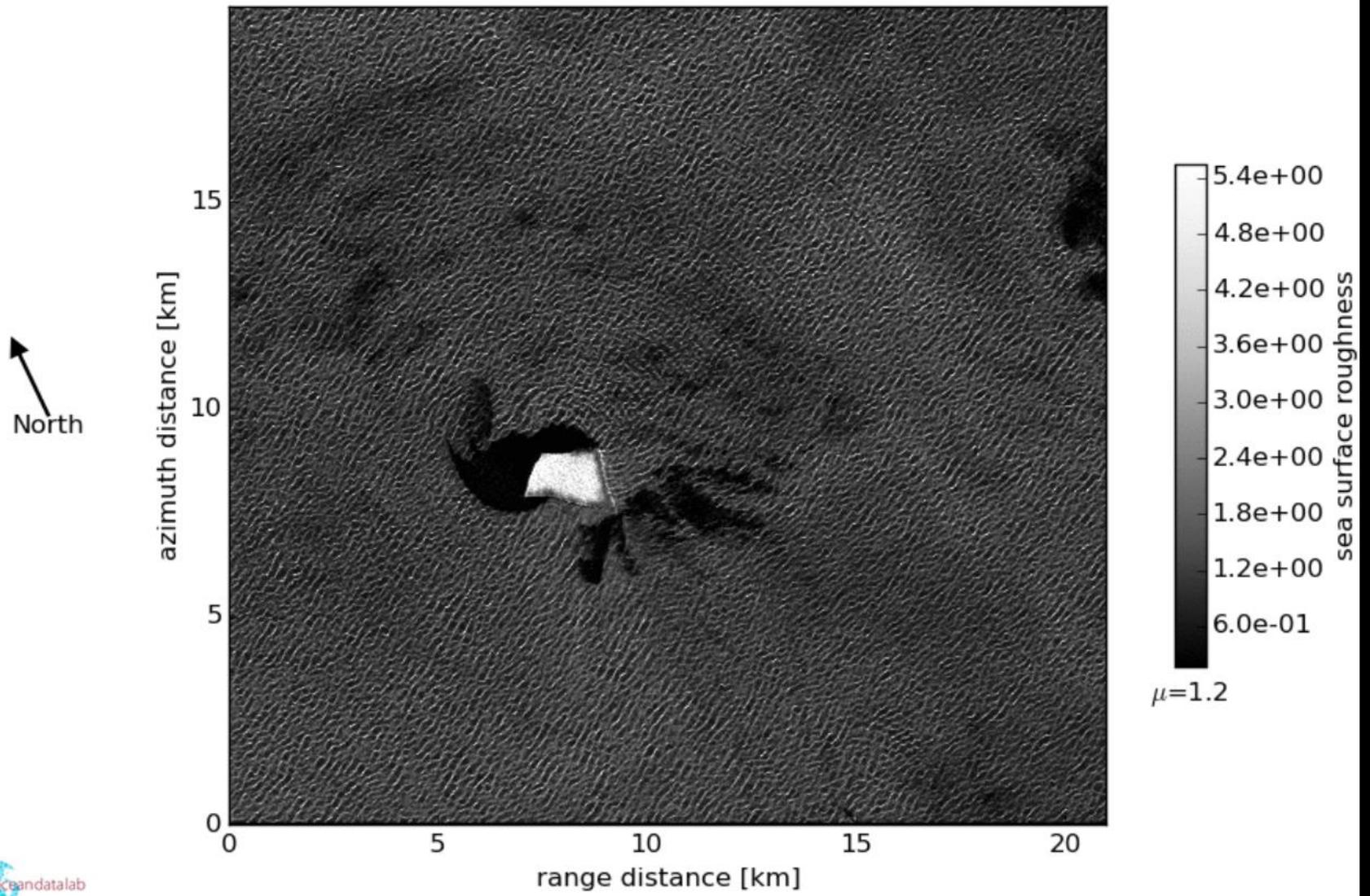


## Lake ice thickness





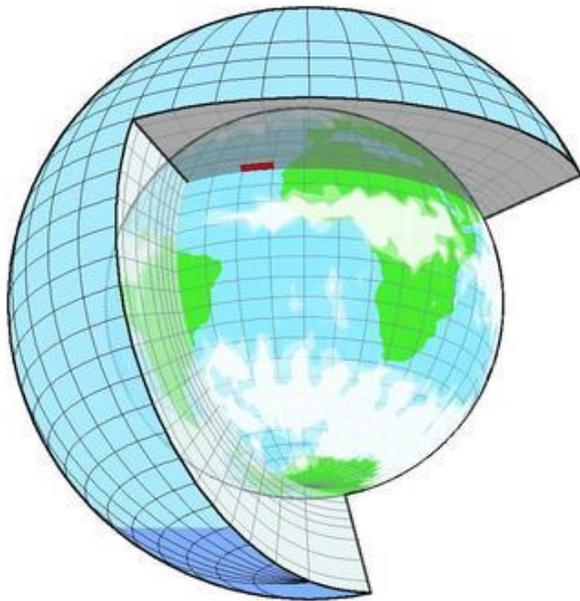
#038 / lon=-101.73 / lat=-67.51 / inc=35.77



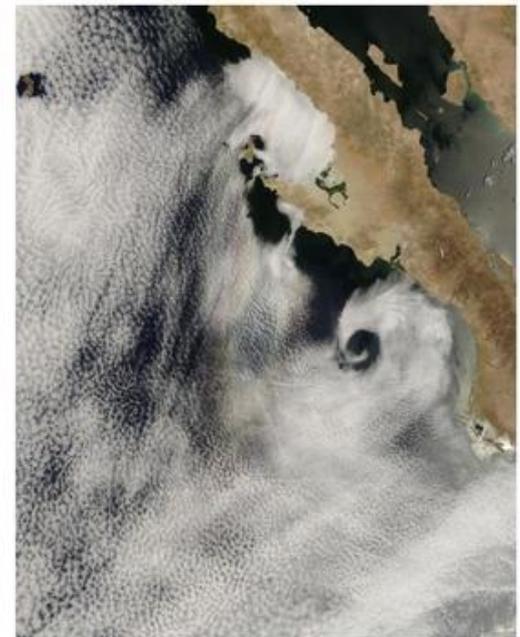


## Climate models are too coarse to resolve clouds

---

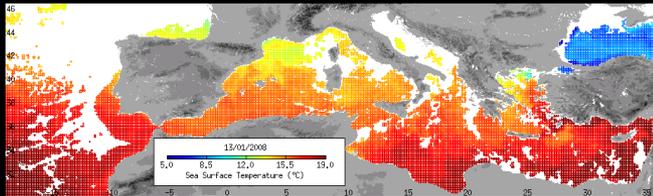


Global model:  
~100 km resolution

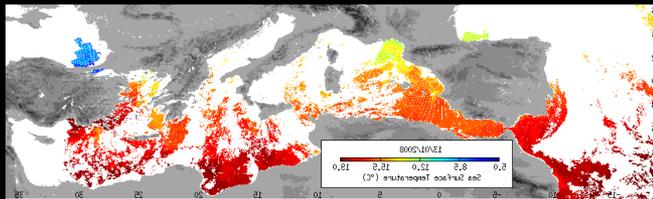


Cloud scales: ~10-100 m

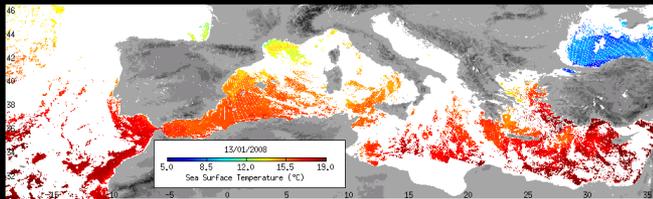
# SST



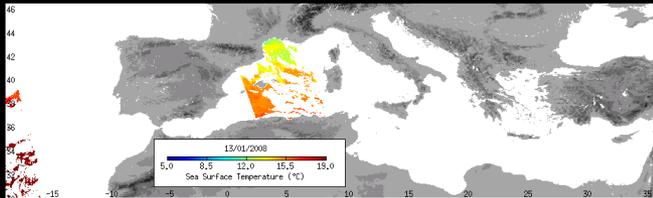
MSG/SEVIRI (10km, 3 heures)



SAF O&SI NAR pour AVHRR17 (2km, 2 passes/jour)



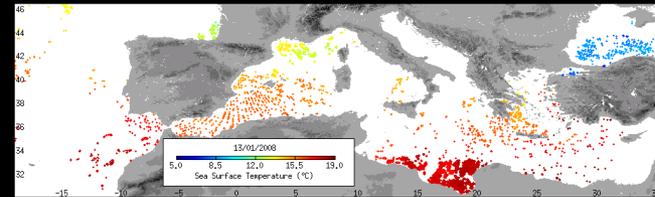
SAF O&SI NAR18 pour AVHRR17 (2km, 2 passes/jour)



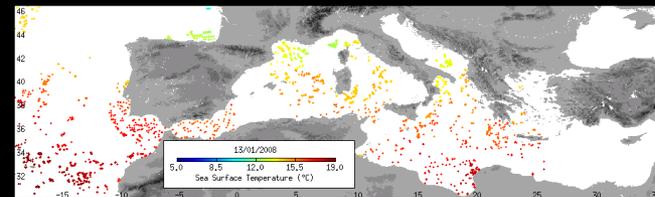
AT



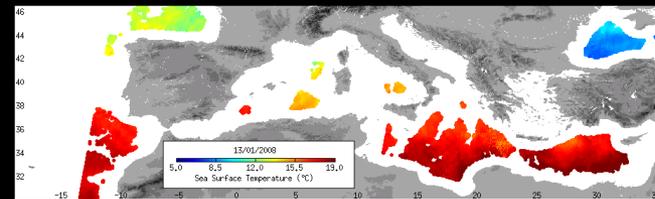
1 jour



Avhrr 18



Avhrr 17



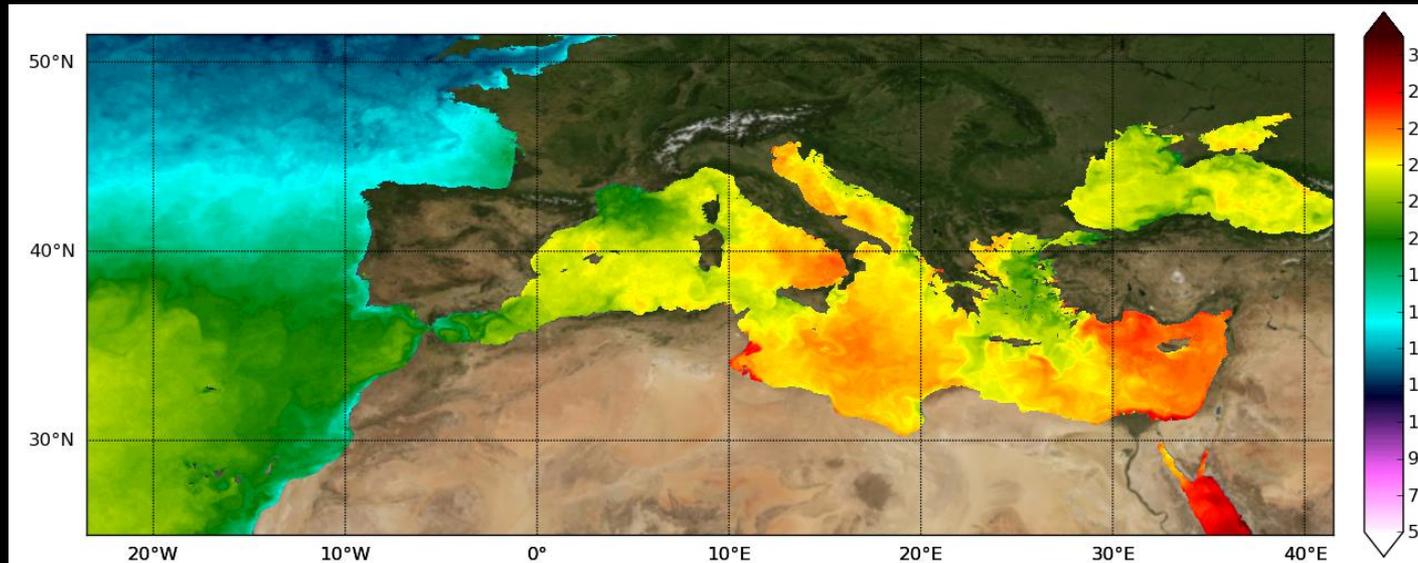
ENVISAT/AATSR (1 km, 14-15 orbites/jour)



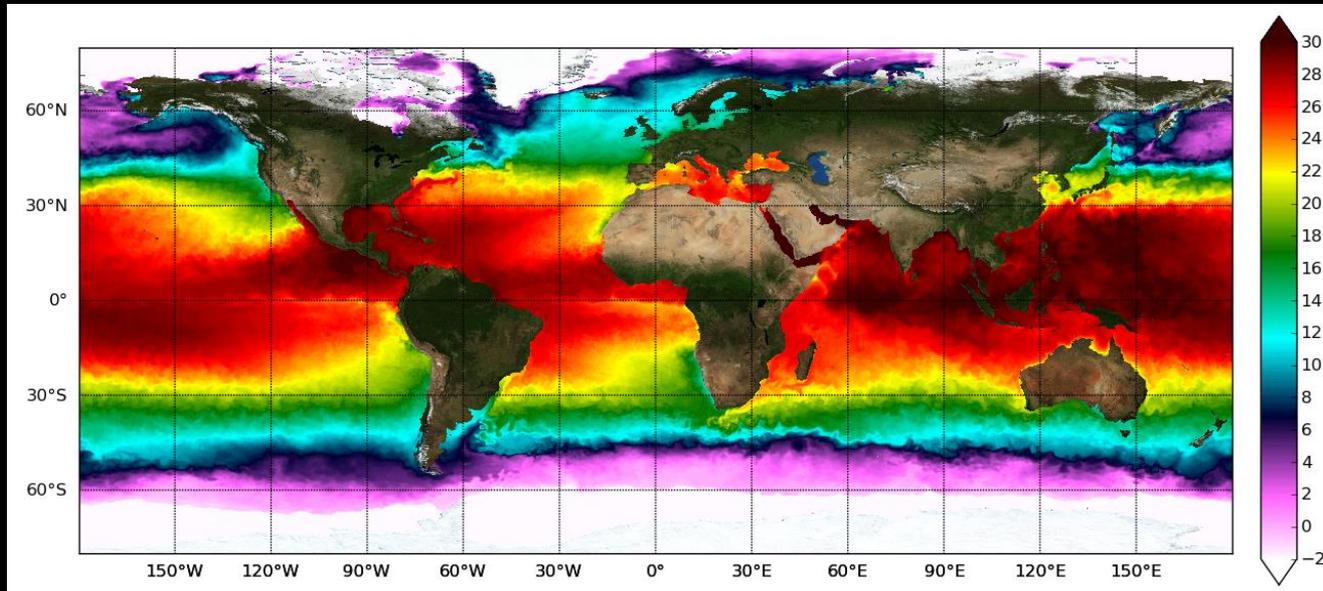
Multi-satellite product

# Sea surface temperature

High resolution daily product 2006-present, 2 km resolution



# Global SST

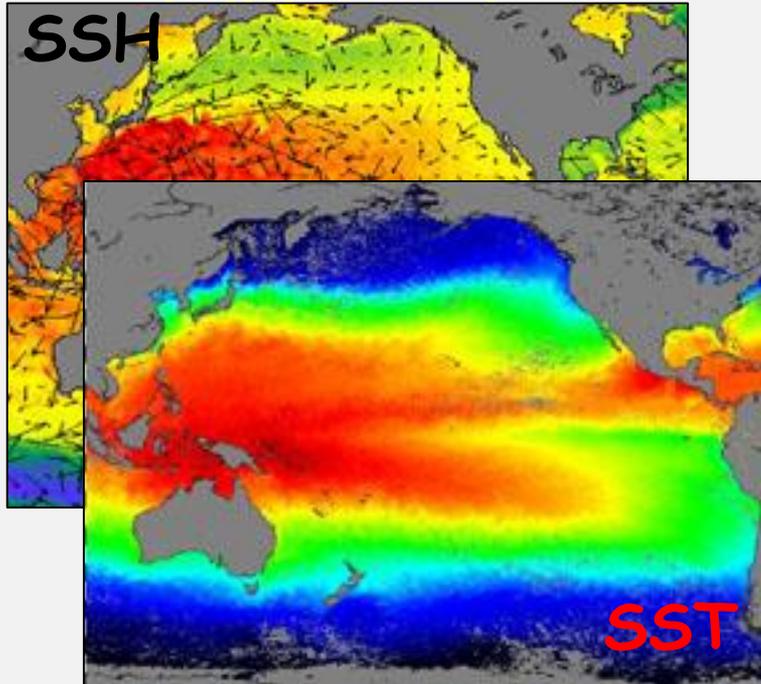


Global reanalysis 2006-present  
at 10 km resolution

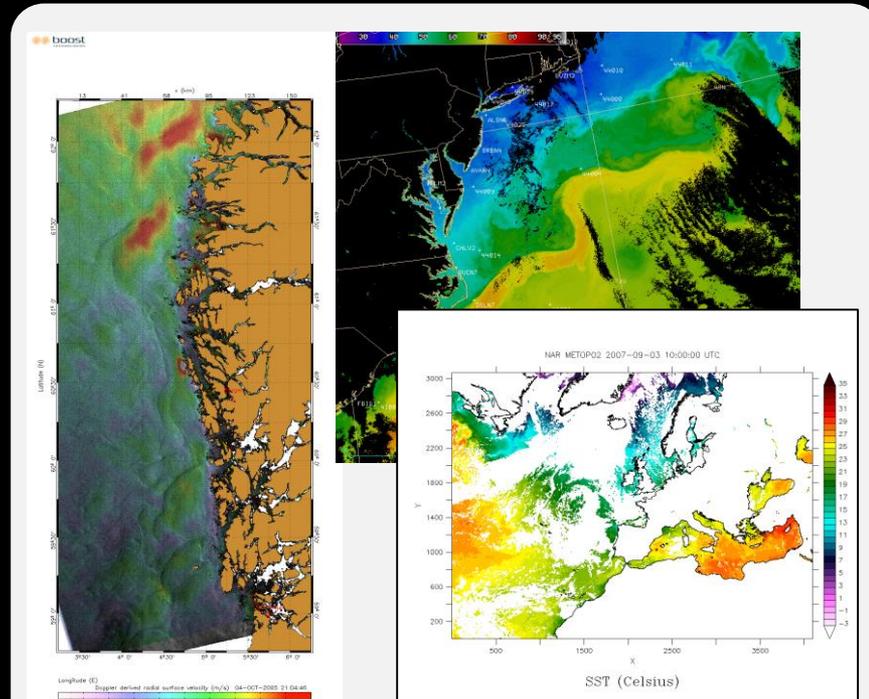


# High-resolution satellite ocean sensing

From low-resolution ..... to high-resolution



Low-resolution: ~25km ( $0.25^\circ$ ) eg, Altimetry (SSH), Radiometer (SST)



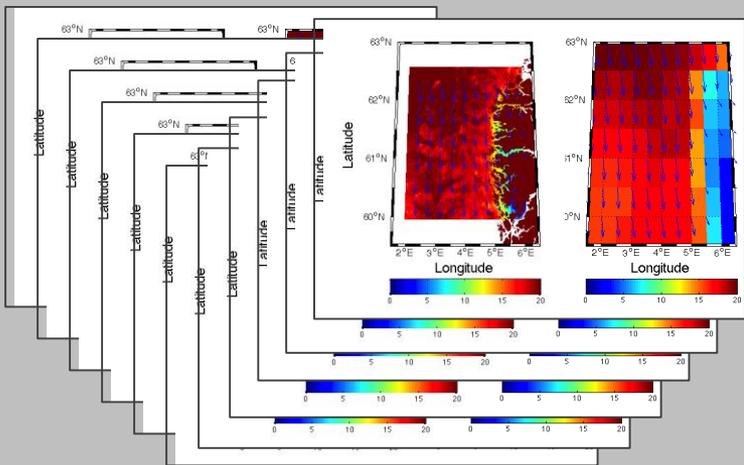
High-resolution: 1-4km ( $0.01^\circ$ ) or < 1km SAR, Infrared (SST), Ocean Colour

## Key issue

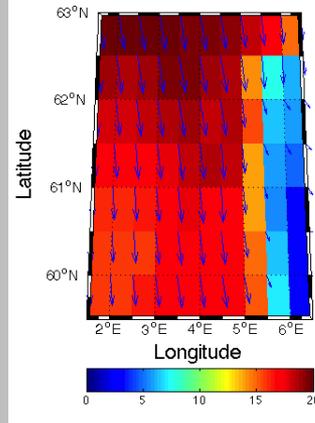
How to deliver daily high-resolution geophysical field at regional/global scale from the the irregular space-time sampling of high-resolution sensors

# Emulating the OCEAN at high-resolution from multi-scale/multi-sensor databases

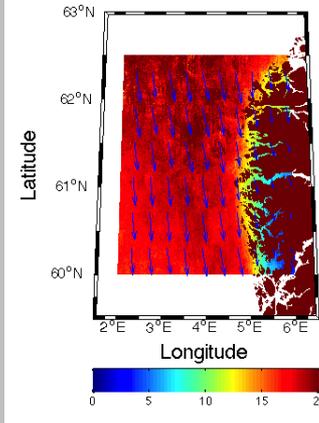
HR observations are irregularly sampled in space and time. But ... 1) low resolution observations are generally available and 2) we should learn a lot from past joint HR/LR observations.



Database of past LR/HR observations



New LR observation



New HR observation

Key objective: learning new multi-scale/multi-modal representations of ocean dynamics from multi-sensor remote sensing archives



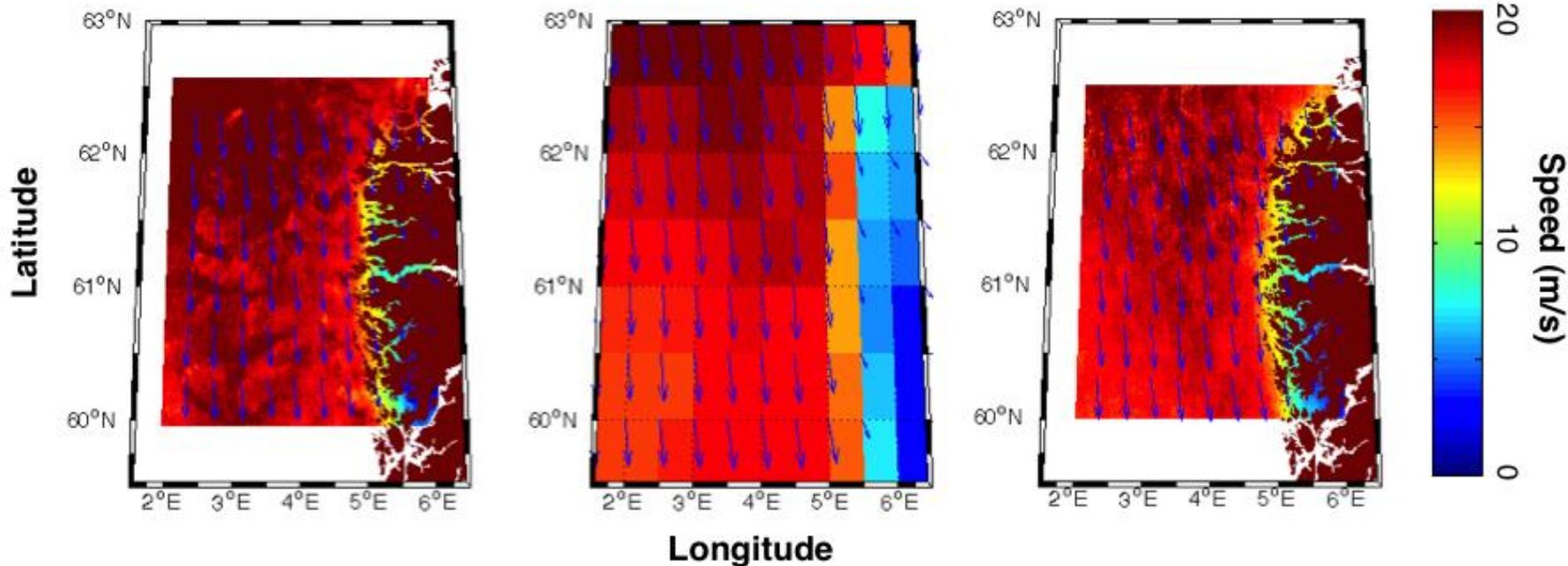
# Multi-scale/multi-modal representations of ocean dynamics from remote sensing archives

*Wind fields:*

SAR Data

ECMWF Model

HR Emulation

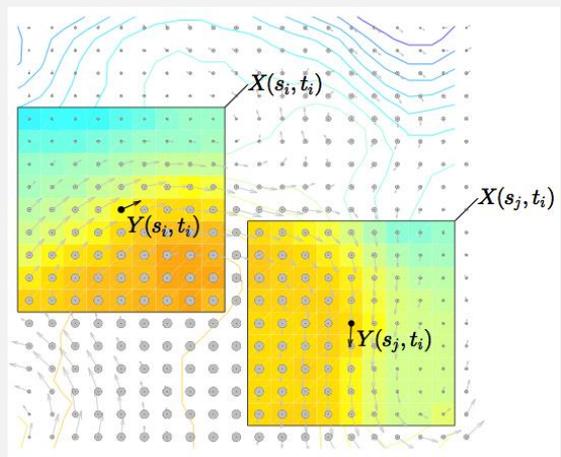


Learning ECMWF-to-SAR transfer functions  
for HR wind field emulation

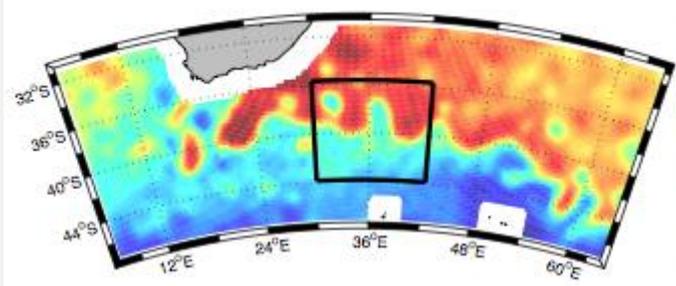


# Multi-scale/multi-modal representations of ocean dynamics from remote sensing archives

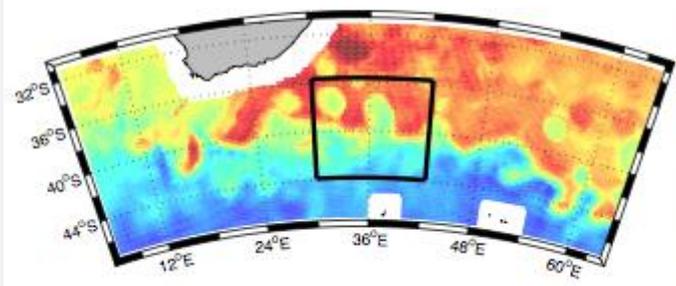
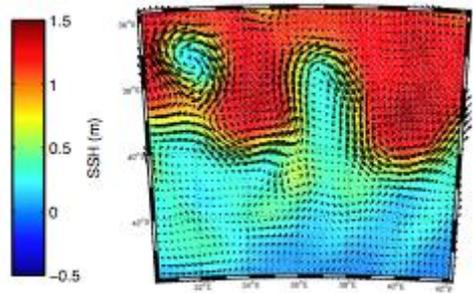
## Application to AMSR/SST-AVISO/SSH



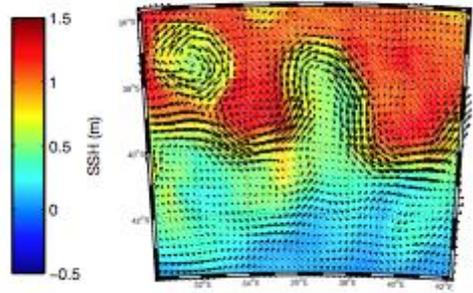
**SQG-like assumption:**  
 local relationships between local SST patches and sea surface currents  
 Learning from joint SST-SSH observations



(a) True MADT data



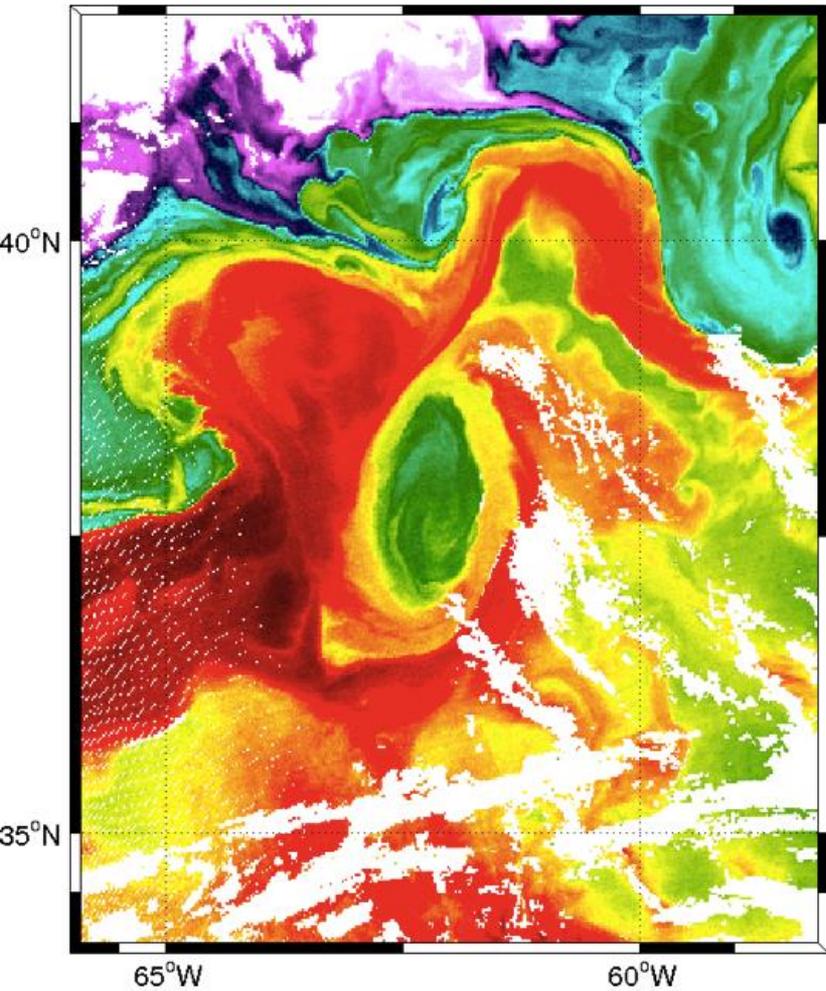
(b) Latent class regression



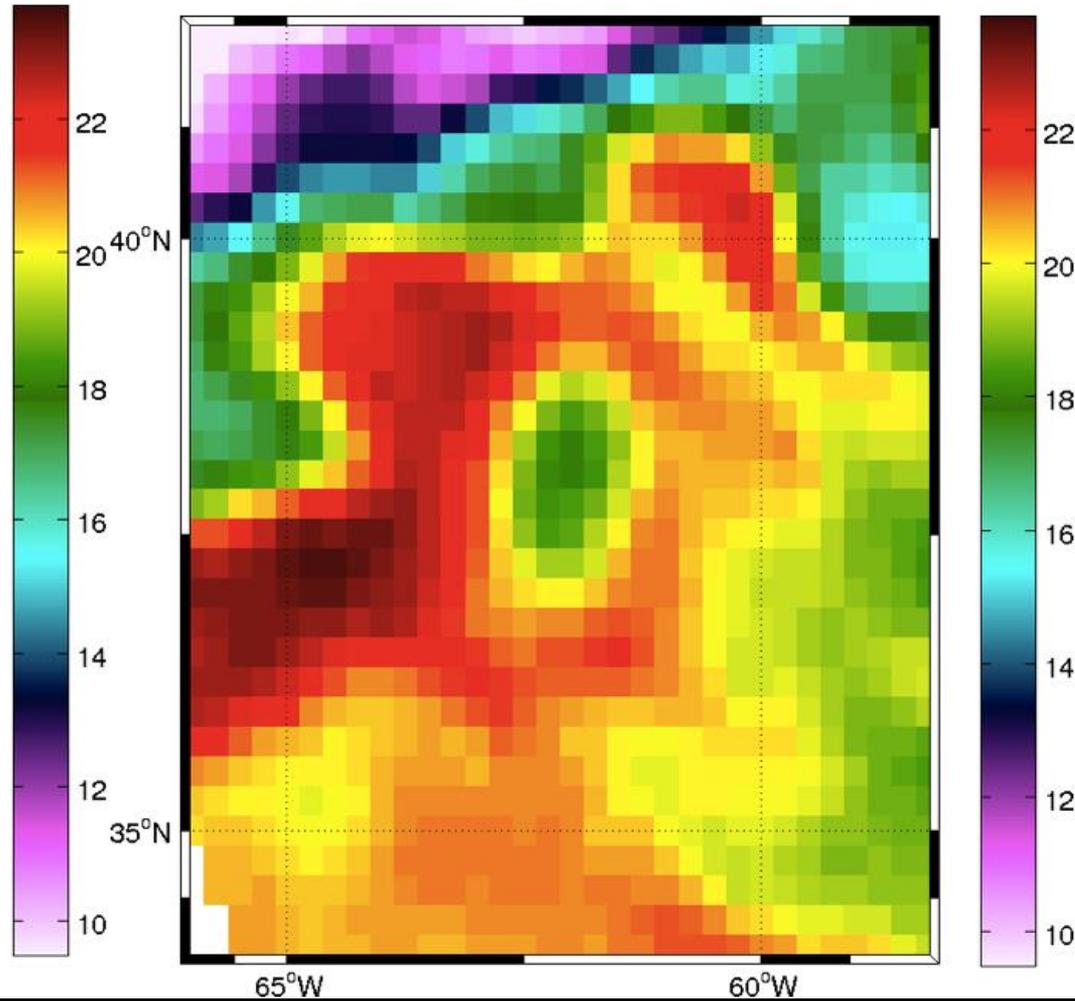
Towards high-resolution sea surface currents from a joint SST-SSH analysis



SST - Modis(L2P)

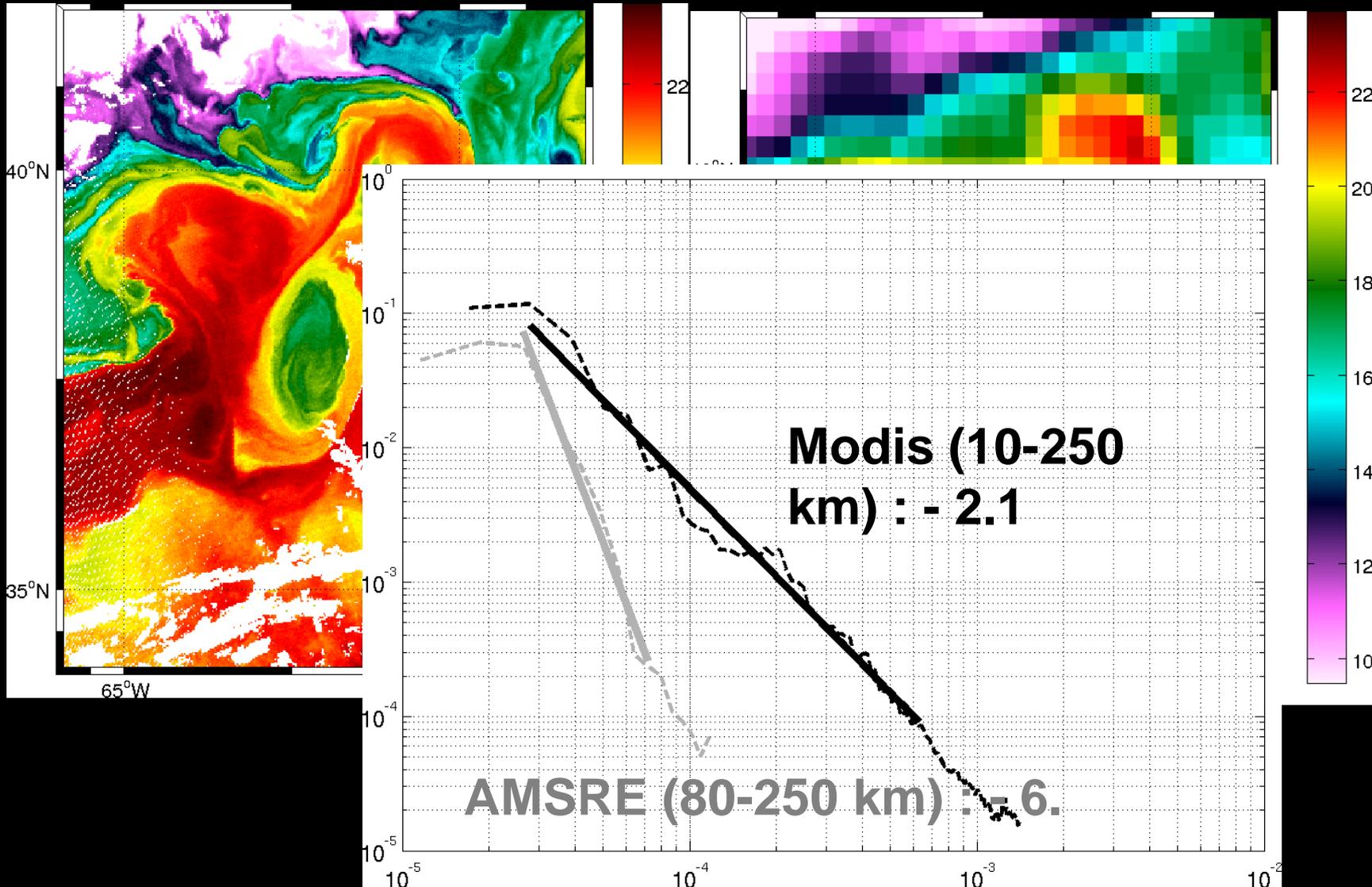


SST - AMSRE(L3)





# Characterizing the *submesoscale* - Spectral approach



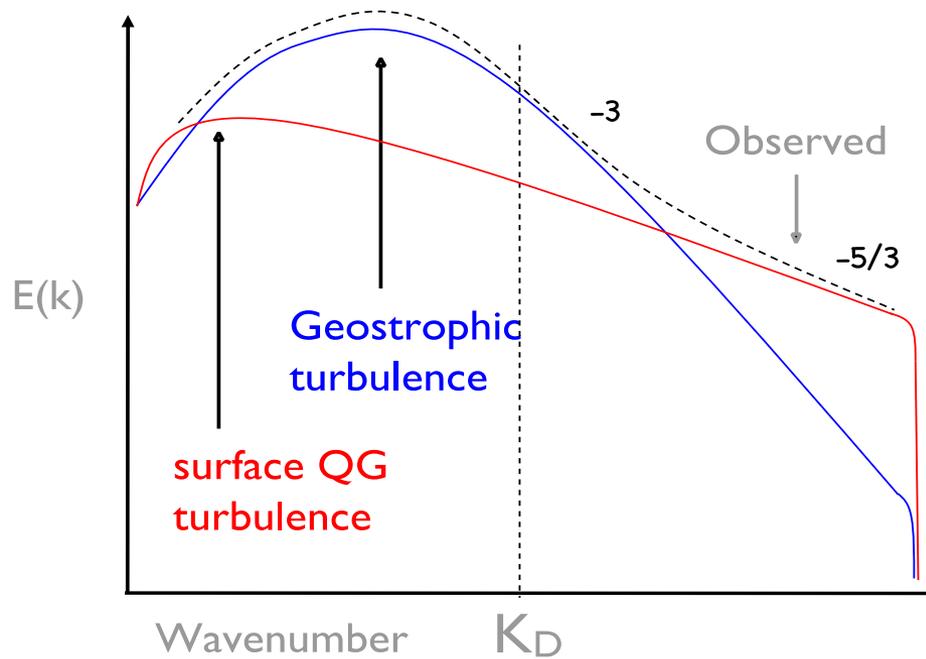
# Tracer mixing depends on KE spectrum

$E(k) \sim k^{-\alpha}$

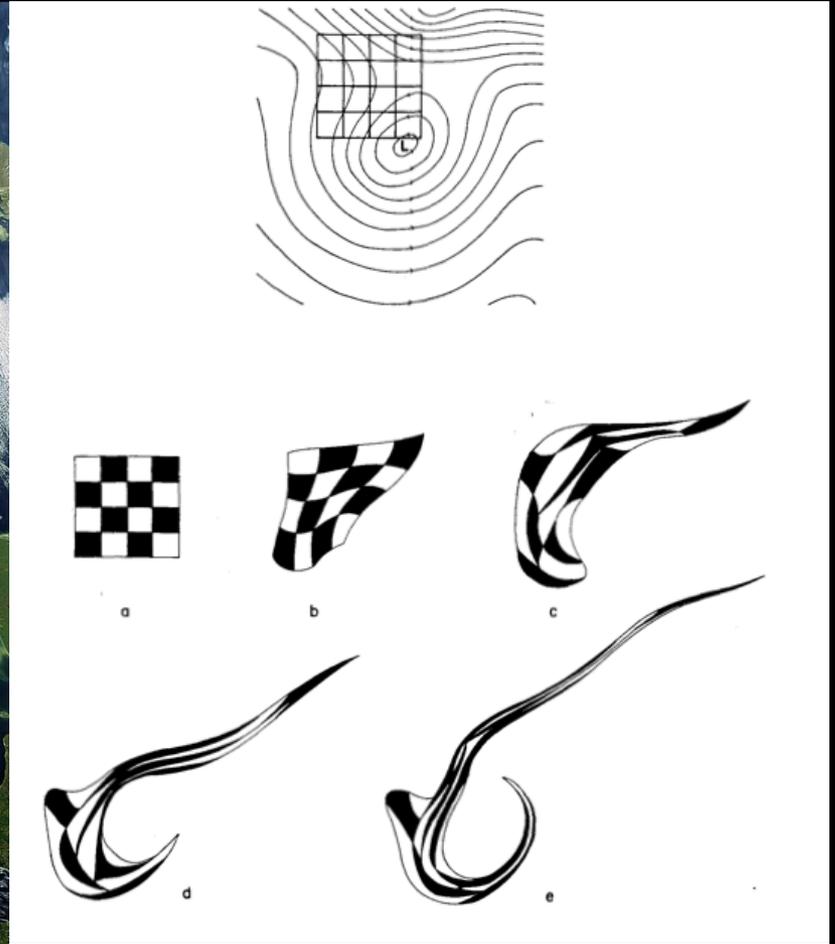
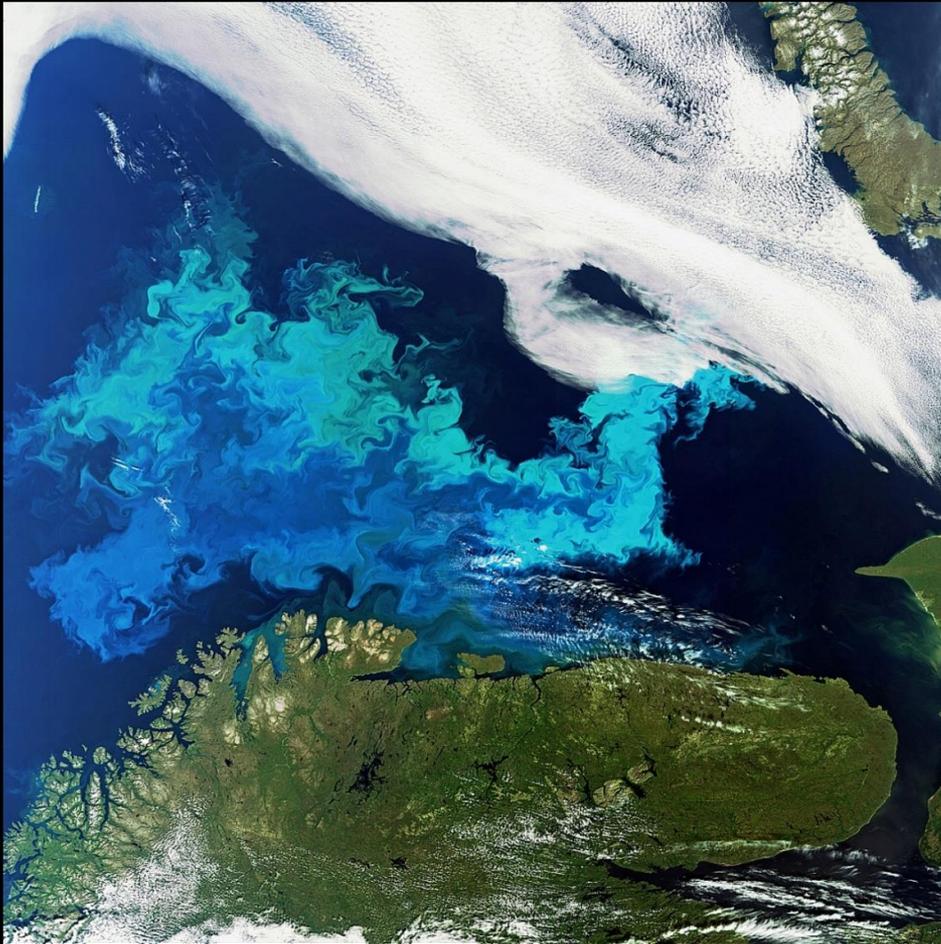
$\alpha > 3$  : spectrally nonlocal: stirring set by large scales

$\alpha < 3$  : spectrally local: stirring set by local scales

- Simple proxy model: surface quasigeostrophic turbulence
- Dynamics driven by surface density anomalies (zero interior PV)

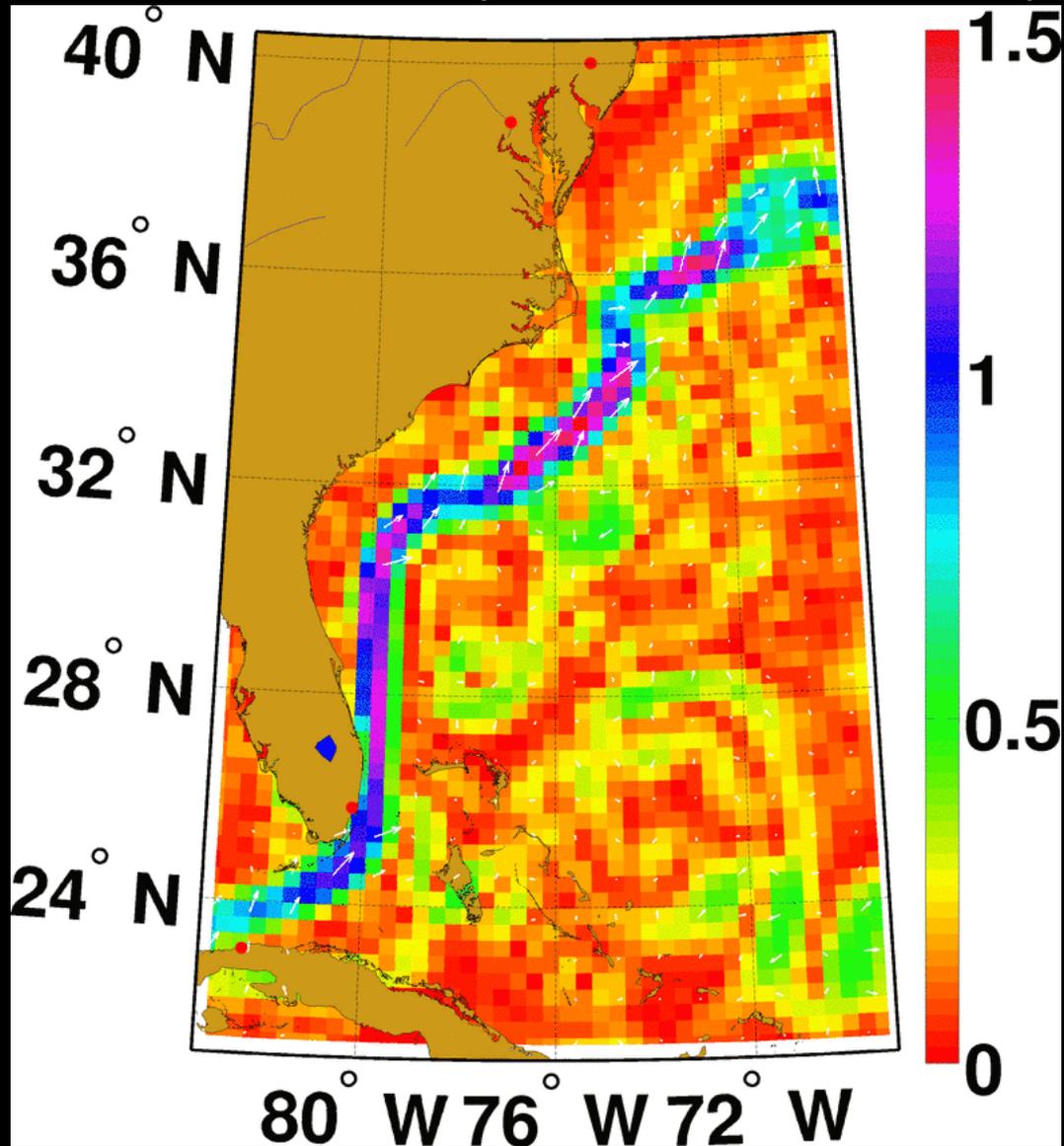


# Stirring and mixing : interplay and scale interactions



31 Mar/07 Apr (2010)

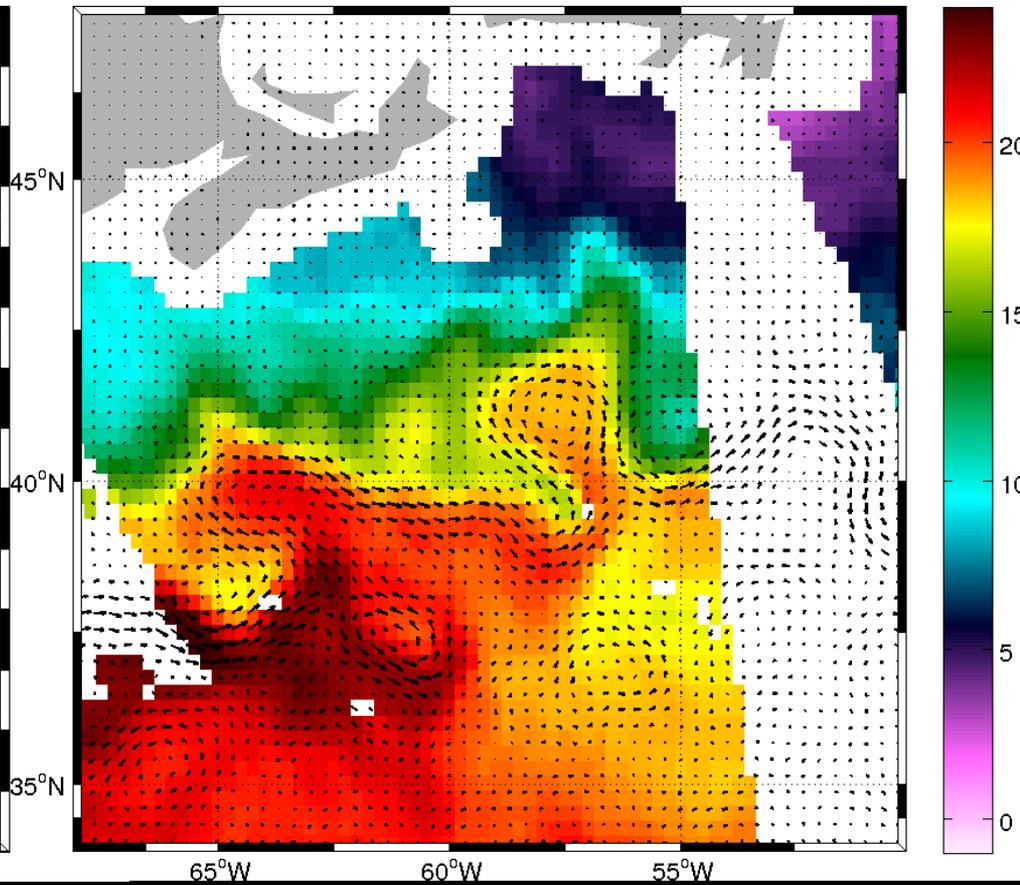
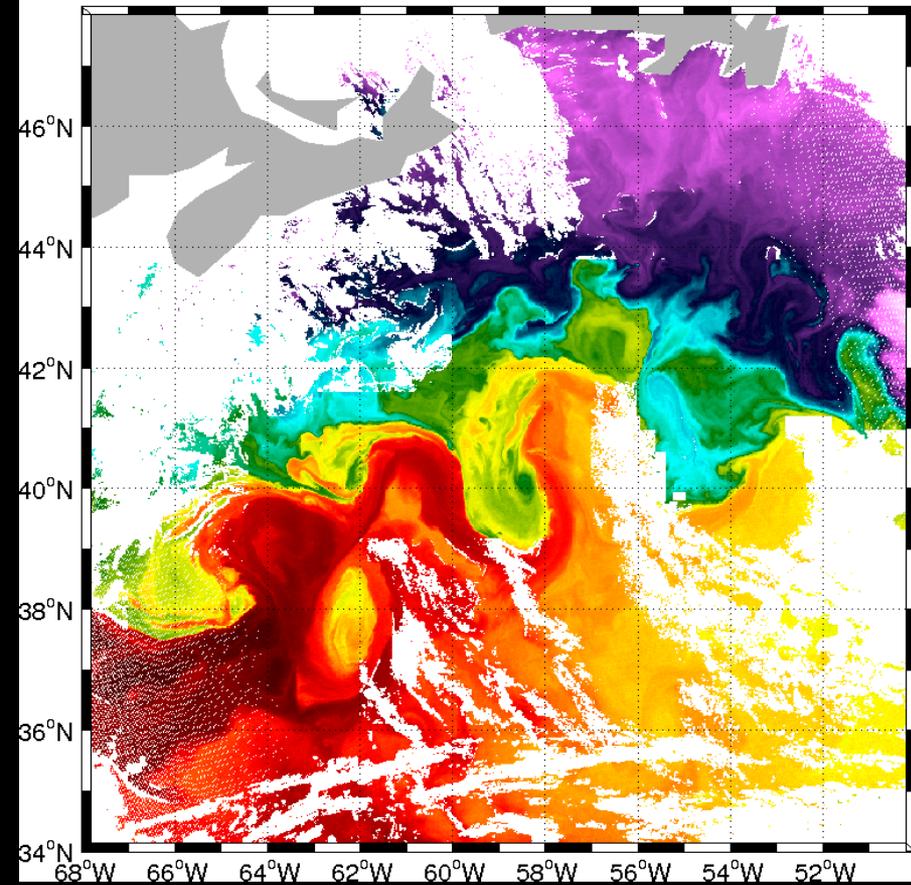
# MODIS vs Altimetry-derived velocity field





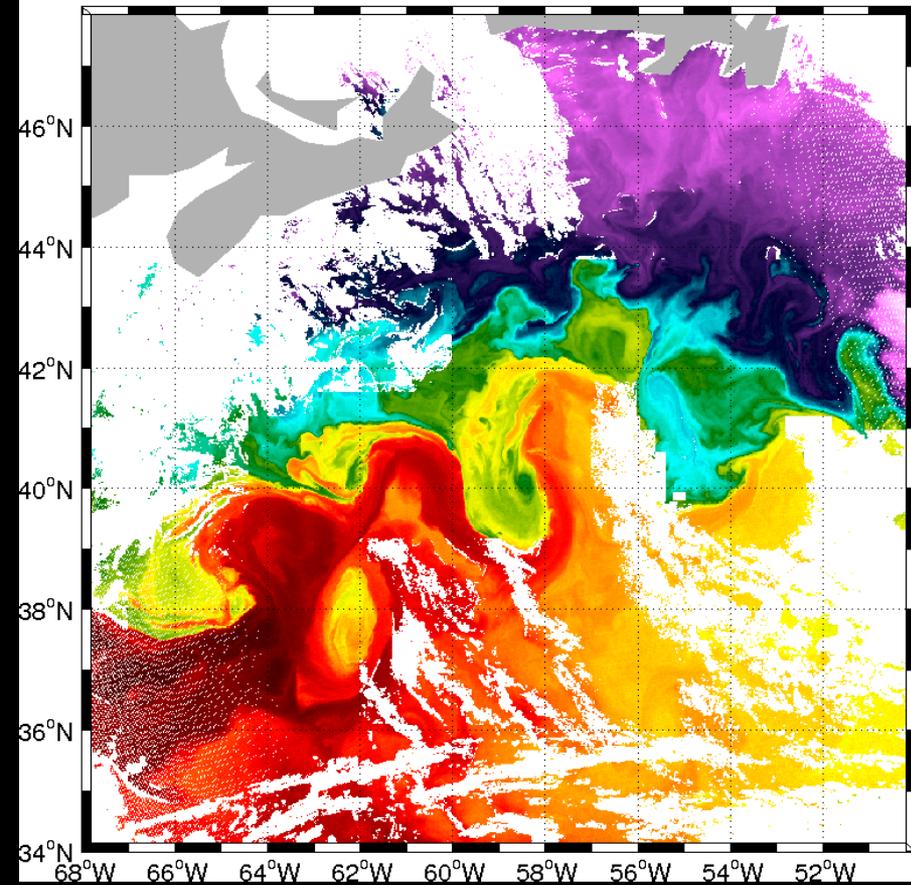
06-May-2010 17:00 modis aqua

18-May-2010 17:16

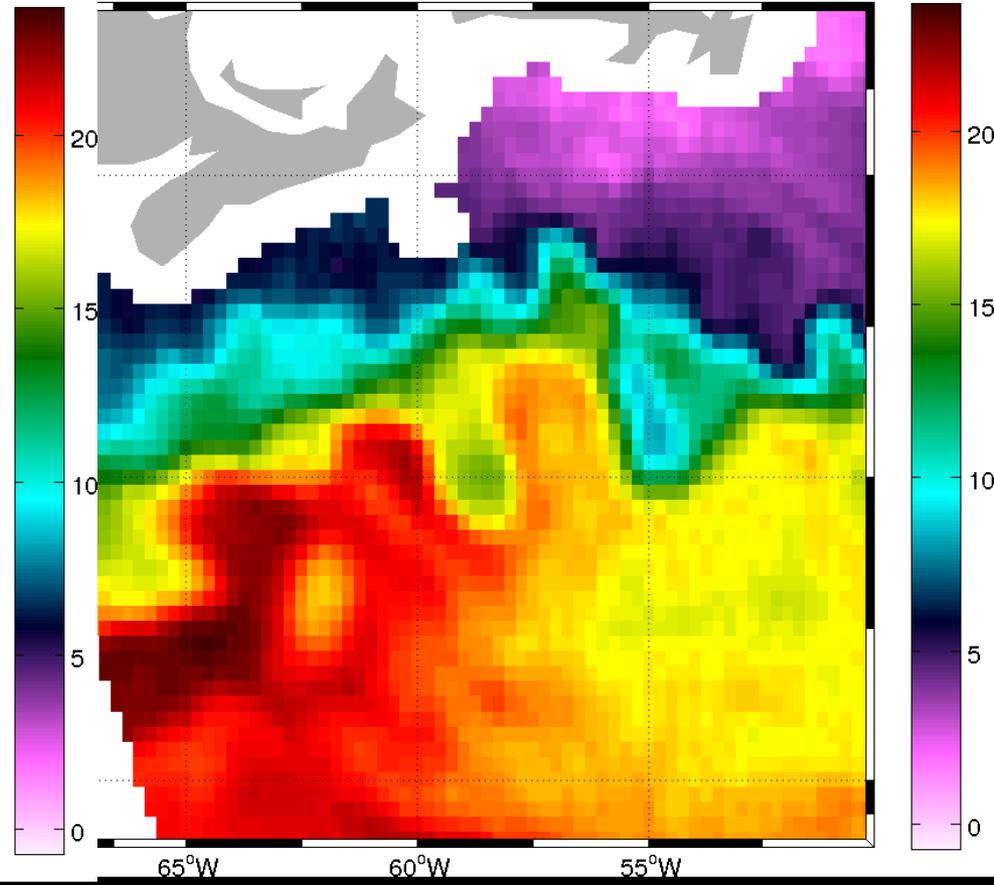




06-May-2010 17:00 modis aqua

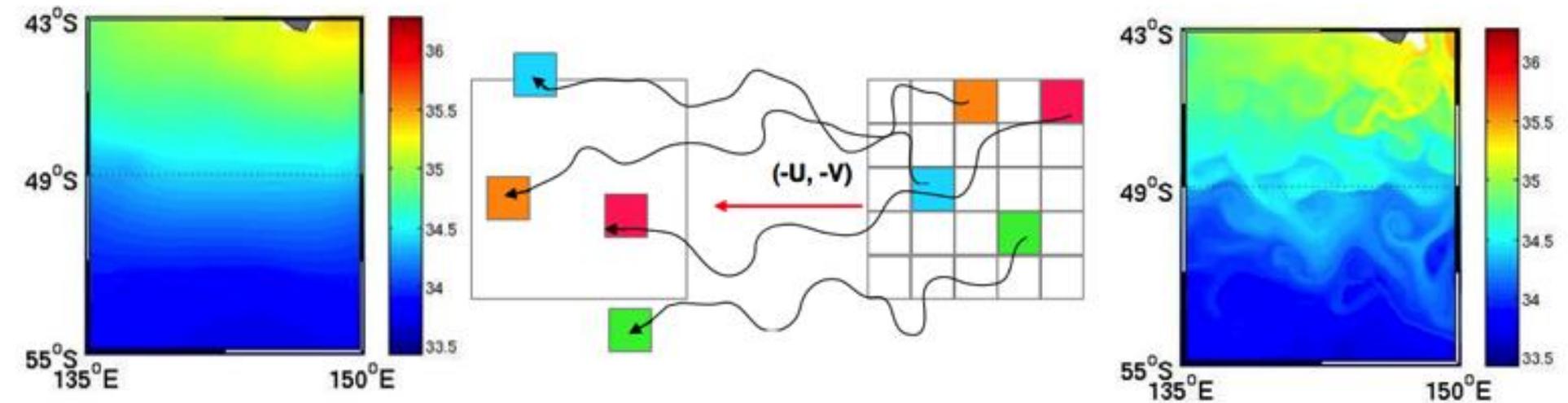


06-May-2010 17:00 amsre



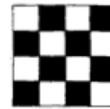
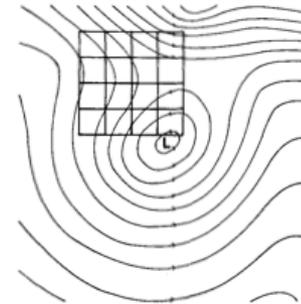
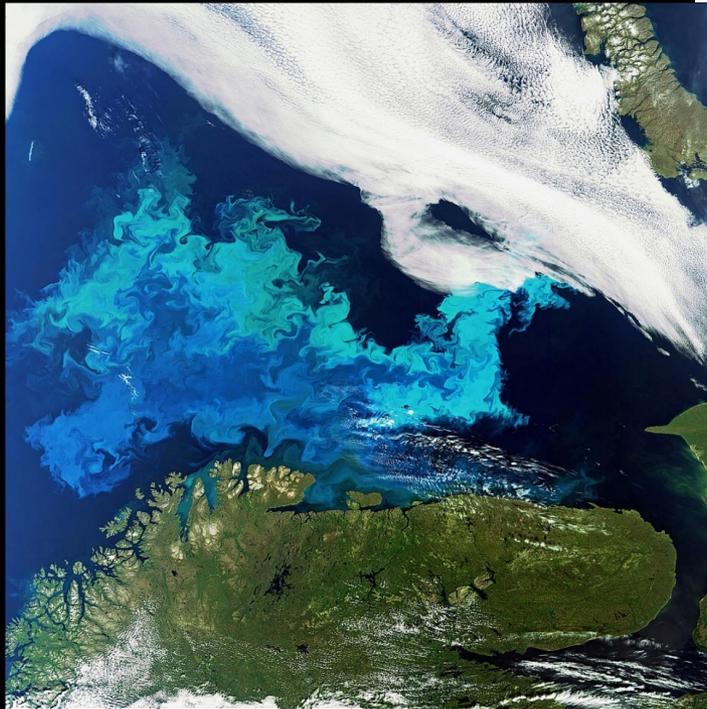


*Lagrangian advection to dynamically interpolate large-scale tracer (sea surface temperature field, left) onto a high-resolution product (right). Particle trajectories computed using altimetry-derived velocities (AVISO, weekly  $1/3^\circ$ ) with 3 hours time steps*





## Stirring and mixing : interplay and scale



a



b



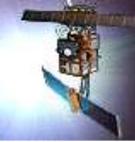
c



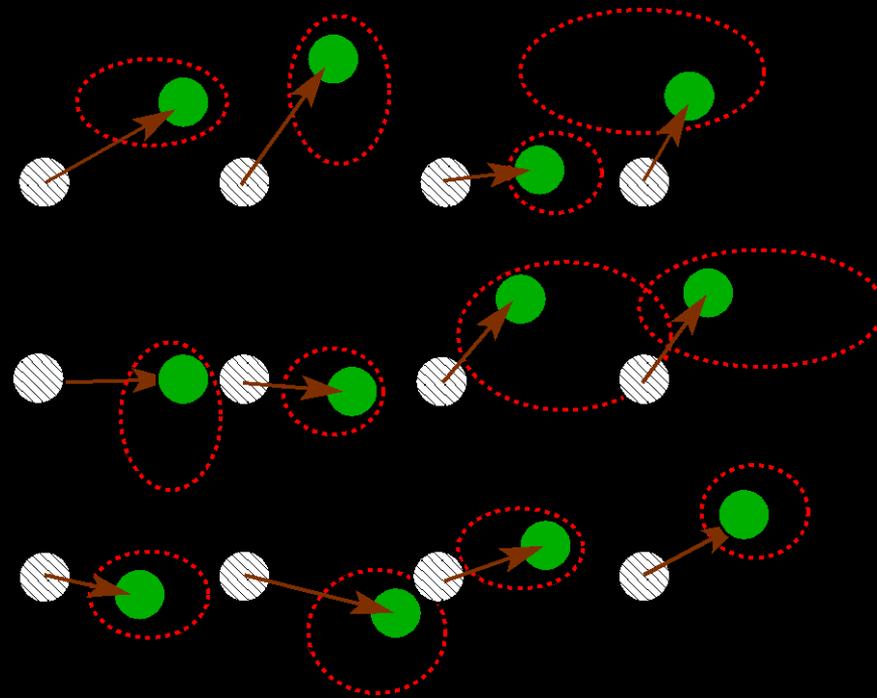
d

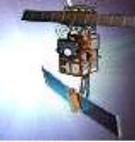


e



*Observed data in combination with the physical knowledge of stochastic processes in nonlinear dynamical systems*





# Advection of tracer $\Theta$

Large scales:

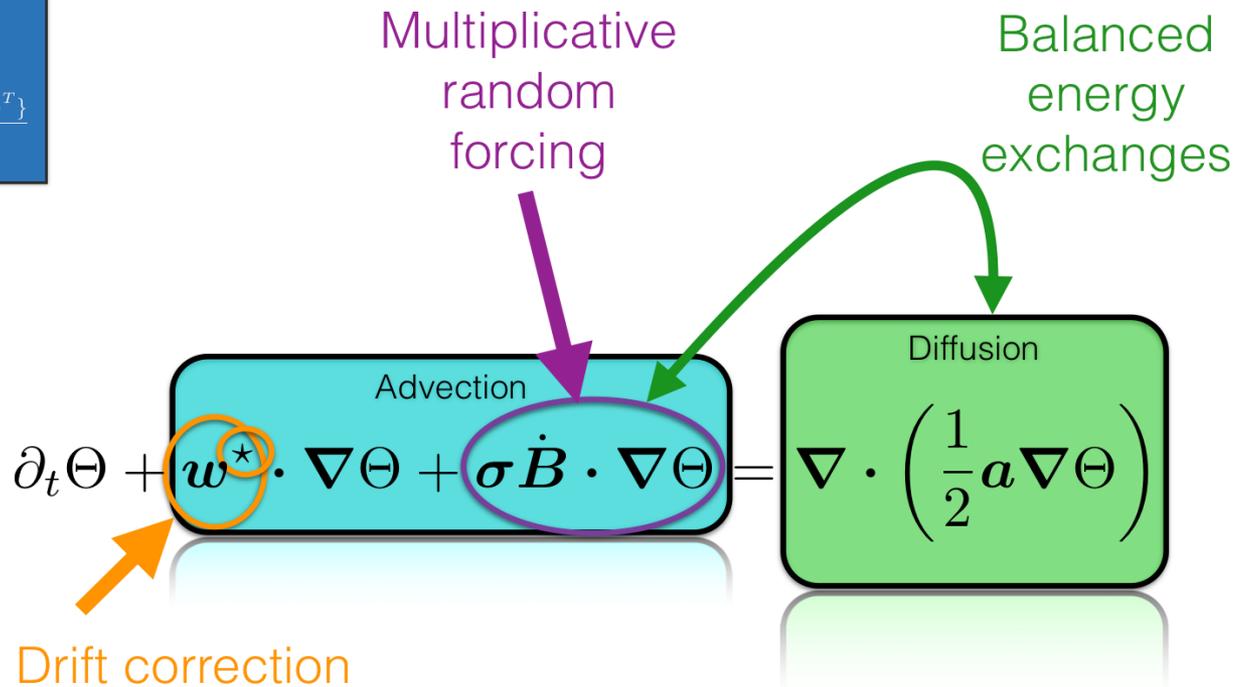
$w$

Small scales:

$\sigma \dot{B}$

Variance tensor:

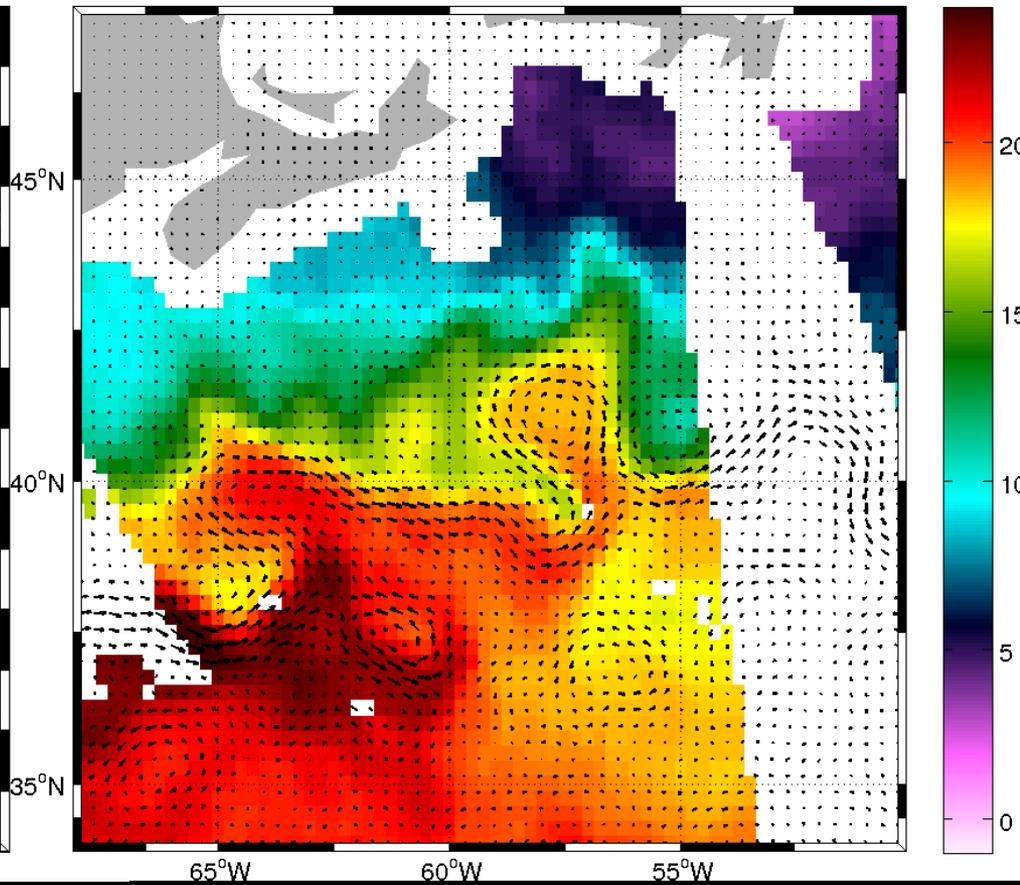
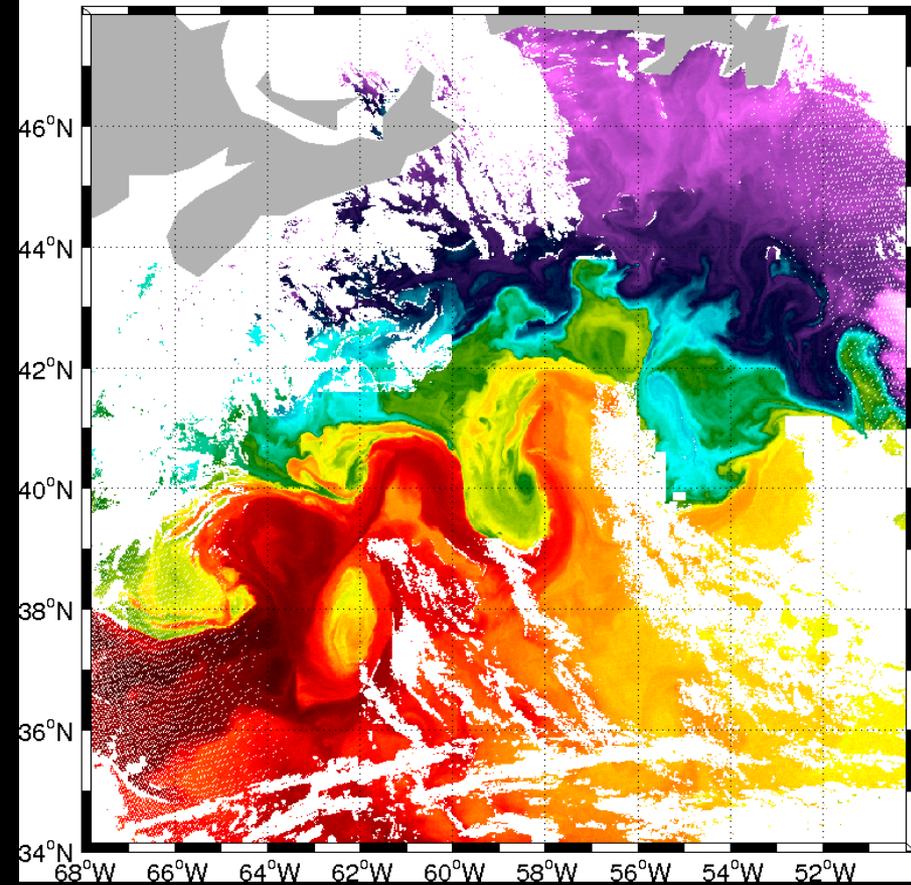
$$a = a(x, x) = \frac{\mathbb{E}\{\sigma dB(\sigma dB)^T\}}{dt}$$





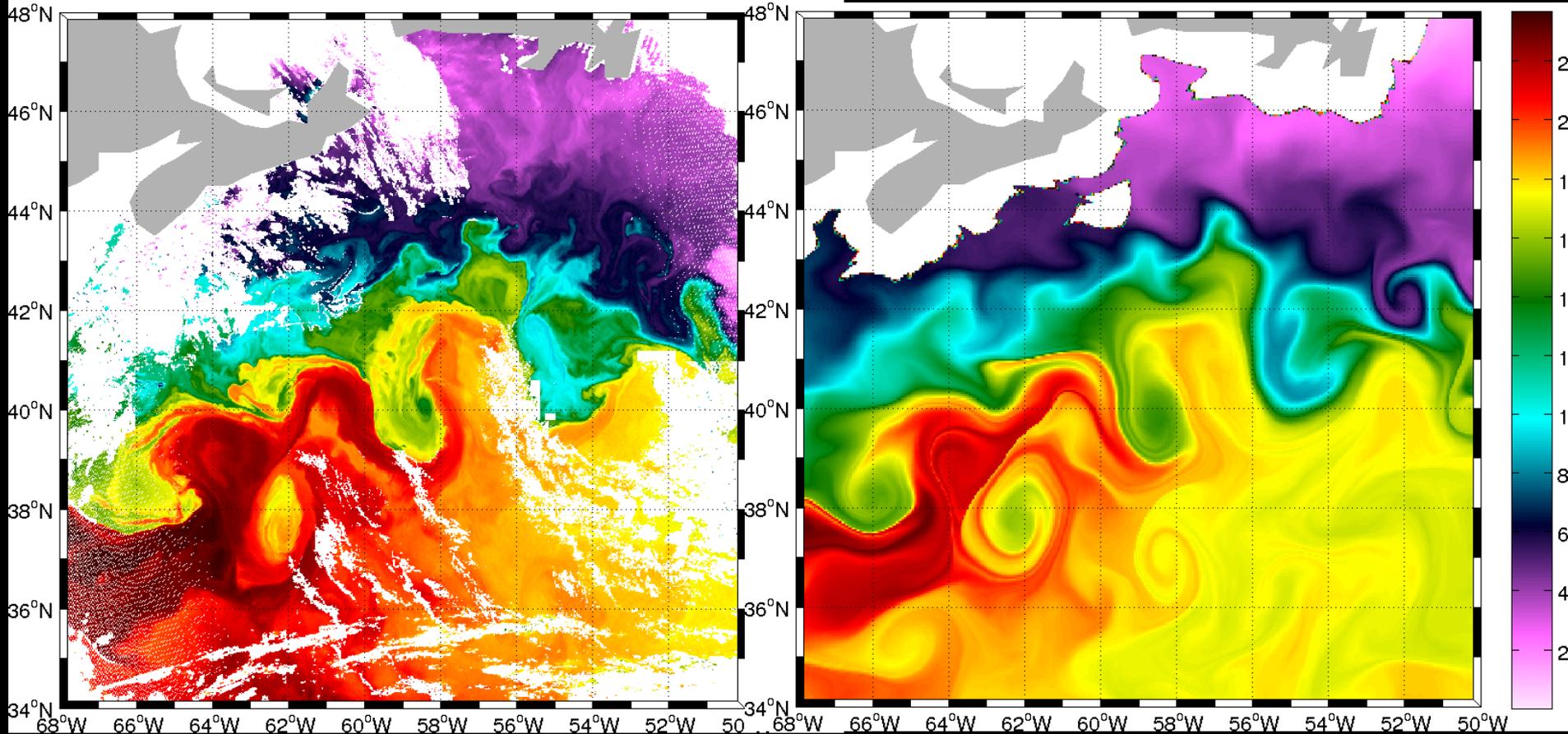
06-May-2010 17:00 modis aqua

18-May-2010 17:16

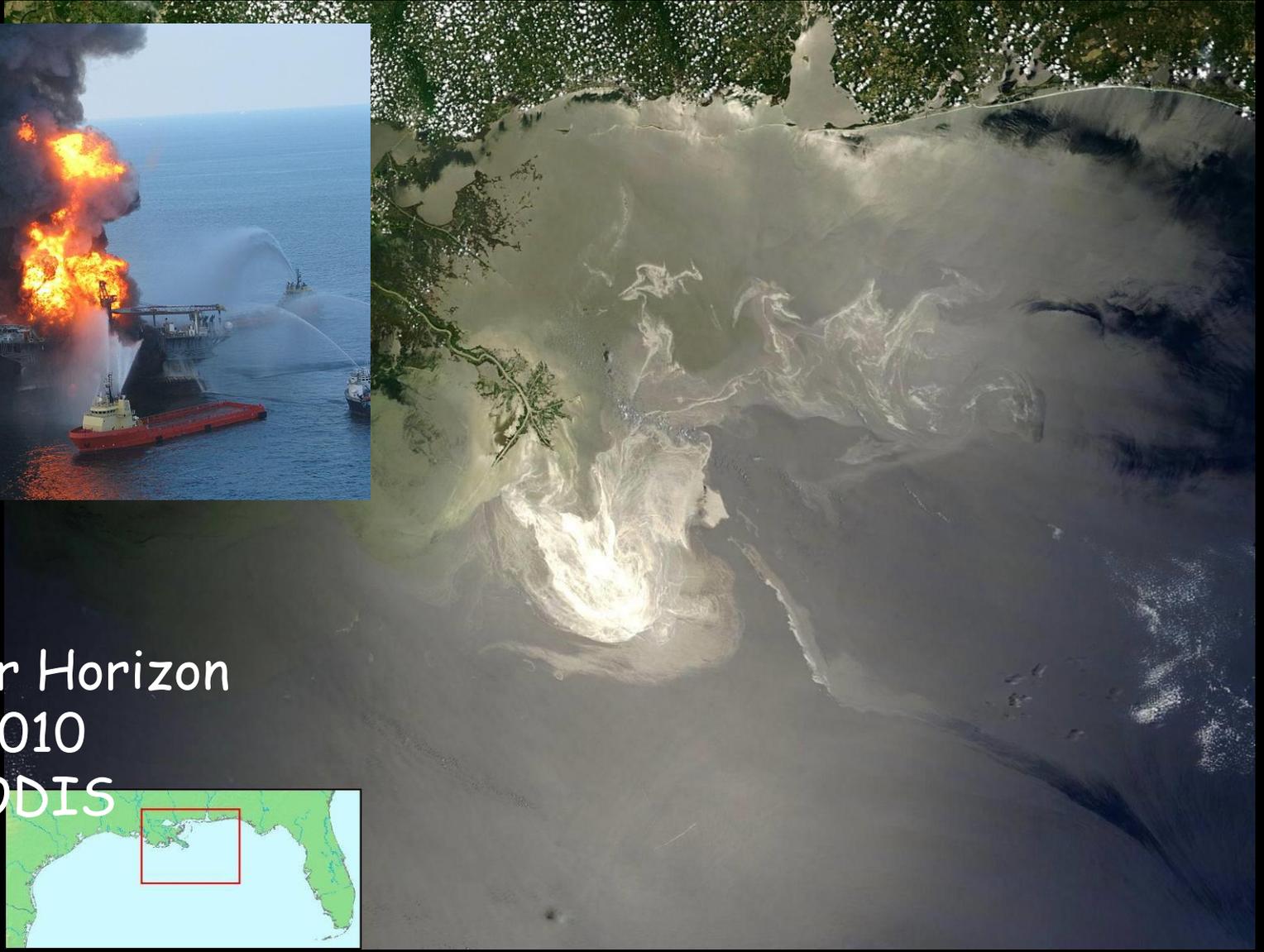




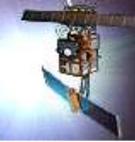
06-May-2010 17:00 modis aqua



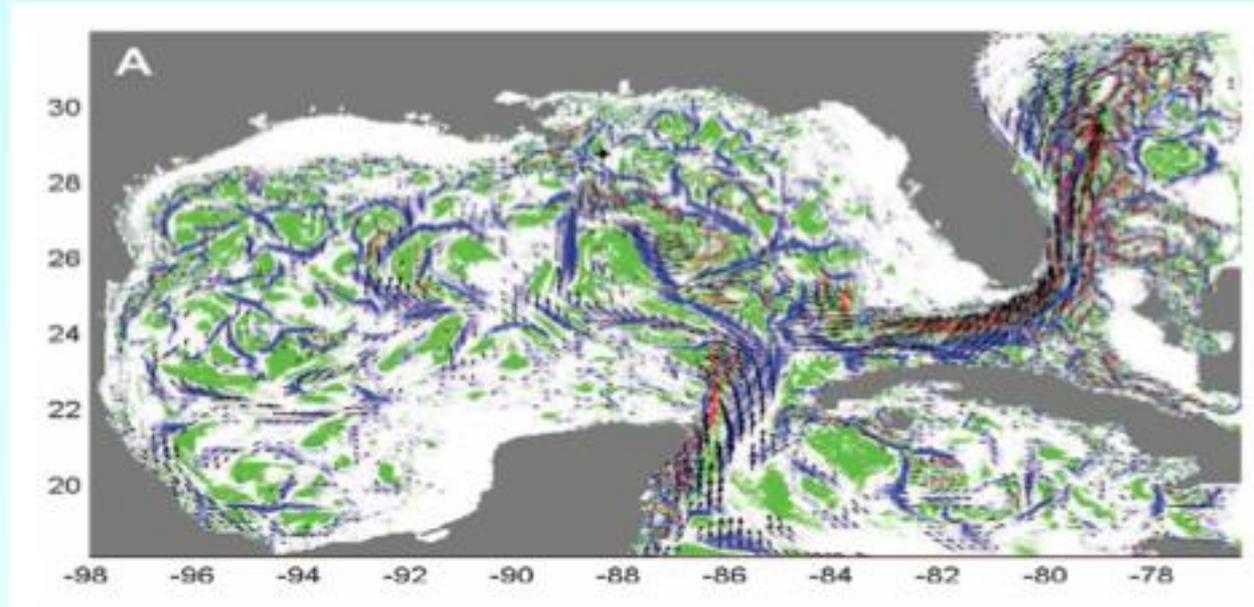
## *Application to Oil Spills Detection*



Deepwater Horizon  
May 24, 2010  
Terra/MODIS



**The blended satellite products allow to estimate the impact of surface currents on the biogeochemical transport, on the dispersion of pollutants and oil spills**



*Forecast of oil spill dispersion in the Gulf of Mexico on 25 June 2010: red and blue show regions of strong oil dispersion within 3 days. This diagnosis, based on altimetric data, compared well with what was observed (Mezic et al, Science, 2010).*

**However these satellite datasets (altimetric and microwave data) cannot capture ocean dynamics at scales smaller than 100 km because of the resolution (or/and noise level).**

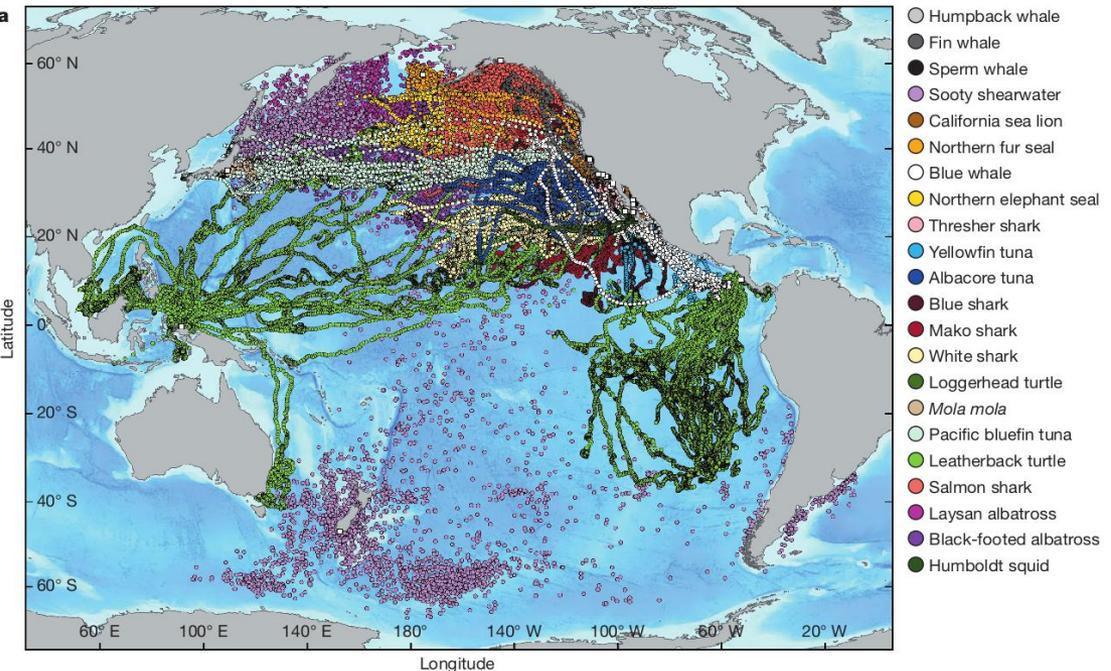
# LETTER Altimetry for ecology : the invisible landscape

doi:10.1038/nature10082



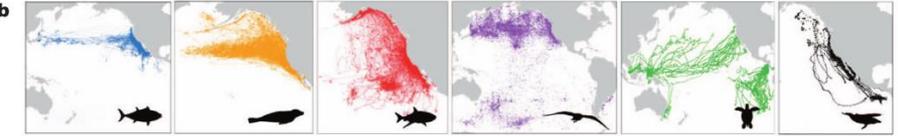
## Tracking apex marine predator movements in a dynamic ocean

B. A. Block<sup>1</sup>, I. D. Jonsen<sup>2</sup>, S. J. Jorgensen<sup>1</sup>, A. J. Winship<sup>2</sup>, S. A. Shaffer<sup>3</sup>, S. J. Bograd<sup>4</sup>, E. L. Hazen<sup>4</sup>, D. G. Foley<sup>4</sup>, G. A. Breed<sup>2,5</sup>, A.-L. Harrison<sup>5</sup>, J. E. Ganong<sup>1</sup>, A. Swithenbank<sup>1</sup>, M. Castleton<sup>1</sup>, H. Dewar<sup>6</sup>, B. R. Mate<sup>7</sup>, G. L. Shillinger<sup>1</sup>, K. M. Schaefer<sup>8</sup>, S. R. Benson<sup>9</sup>, M. J. Weise<sup>5</sup>, R. W. Henry<sup>5</sup> & D. P. Costa<sup>5</sup>

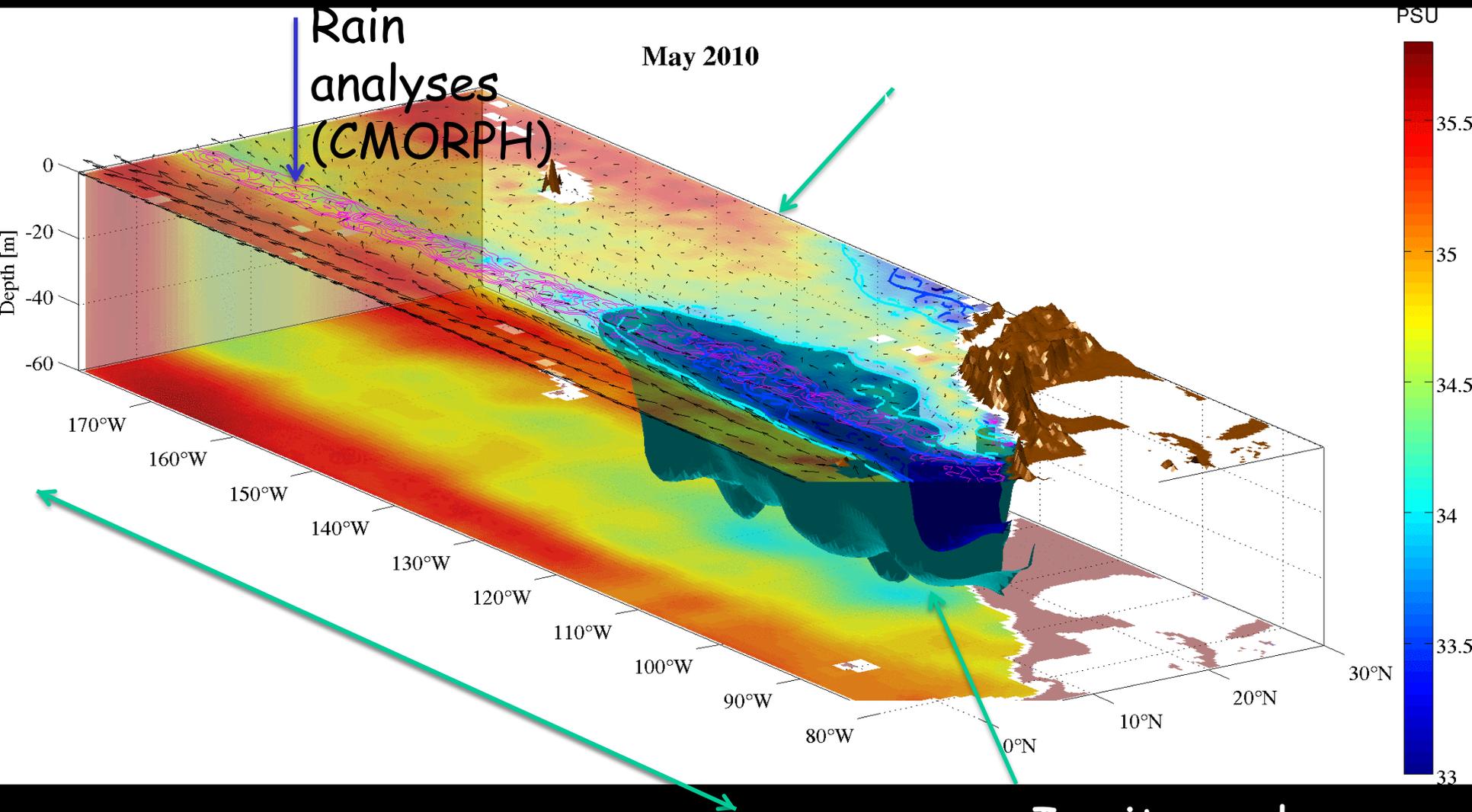


In their displacements, top predators encounter environmental heterogeneity at multiple scales.

Until now, observations where sparse, and matched large-scale current information was enough



# Eastern Pacific Freshpool & 3D monitoring of the pool

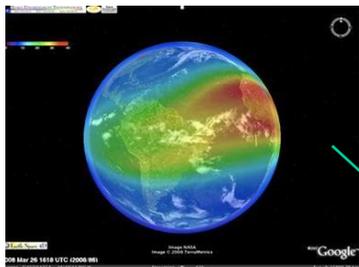


In situ analyses  
(depth)

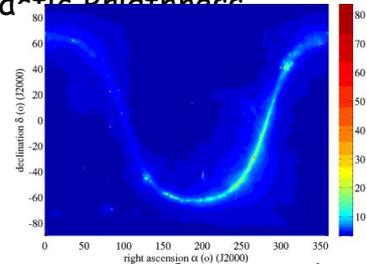


# Sea Surface Salinity from Space

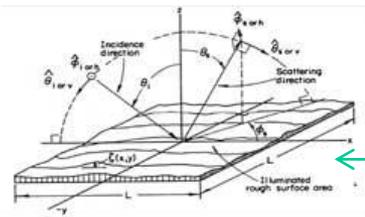
Ionosphere



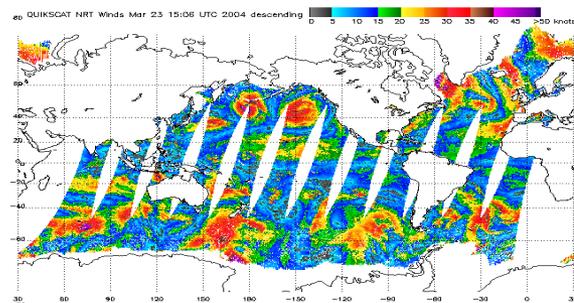
Galactic Brightness



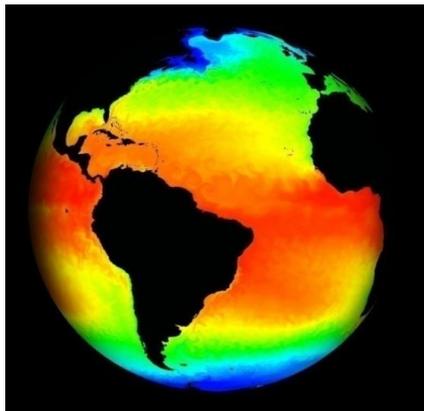
Electromagnetic Models



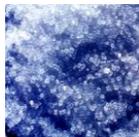
Ocean Surface Winds



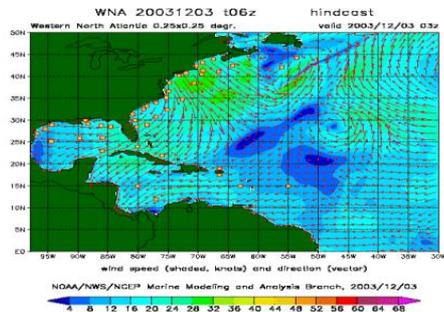
Sea Surface Temperature



Sea Surface Salinity



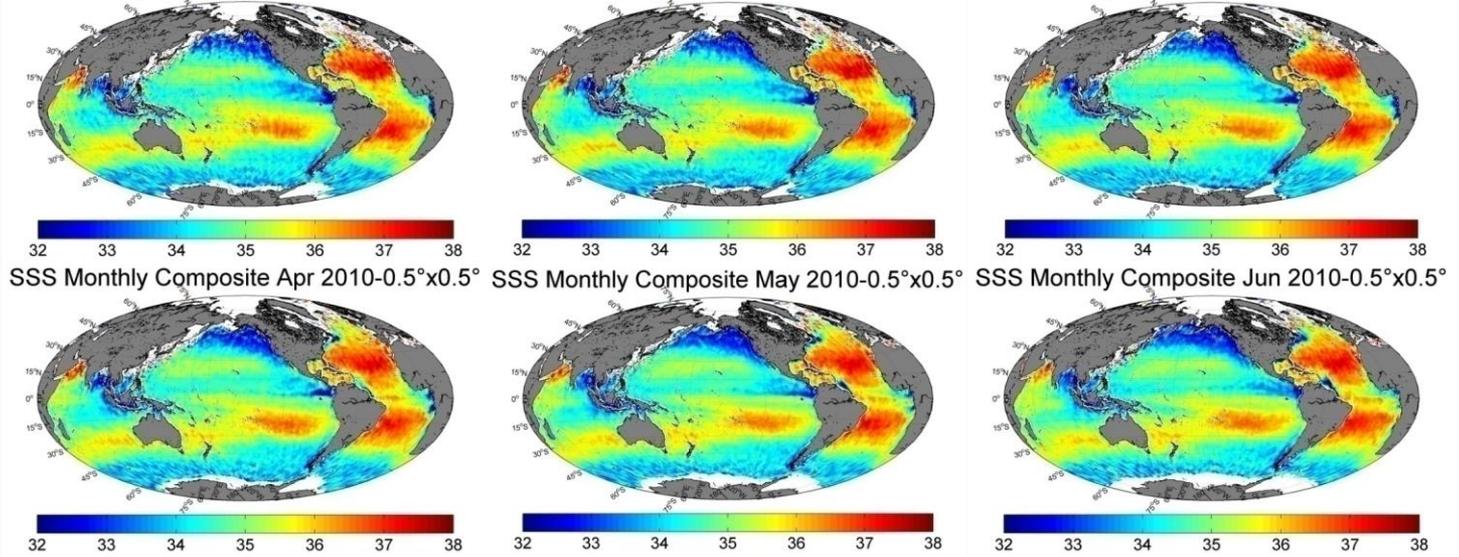
Sea State



NOAA/NWS/NCIP Marine Modeling and Analysis Branch, 2003/12/03

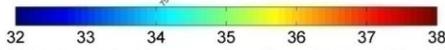
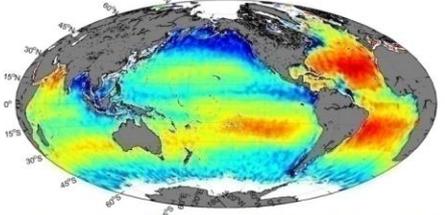


SSS Monthly Composite Jan 2010-0.5°x0.5°    SSS Monthly Composite Feb 2010-0.5°x0.5°    SSS Monthly Composite Mar 2010-0.5°x0.5°

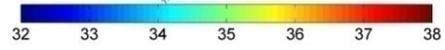
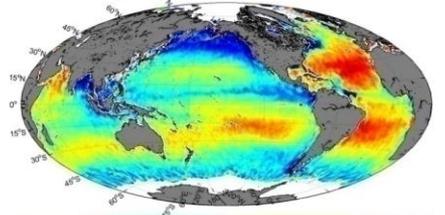




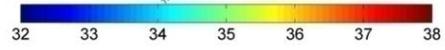
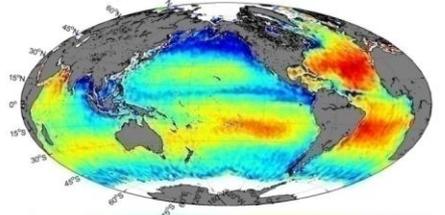
SSS Monthly Composite Jul 2010-0.5°x0.5°



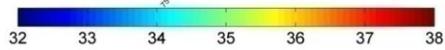
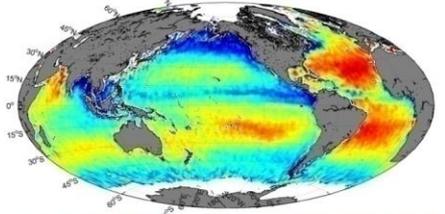
SSS Monthly Composite Aug 2010-0.5°x0.5°



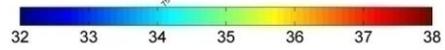
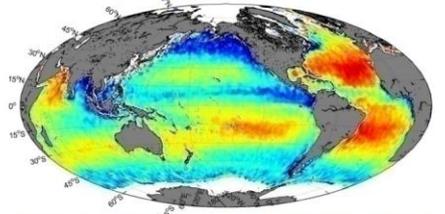
SSS Monthly Composite Sep 2010-0.5°x0.5°



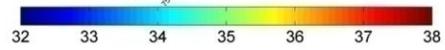
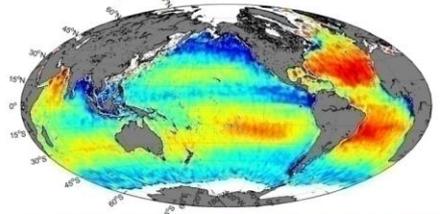
SSS Monthly Composite Oct 2010-0.5°x0.5°



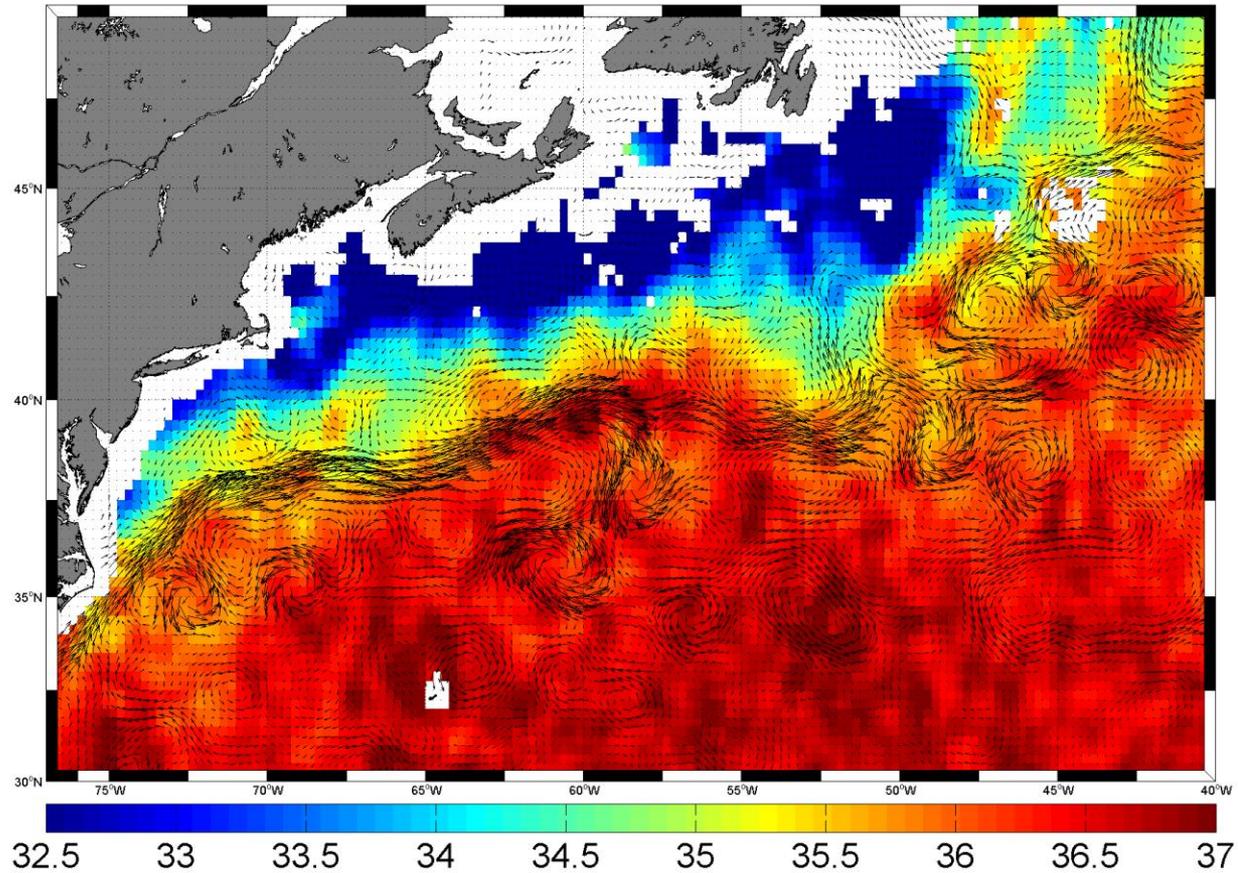
SSS Monthly Composite Nov 2010-0.5°x0.5°



SSS Monthly Composite Dec 2010-0.5°x0.5°

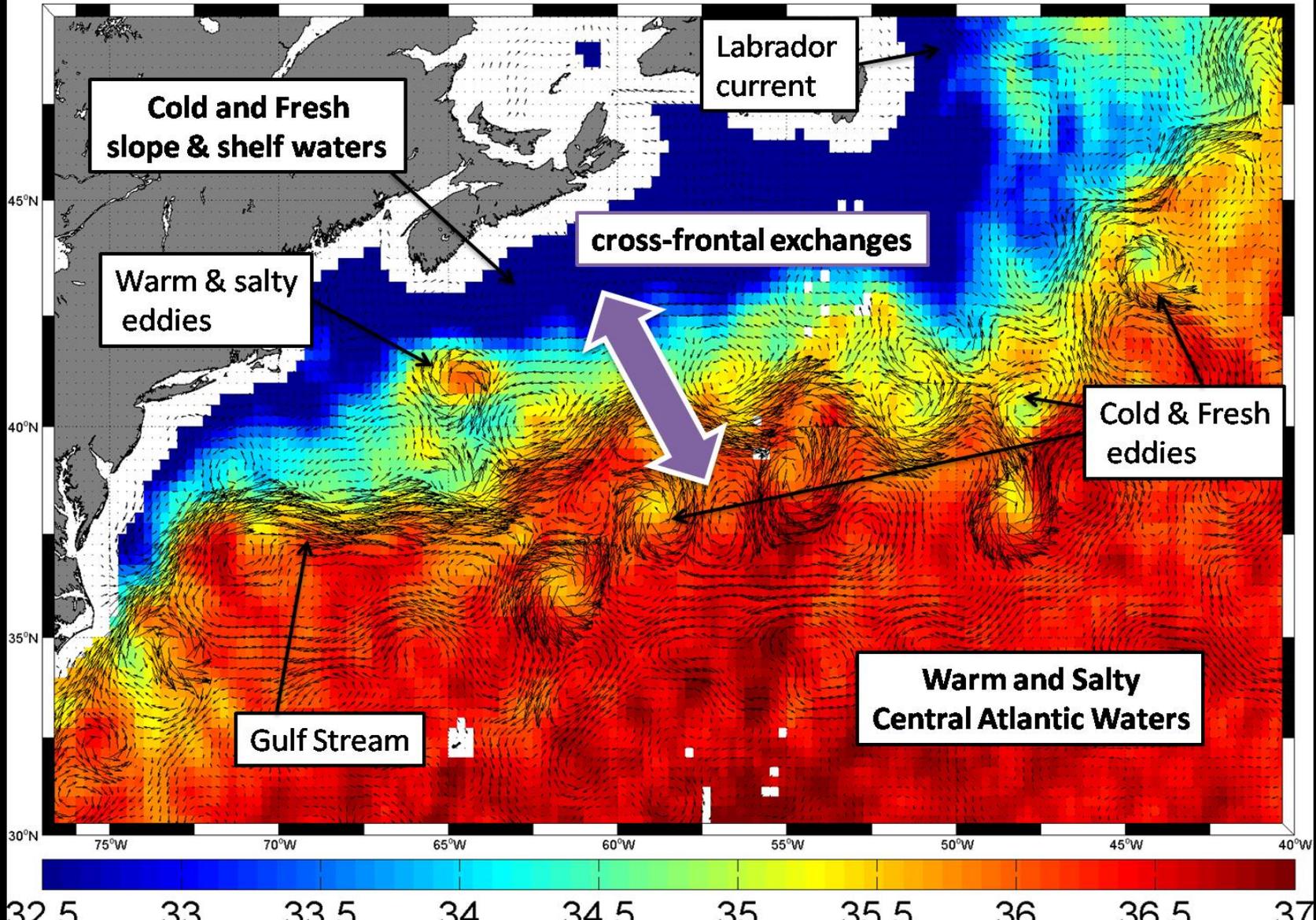


SMOS SSS (color)+ currents (vector) from 03/03 to 17/03 2012



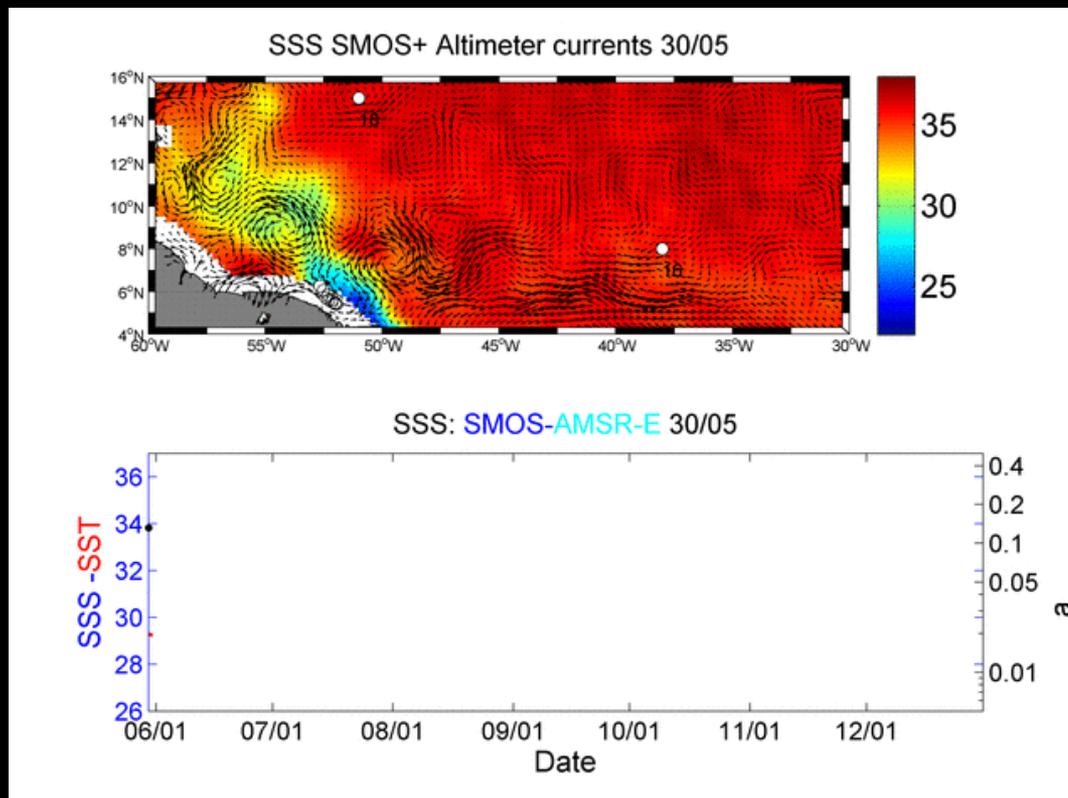


SMOS SSS (color)+ currents (vector) from 04/06 to 18/06 2012

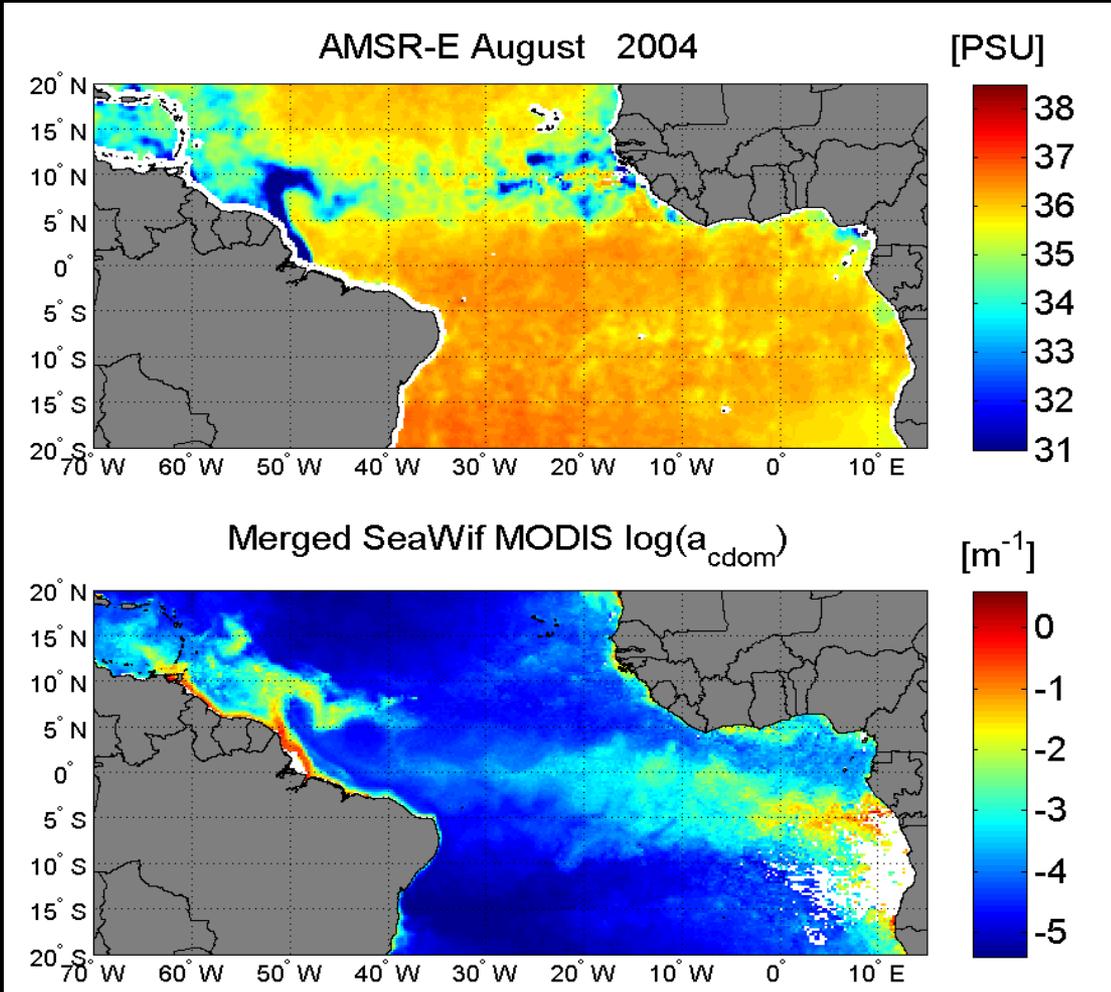




# Synergy SSS (SMOS+AMSR-E)+Altimeter-derived surface currents +SST (GHRSSST)+ Ocean Colour (CDOM MERIS/MODIS)

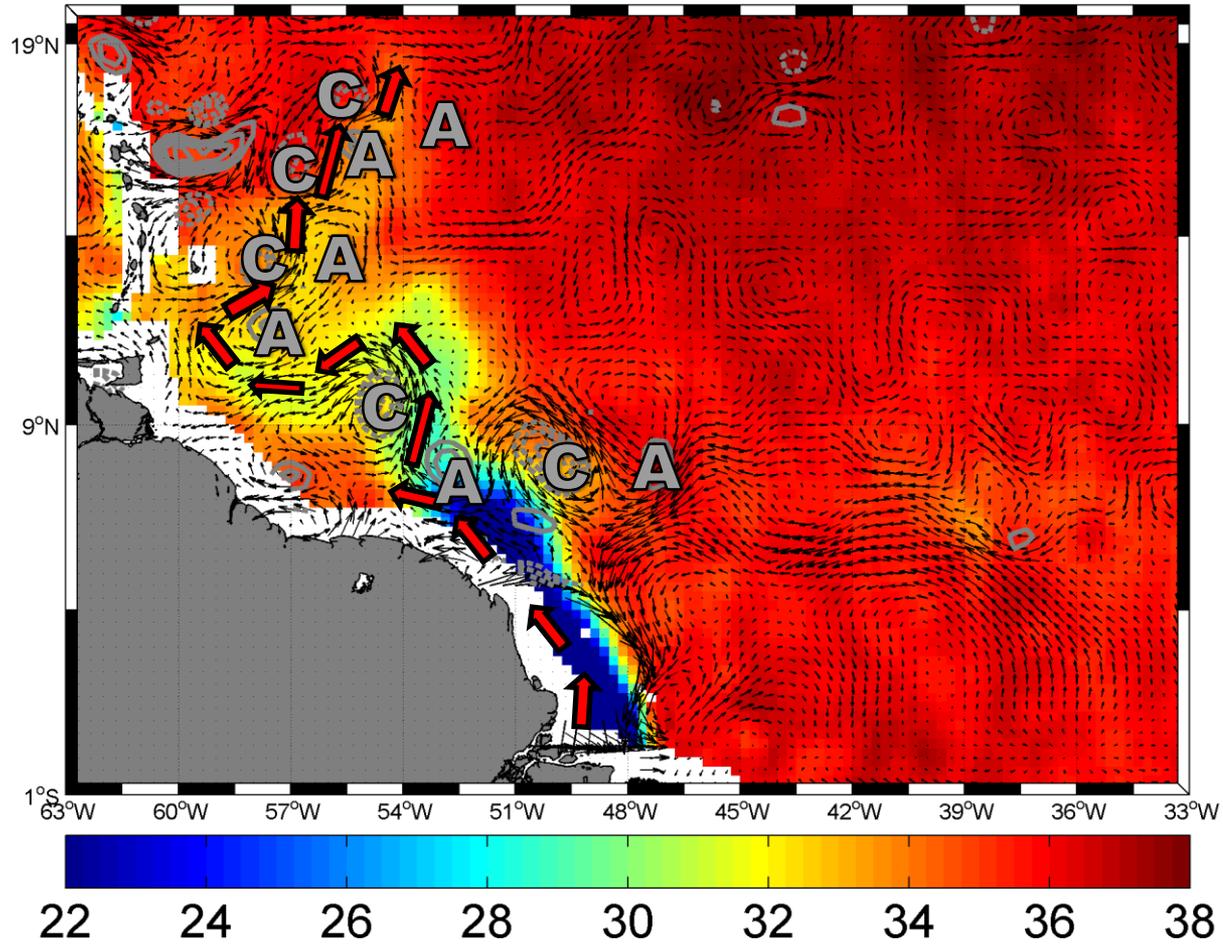


Lagrangian Optical-Physical properties





# SSS Averaged from Jun 04 through Jun 14



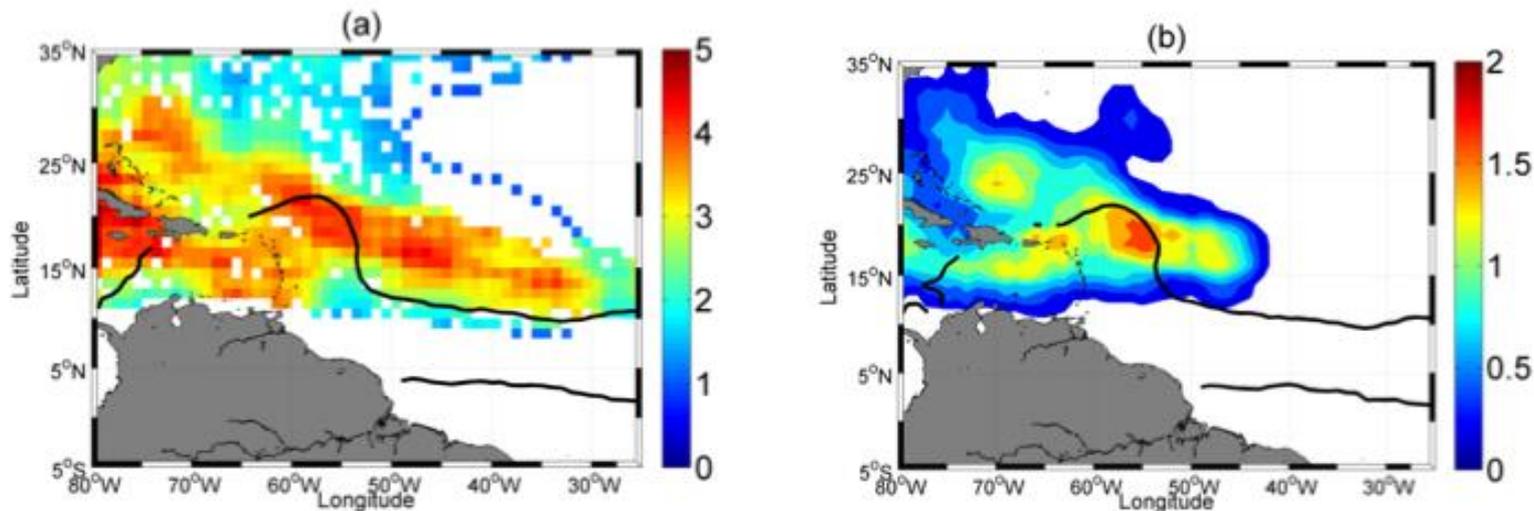
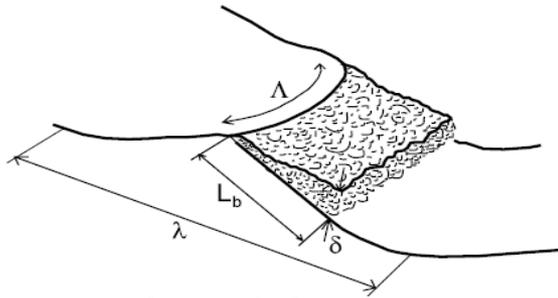


FIG.2 The number of 1950 through 2010 “best track” TC per one degree square (smoothed by a 3° x 3° block average) (a) that evolves as Cat 4-5 somewhere along their path and (b) that intensified locally to Cat 4-5. The black curve is showing the historical extent of the Amazon-Orinoco river plume during the hurricane peak season (August to October).





## Passive Microwave measurements



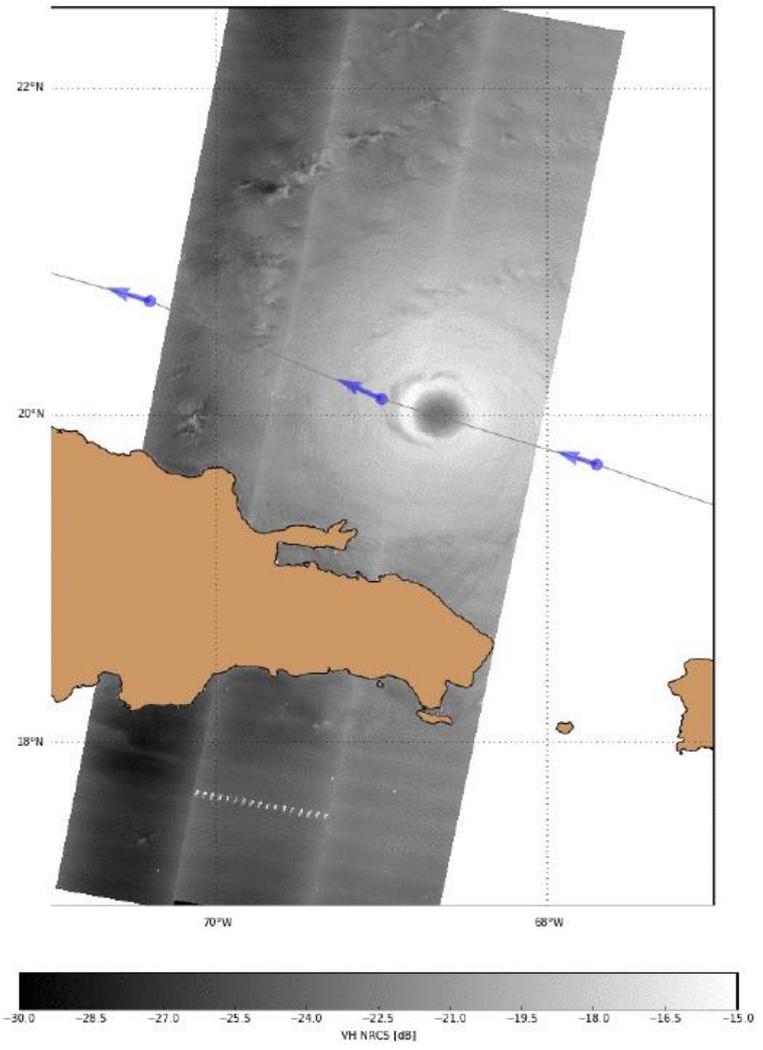
Semi-empirical model

- Self-similar breaker-scale distribution
- Foam coverage and thickness  
→ wavelength sensitivity





# #IrmaHurricane2017



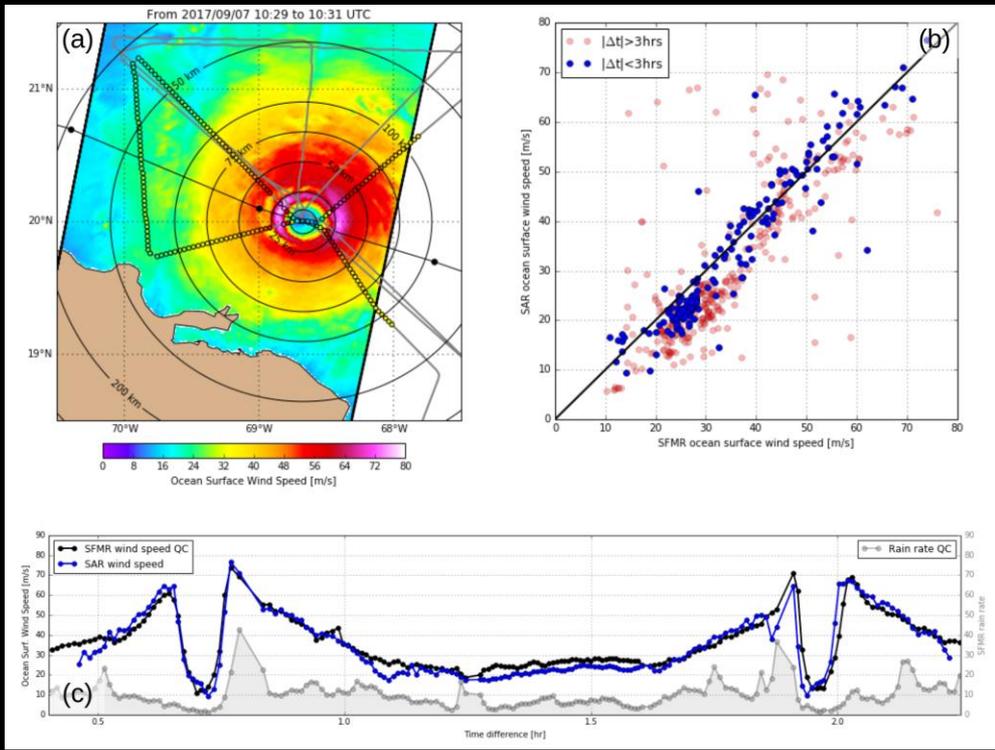
**Sentinel-1**

Contains modified Copernicus  
Sentinel data (2017)



# Ocean Surface Wind : C-Band Synthetic Aperture Radar

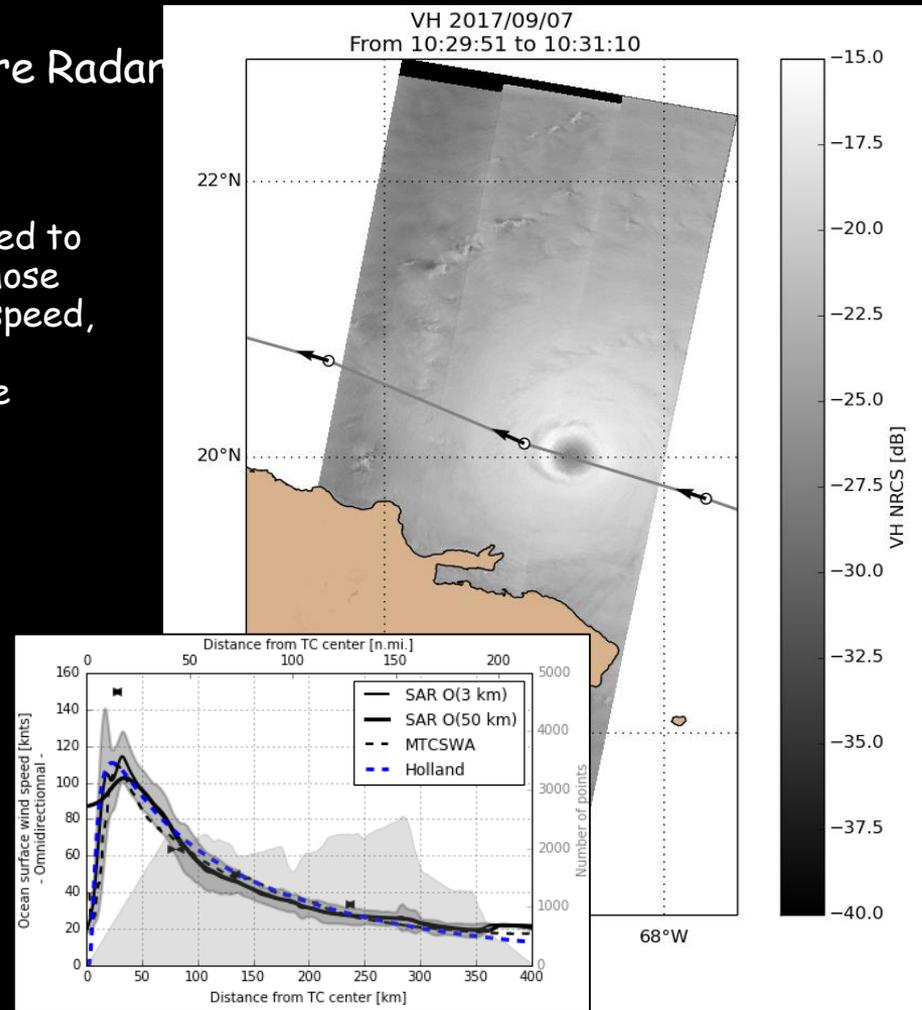
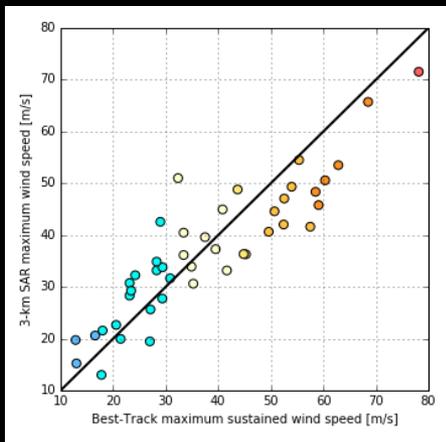
Signal	Intensity of backscatter signal (NRCS)
Resolution	1 km
Assets	Dual polarization: -Co-pol = less noise, sensitive to wind direction -Cross-pol = no saturation at high winds High resolution
Limitations	Not a large coverage, reduced opportunity to get acquisitions over TCs Impacts of rain and waves exist





# Ocean Surface Wind : C-Band Synthetic Aperture Radar

Thanks to its high resolution C-Band SAR can be used to estimate Tropical Cyclones parameters, including those related to the inner core: radius of maximum wind speed, maximum wind speed, the inner core entropy  
 This is complementary to radiometer large coverage





Upper ocean responses to extreme wind forcing by tropical cyclones remains a central problem in physical oceanography

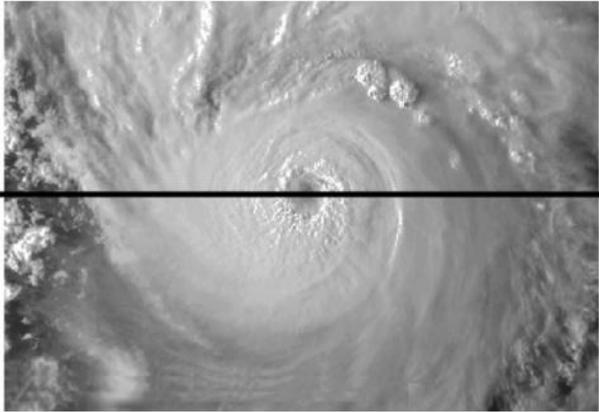
Parameterization of wind forcing at high-wind speeds is still a matter of debate and active research

To accurately model air-sea coupled processes, it is of central importance to quantify how efficiently surface winds and waves, within storm cores, increase the momentum of surface currents

Energy transfer to upper currents mostly occurs in front of the extremes and is nearly balance with the increase in kinetic energy of the upper ocean currents

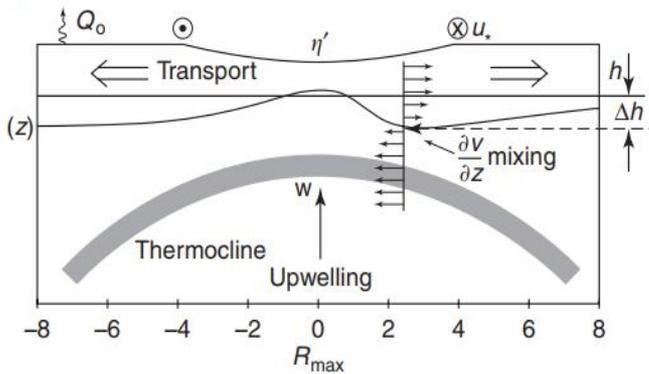


(a)



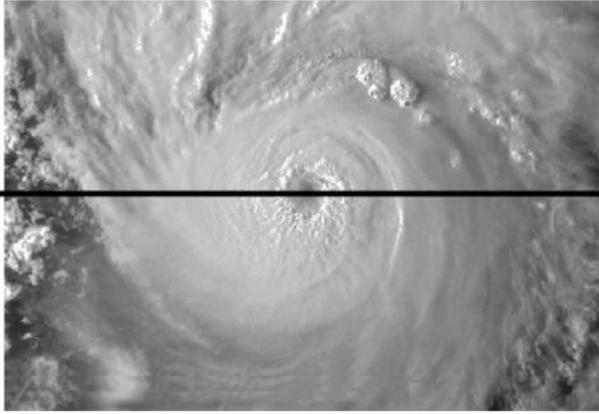
Far from the coasts, Extreme Events are opportunities of high scientific values to investigate how natural processes at their peaks can transfer energy and matter within and across boundaries, and to identify the mechanisms involved and their rates, jointly with their local and/or long term impacts

(b)



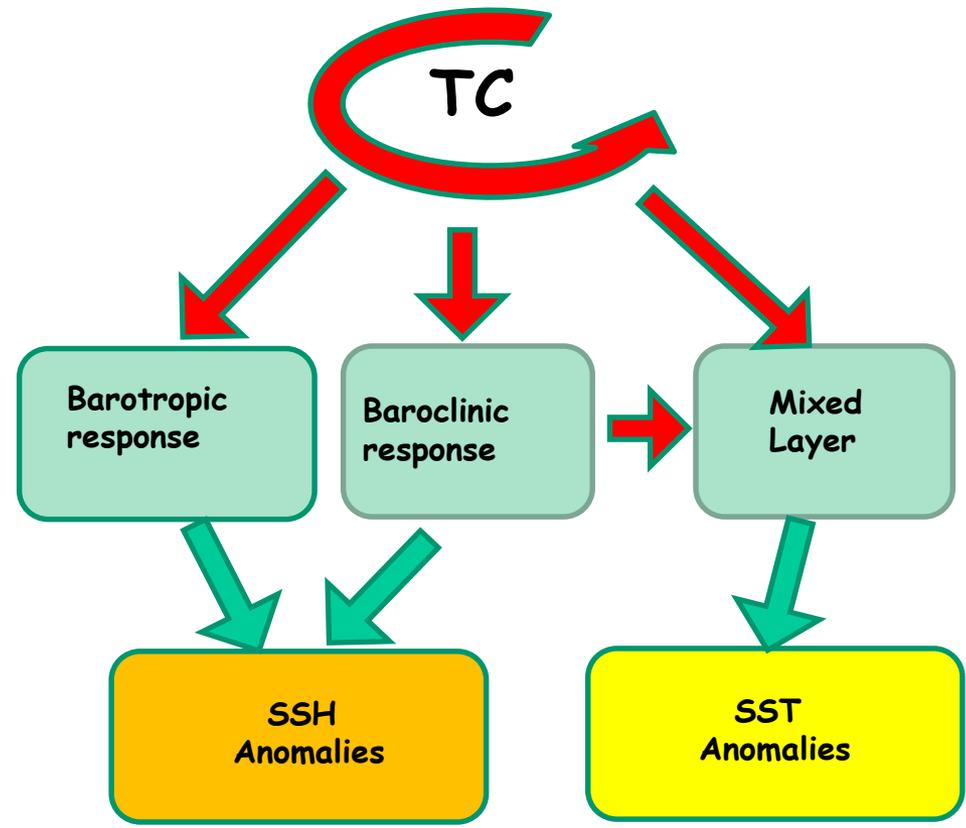
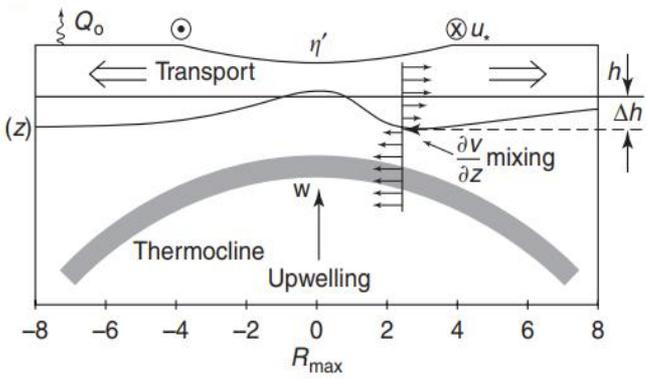


(a)

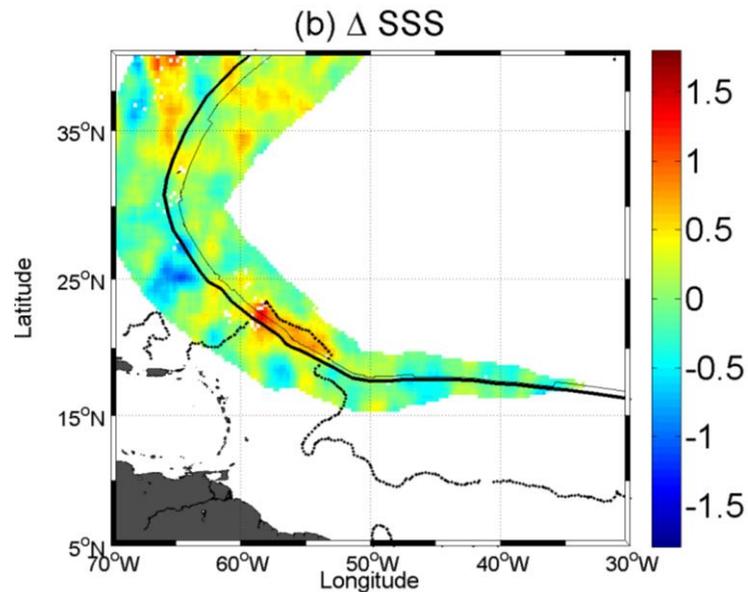
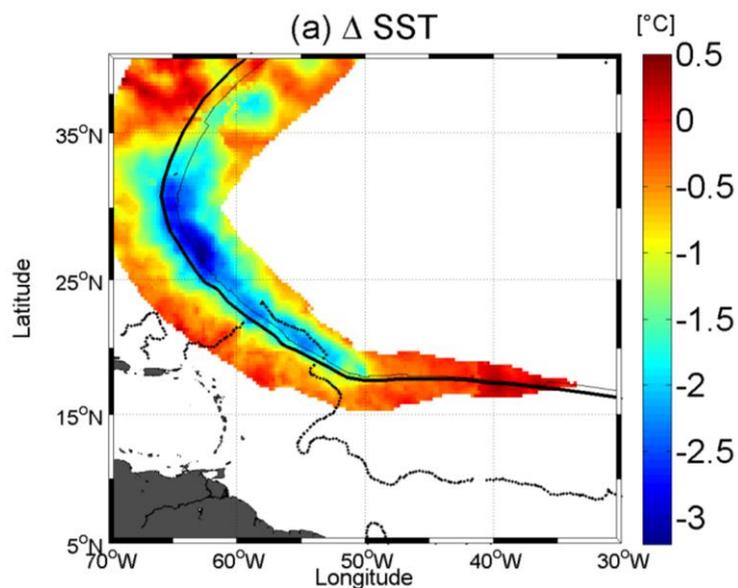


# Simplified TC Wake Model

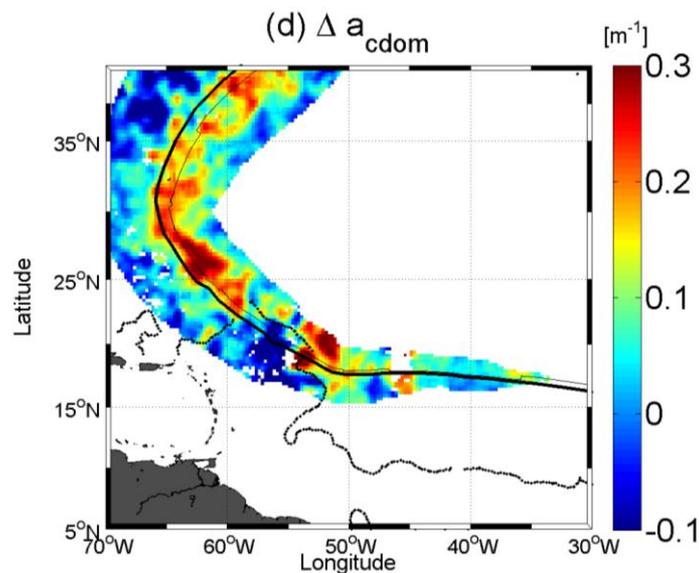
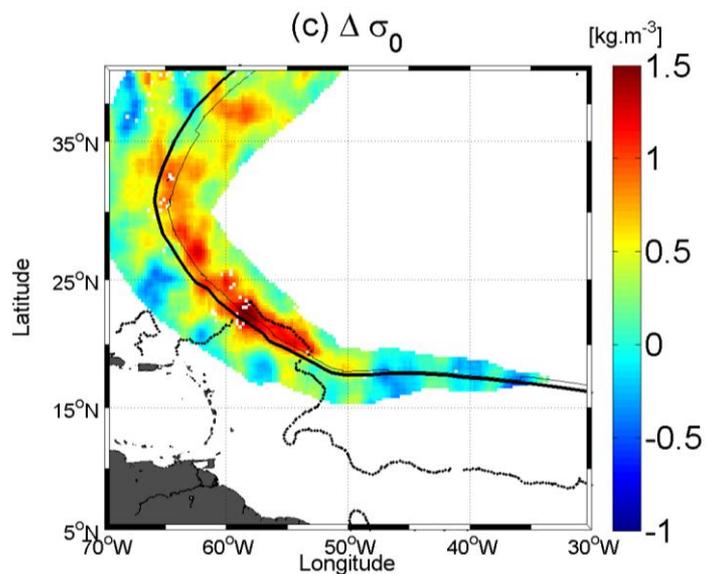
(b)

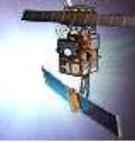


# Surface signature wakes of Igor

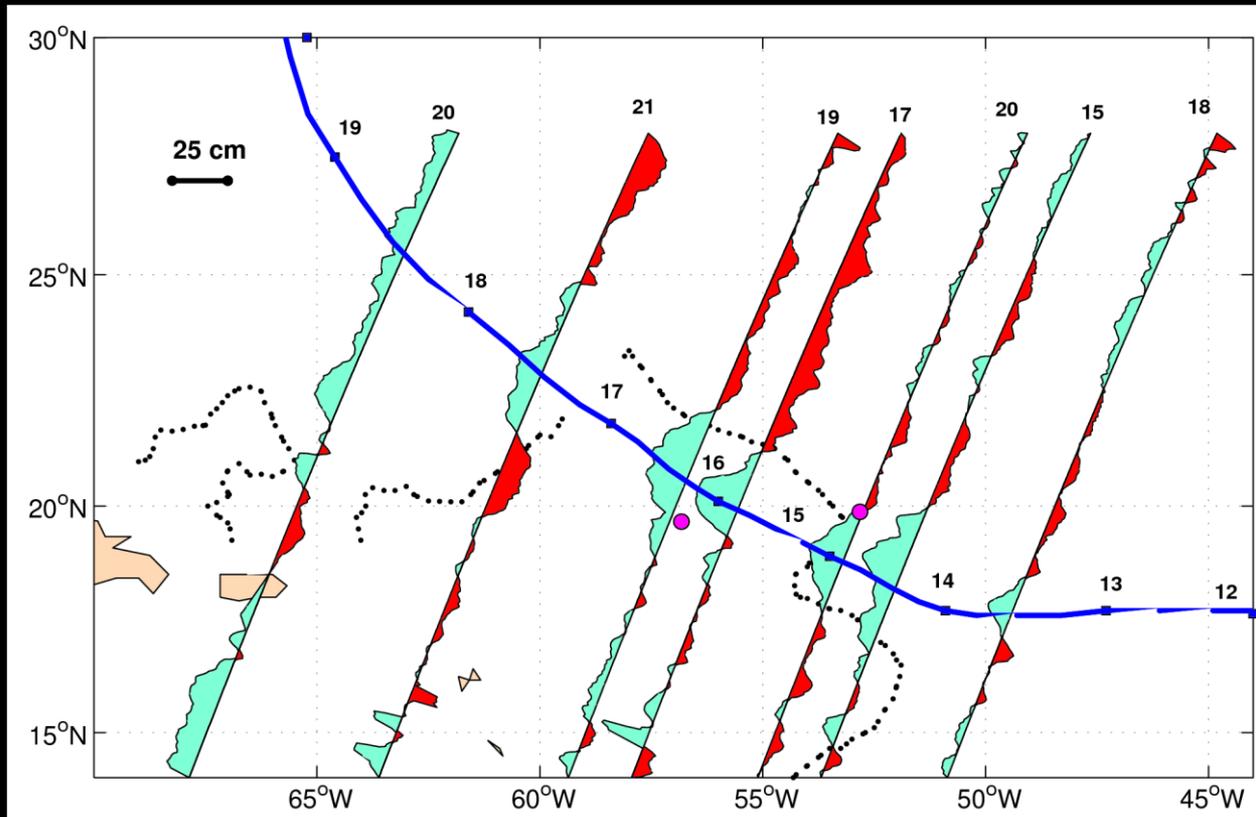


Six days of data centered on  $t_0$ -(+) 4 days have been averaged to construct the pre (post)-cyclonic quantities.



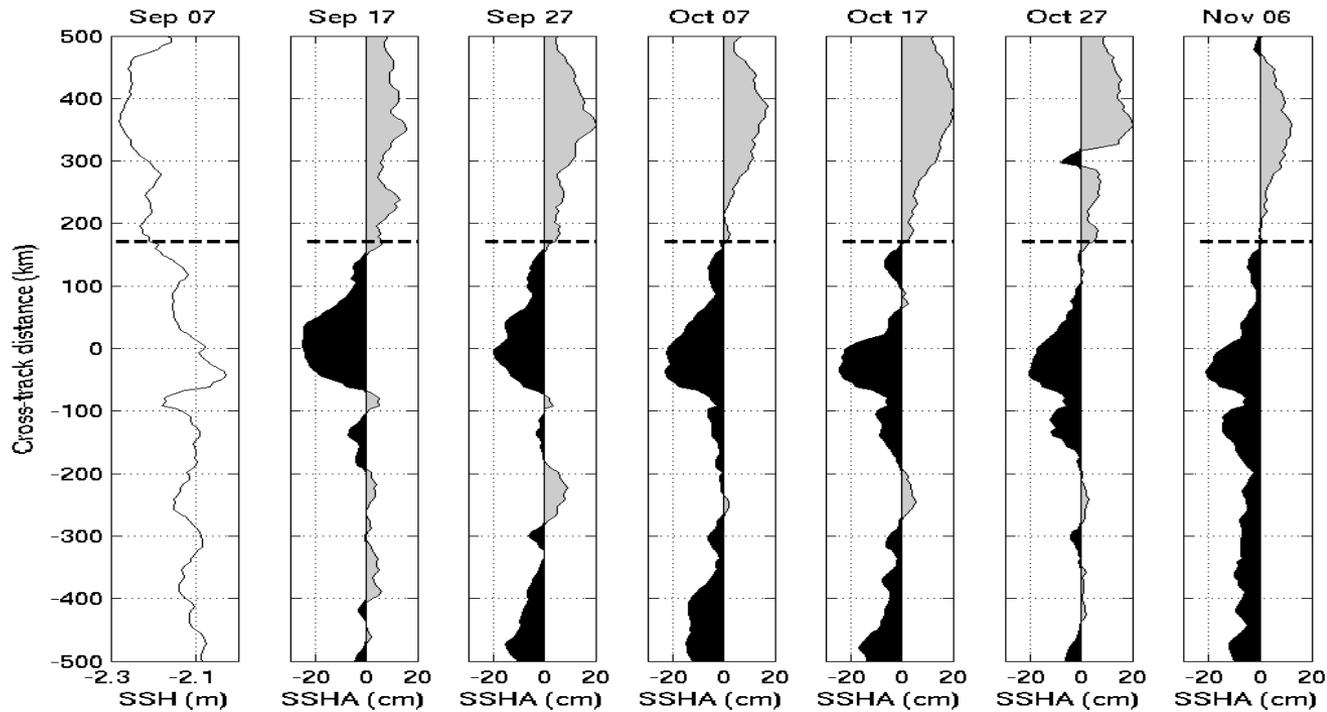


# Surface altimeter SSH wakes of Igor

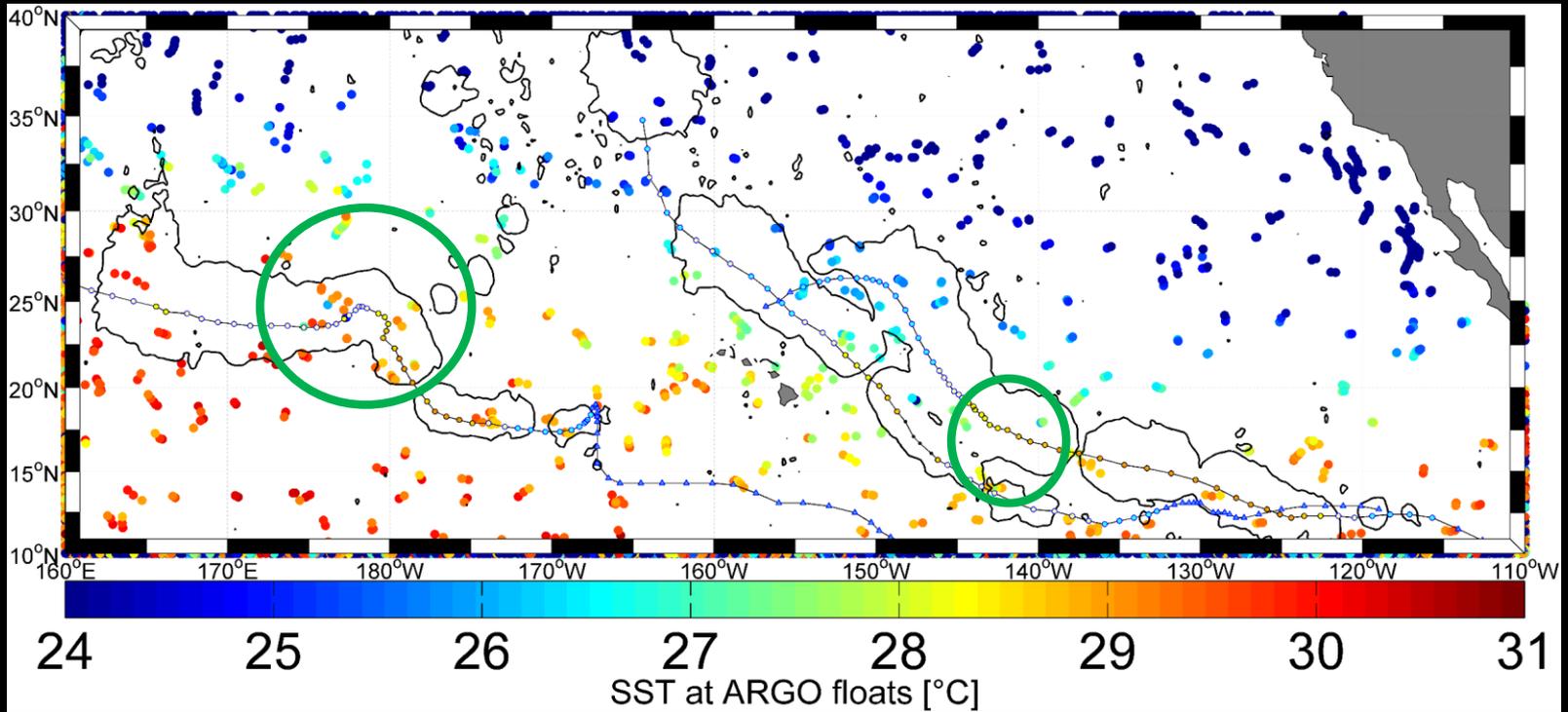


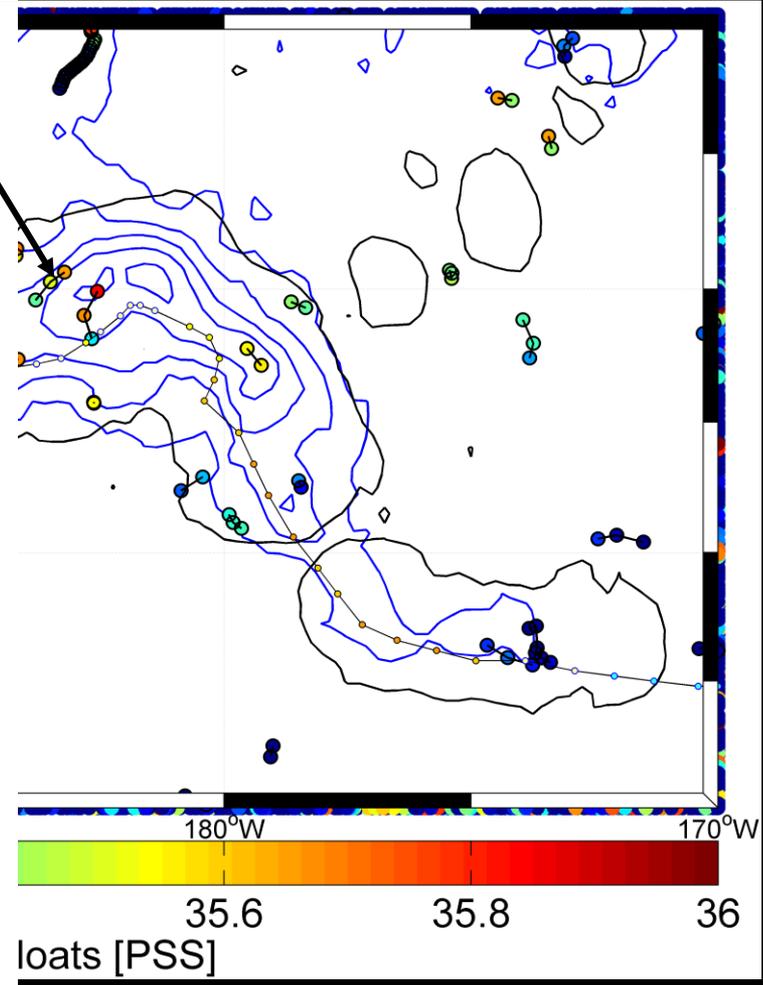
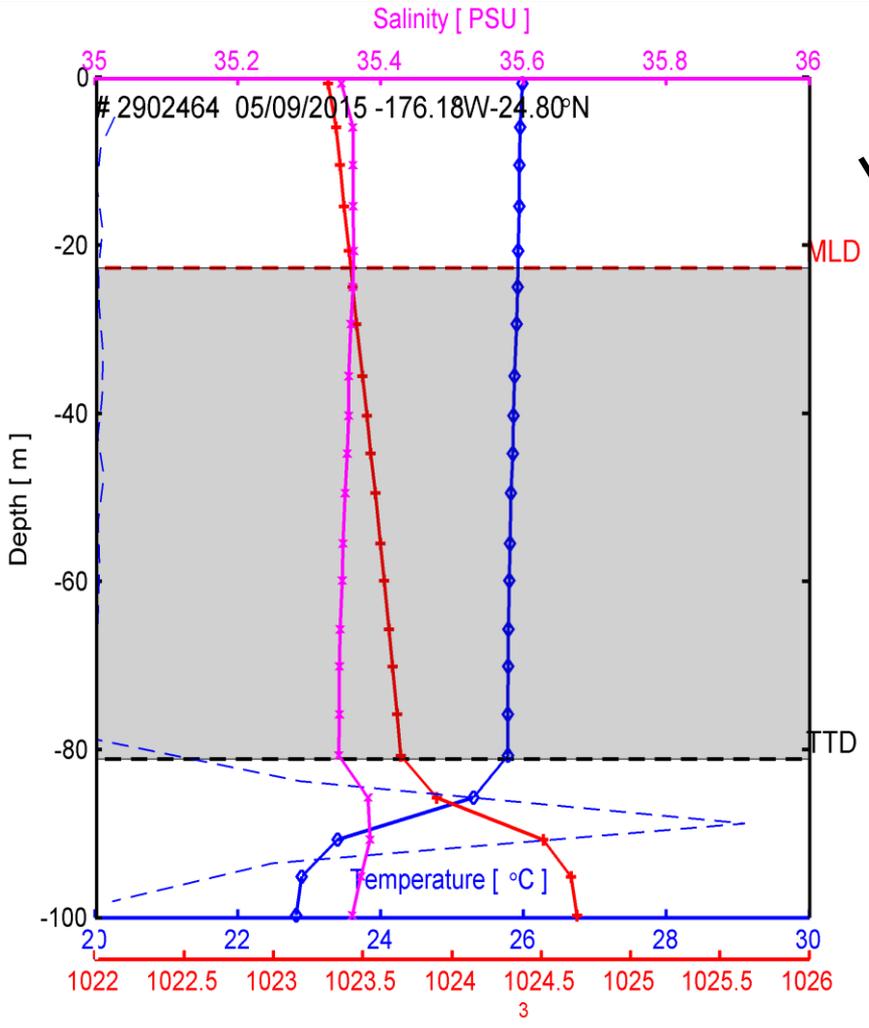


# Surface SSH wake and persistency of Igor



# ARGO Floats



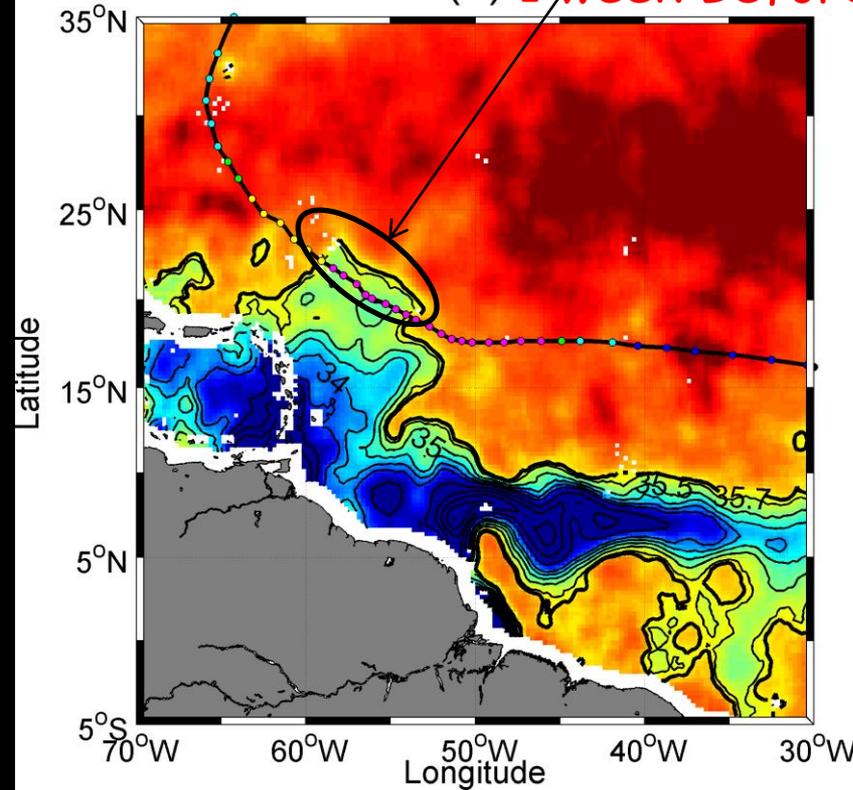




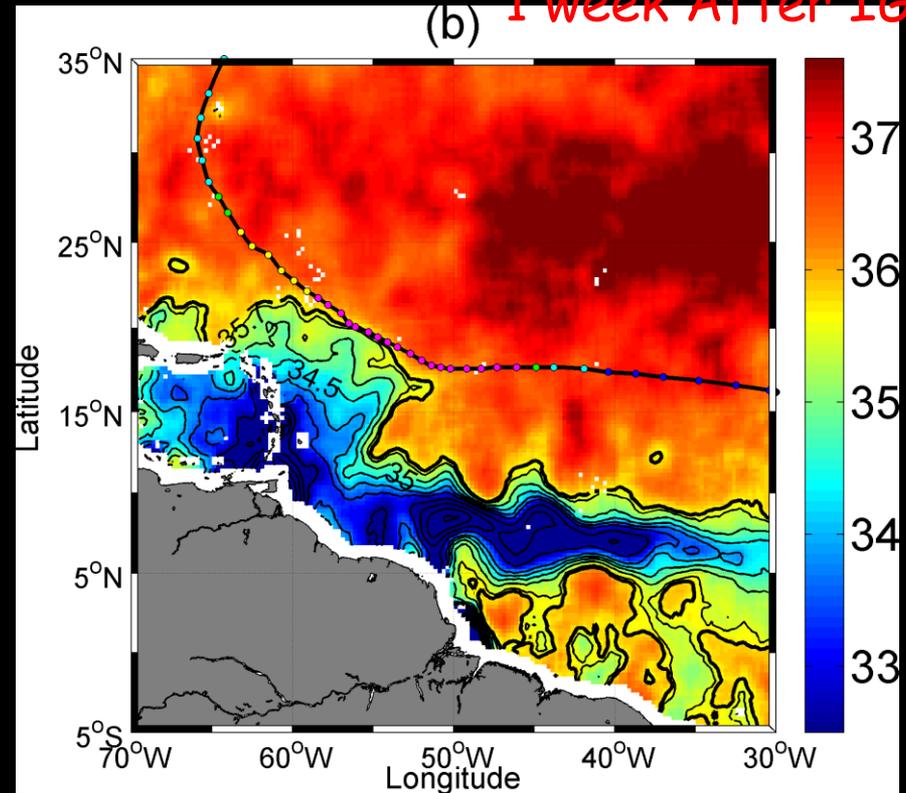
Surface area ~ 89000 km<sup>2</sup> > Lake Superior, the world largest freshwater lake: a transfer of 1 GTo of Salt in 5 days



(a) 1 week Before IGOR

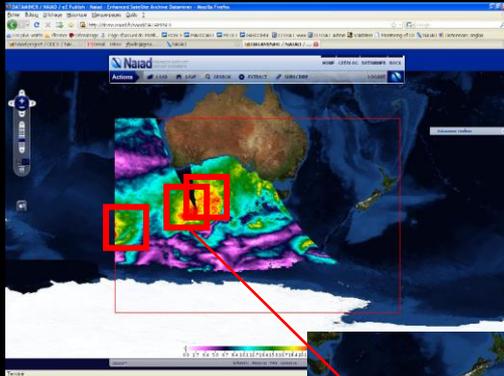


(b) 1 week After IGOR

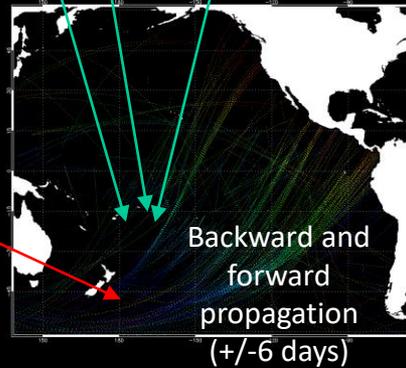
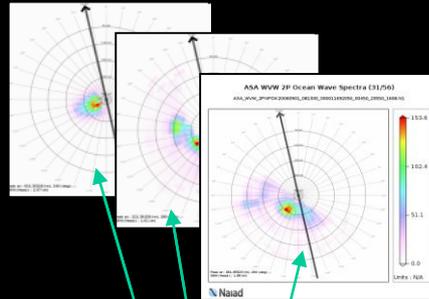
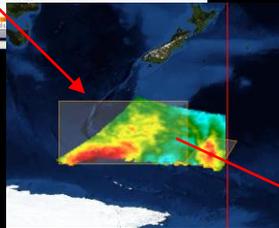


SMOS microwave satellite-derived SSS composite images of the Amazon plume region revealing the SSS conditions (a) before and (b) after the passing of Hurricane Igor, a category 5 hurricane that attained wind speeds of 136 knots in September 2010. Color-coded circles mark the successive hurricane eye positions and maximum 1-min sustained wind speed values in knots. Seven days of data centered on (a) 10 Sep 2010 and (b) 22 Sep 2010 have been averaged to construct the SSS images, which are smoothed by a 1° x 1° block average.

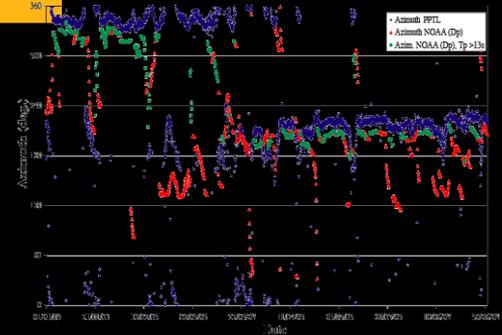
Are storms more numerous and intensifying with climate change ?



Scatterometer and SAR (20 years)



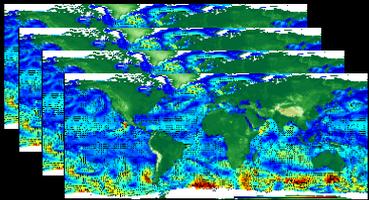
Backward and forward propagation (+/-6 days)



Seismic noise (50 years)



Buoys (30 years)



Weather model (25 years)



Feature and tracks extraction

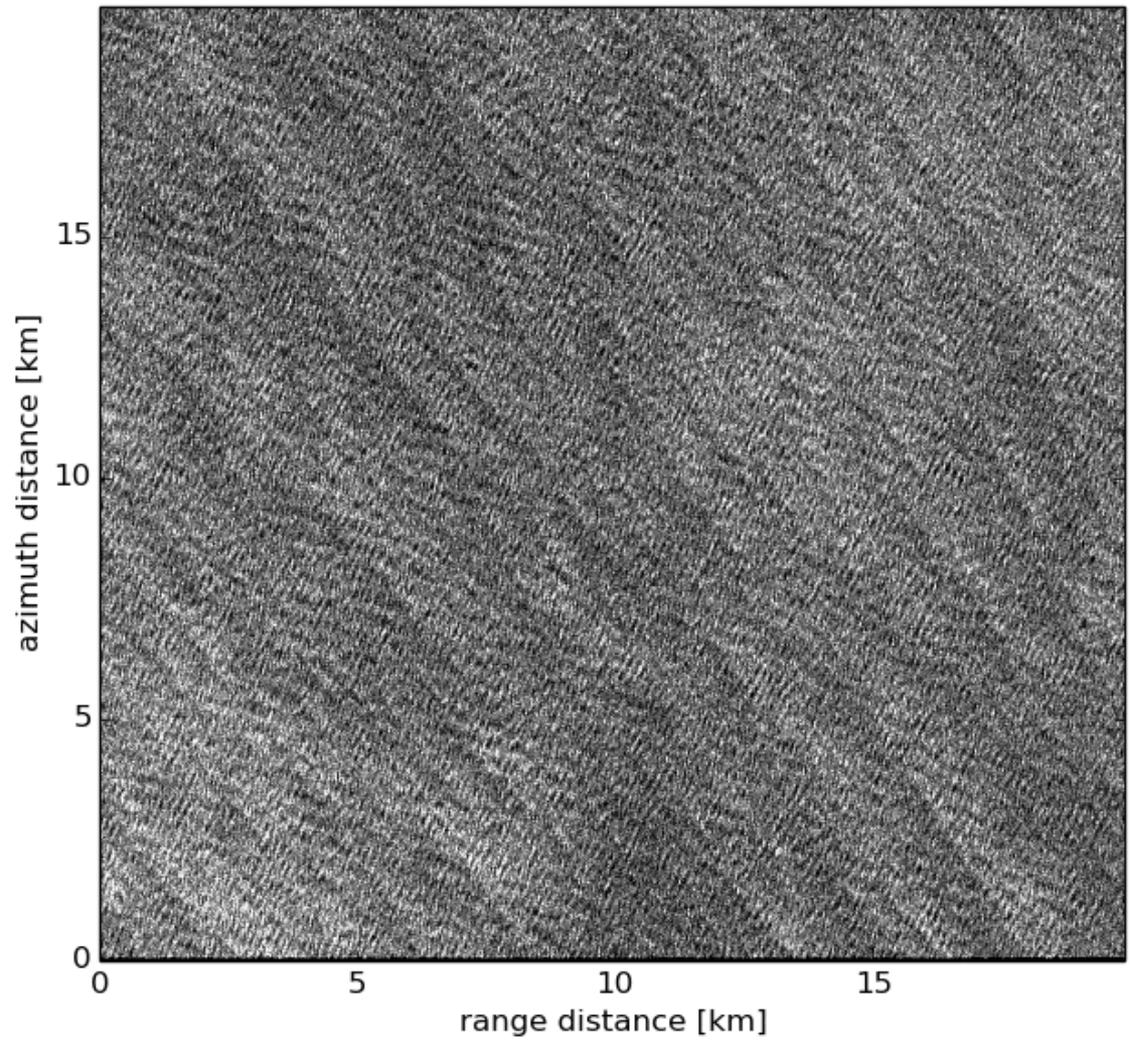


Major Hurricane History



python  
powered

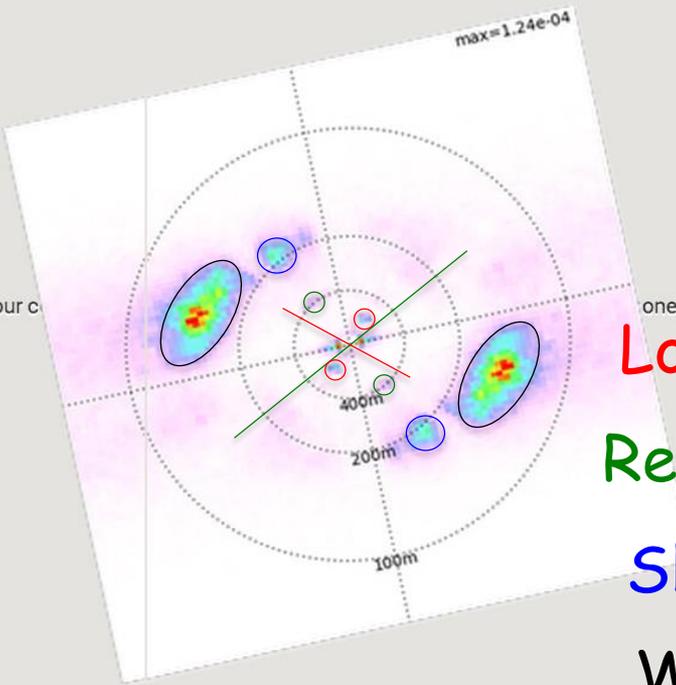
#016 / lon=-118.54 / lat=-5.90 / inc=38.24





**Products**

- SAR roughness (ESA, OceanDataLab)
- SAR cross-spectrum imaginary (ESA, OceanDataLab)
- SAR cross-spectrum real (ESA, OceanDataLab)



Long swell 800m

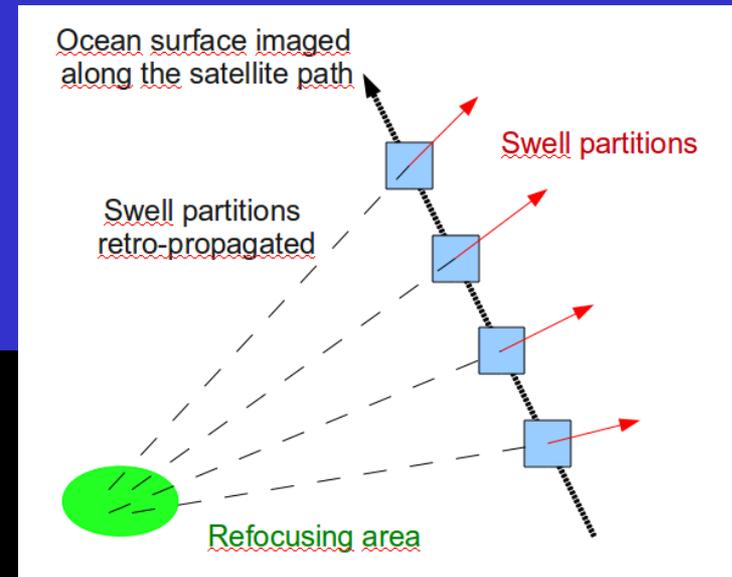
Regular swell 400m

Short swell 200m

Wind sea 150m



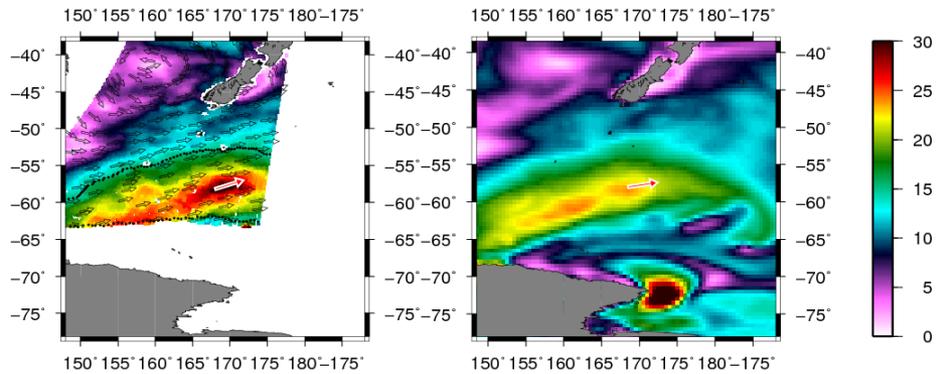
- Linear theory of swell propagation:
  - in open ocean, far from islands
  - swell propagates at group speed,  $C_g = gT_p/4\pi$
  - along great circles of direction  $\theta_p$
- compensate for sparse and track-based sampling of the swell partitions.
- Refocusing of the swell partitions
  - converge in space and time to regions systematically (96% collocations) coinciding with Storms events



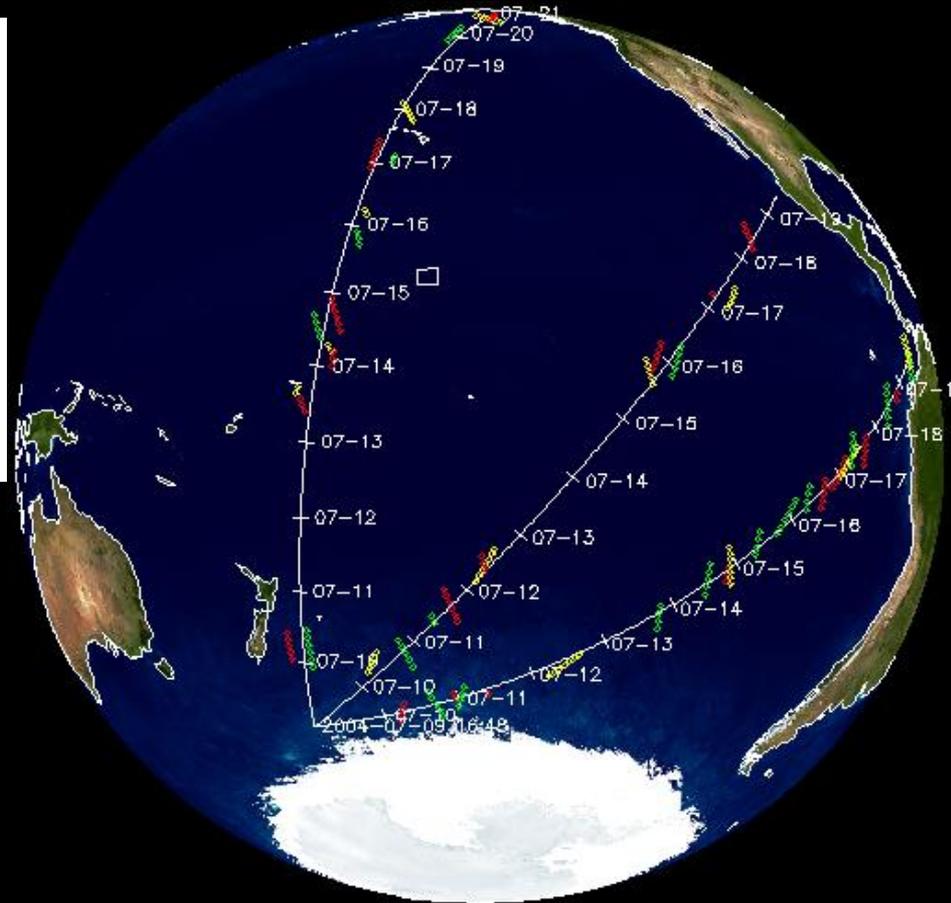


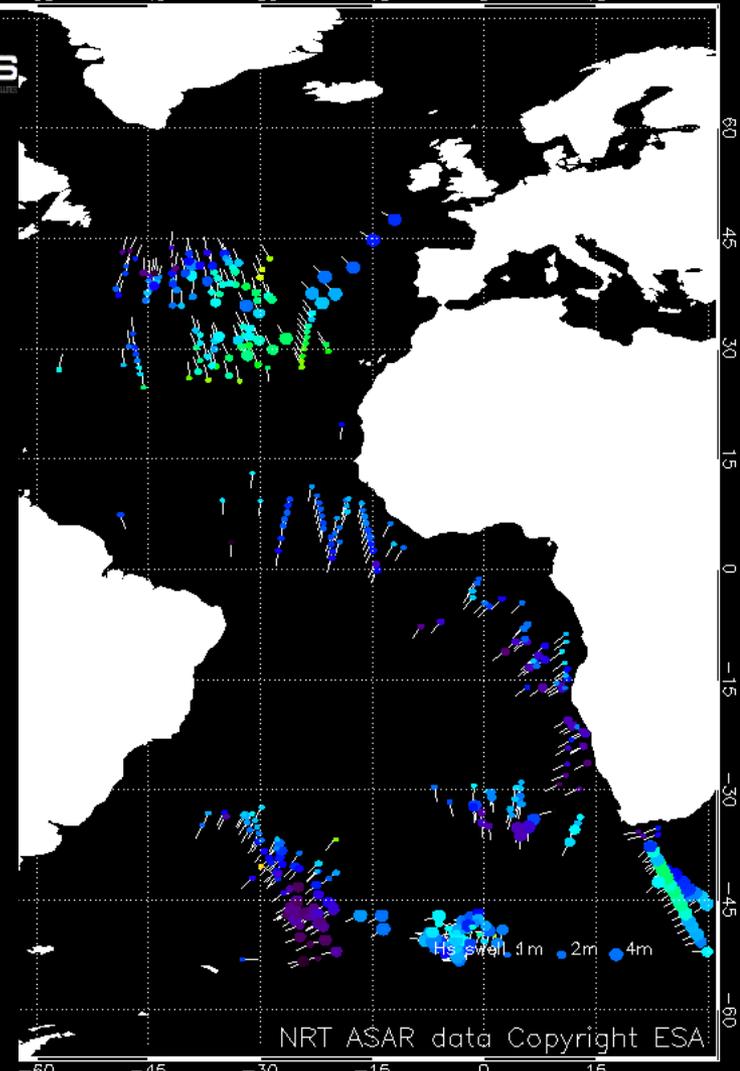
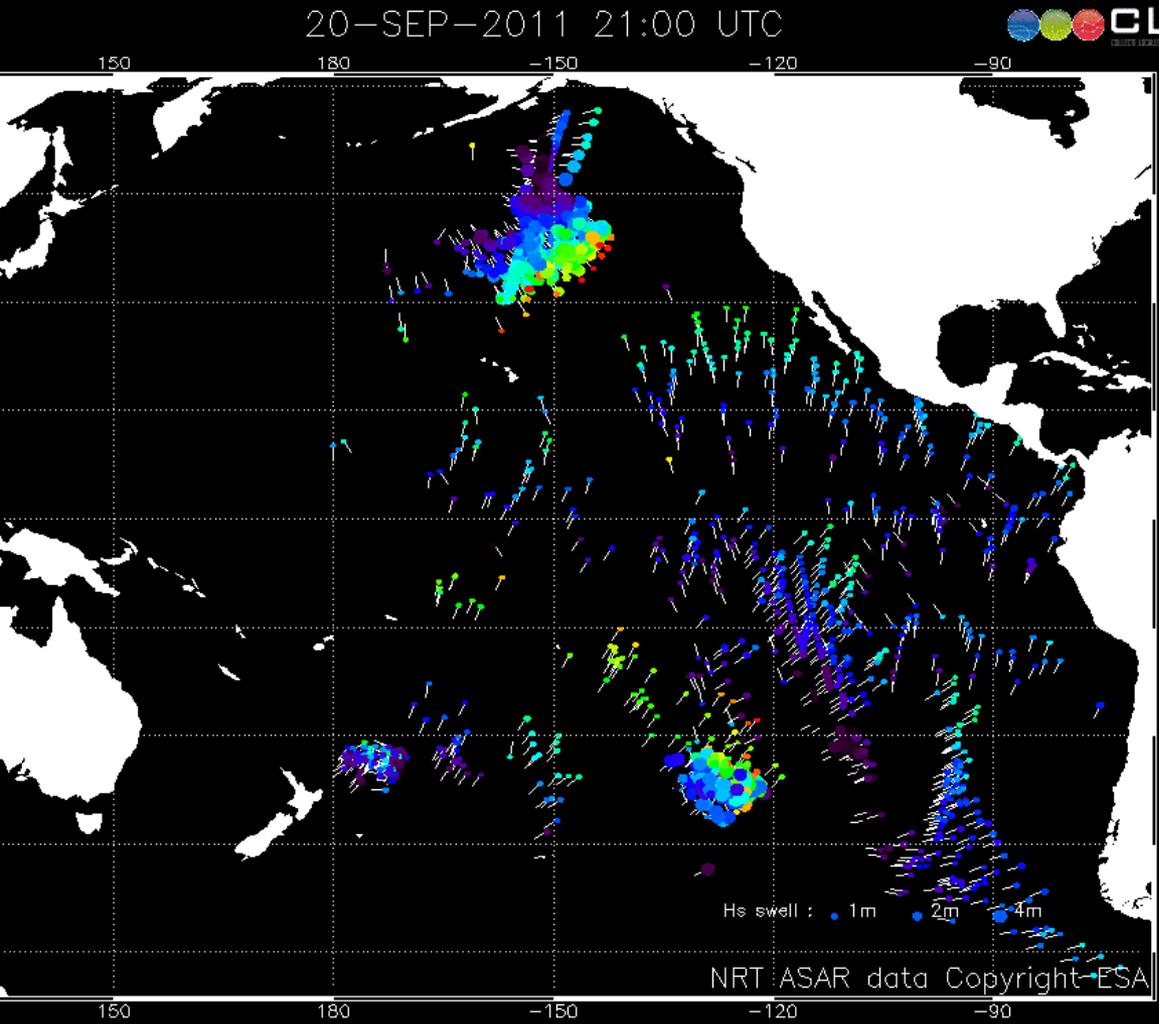
Wind speed: 31.8 m/s  
Swath date: 09/07/2004 06:25

Model date: 09/07/2004 06:00



**RED** : ENVISAT ASAR  
**GREEN** : ENVISAT RA2  
**YELLOW** : JASON ALTIMETER





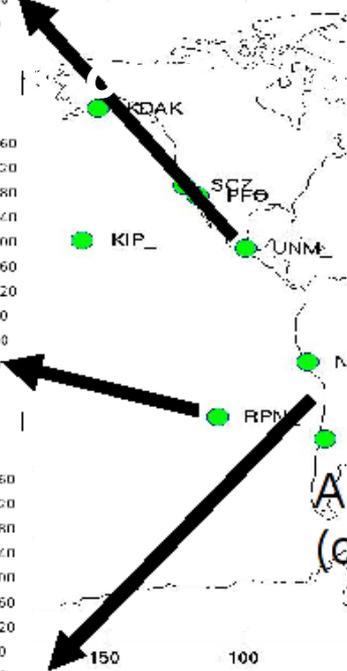
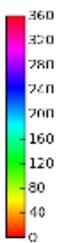
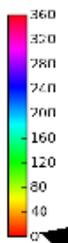
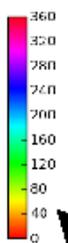
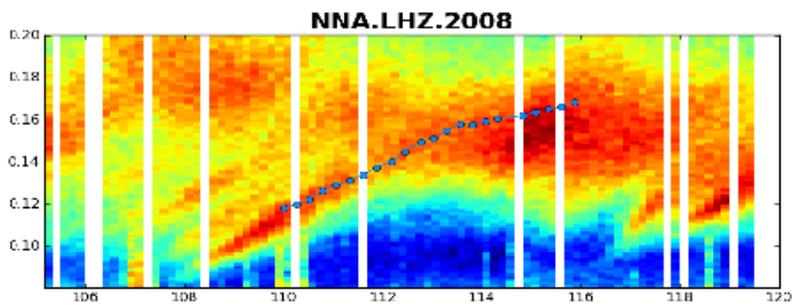
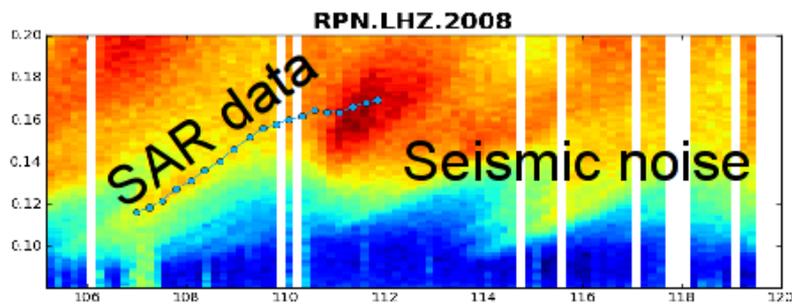
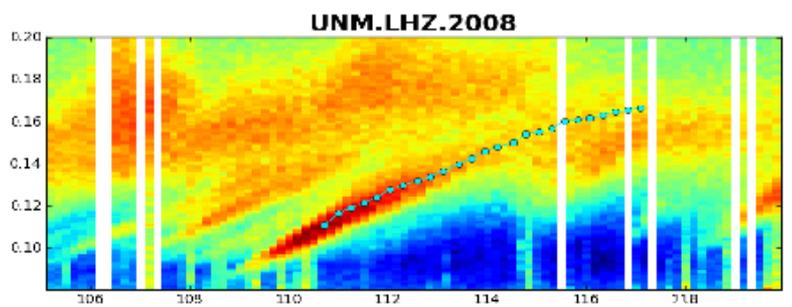
wavelength (m)

wavelength (m)

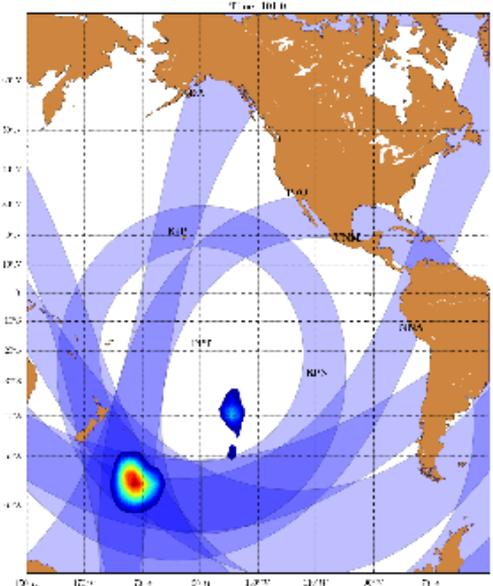




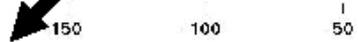
## Example of seismic - SAR synergy



Storm location  
From seismic (blue bands)

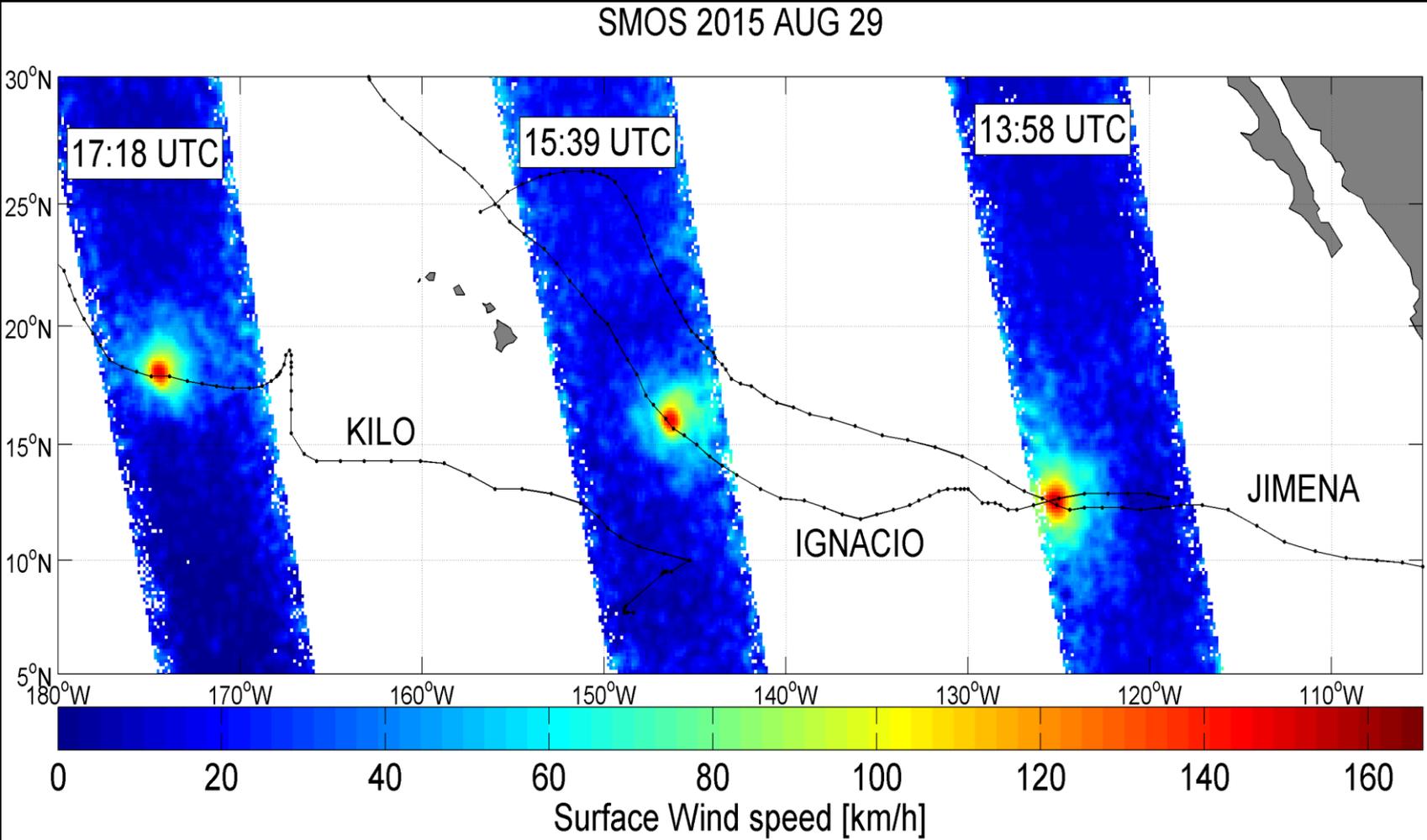


And location from SAR  
(colors)

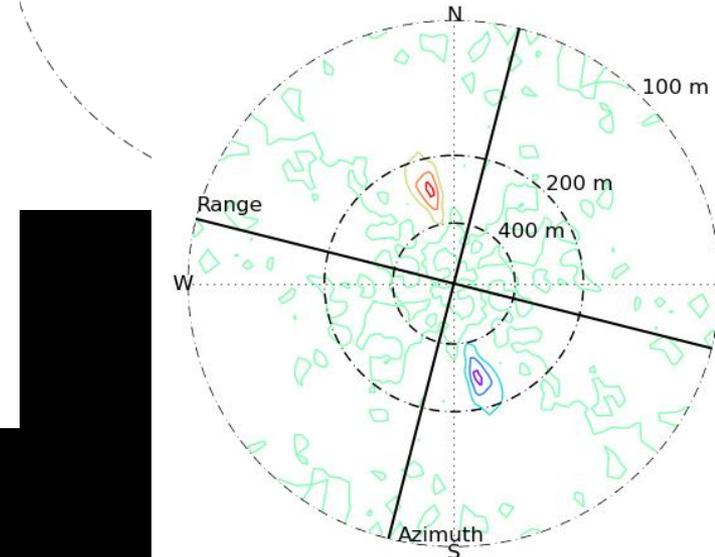
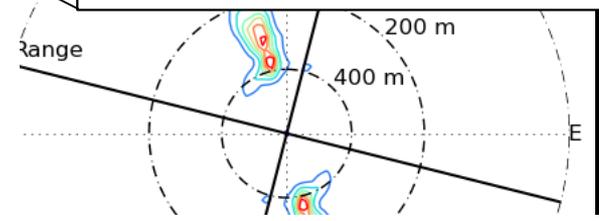
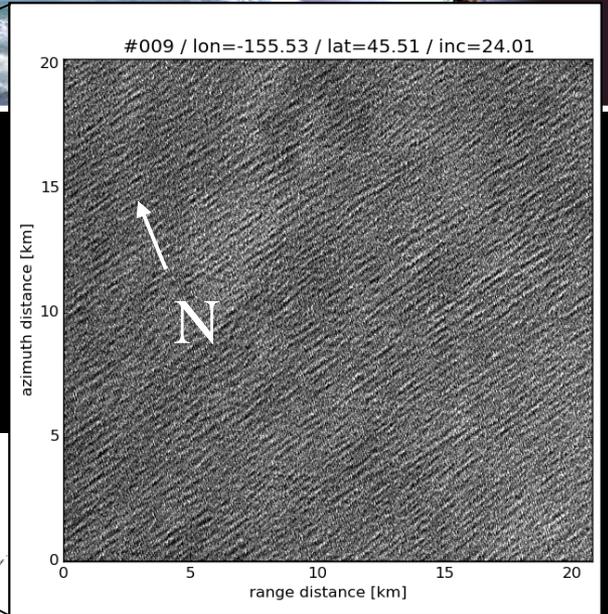
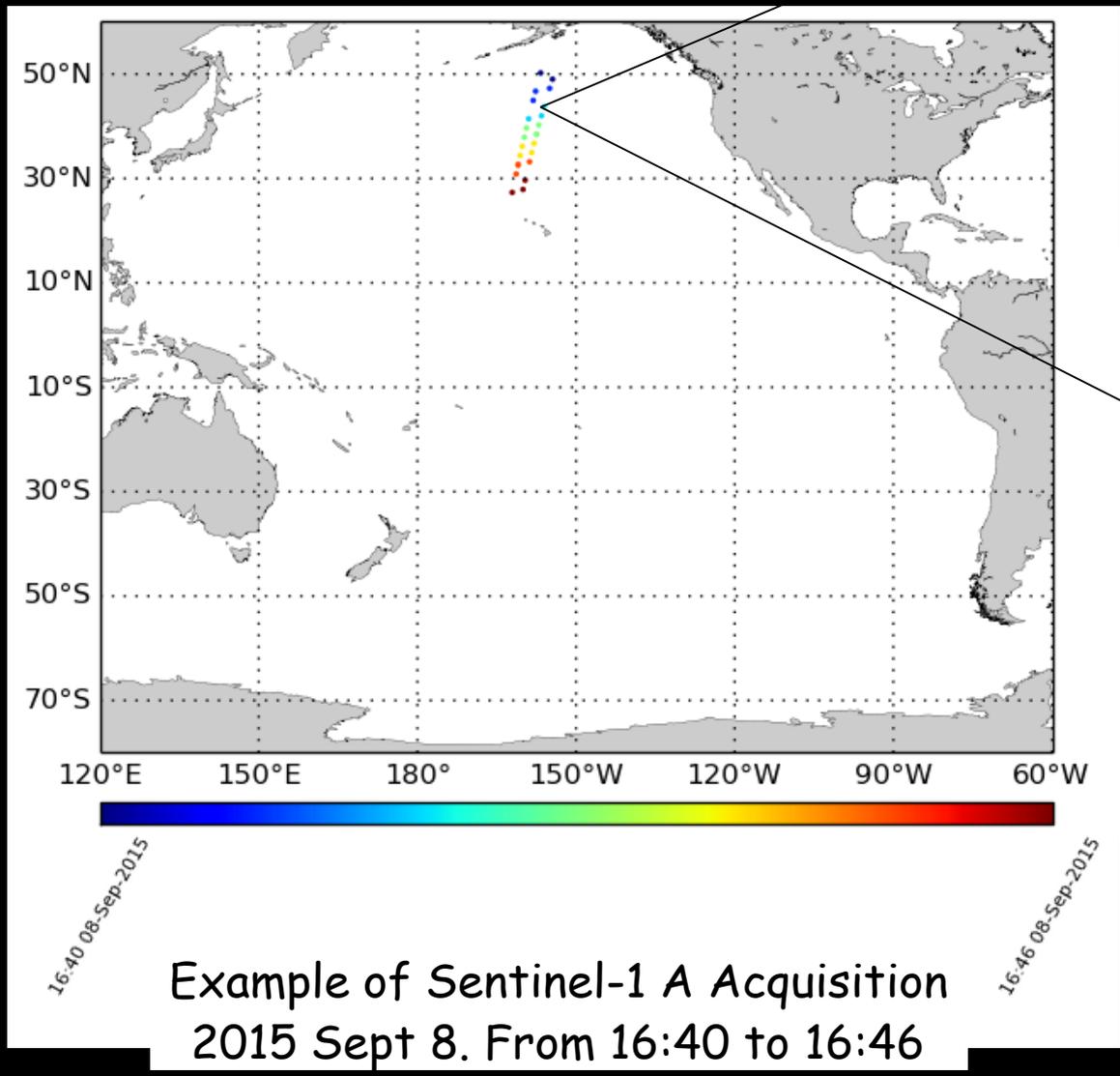




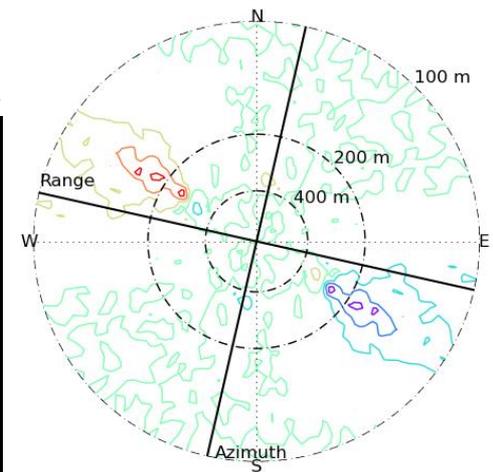
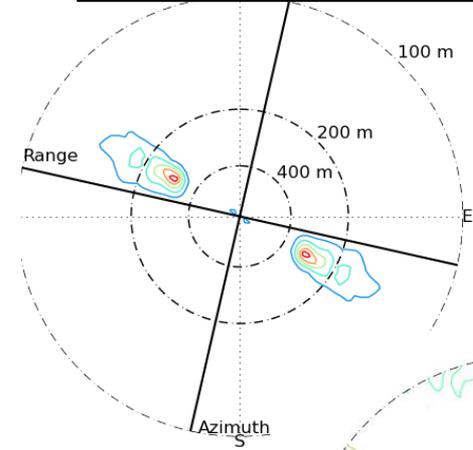
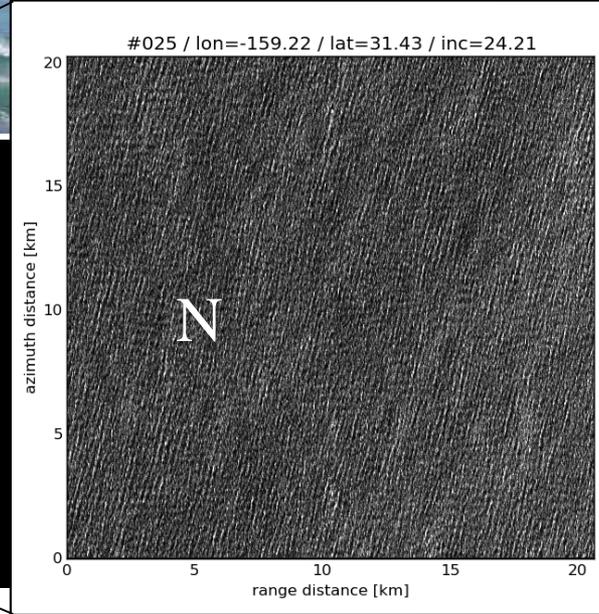
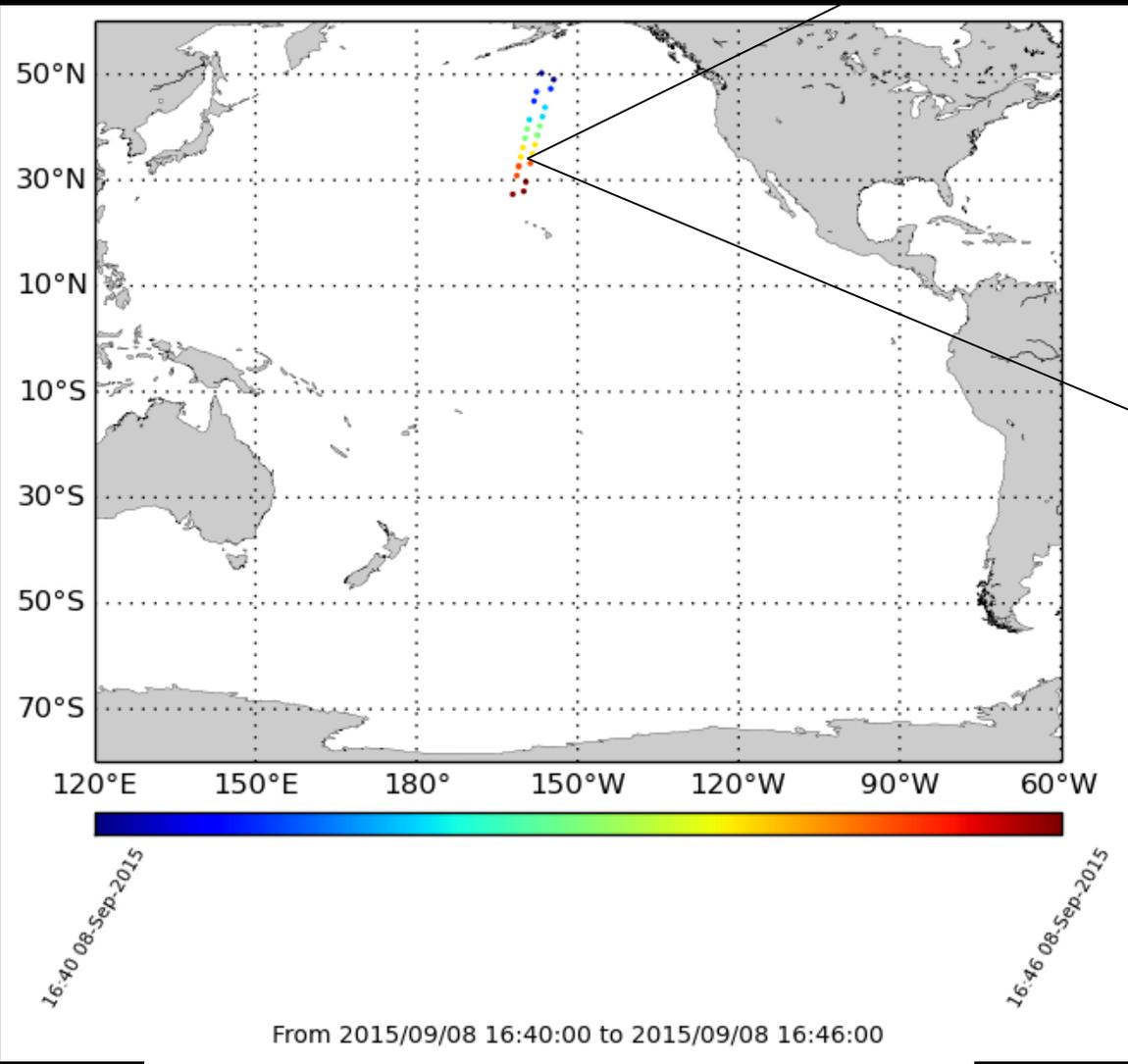
***Signatures of 3 co-evolving 2015 major Hurricanes from 22 Aug to 9 Sep in the East and Central tropical Pacific as seen from SMOS, SMAP and AMSR-2 observations (beyond others)***



# Jimena : wave generation

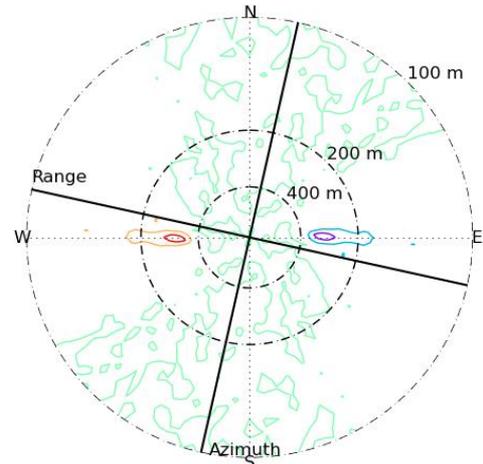
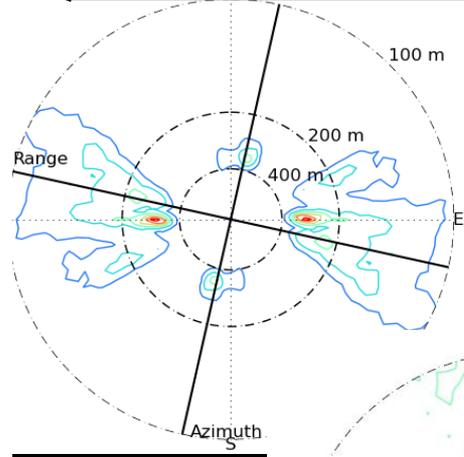
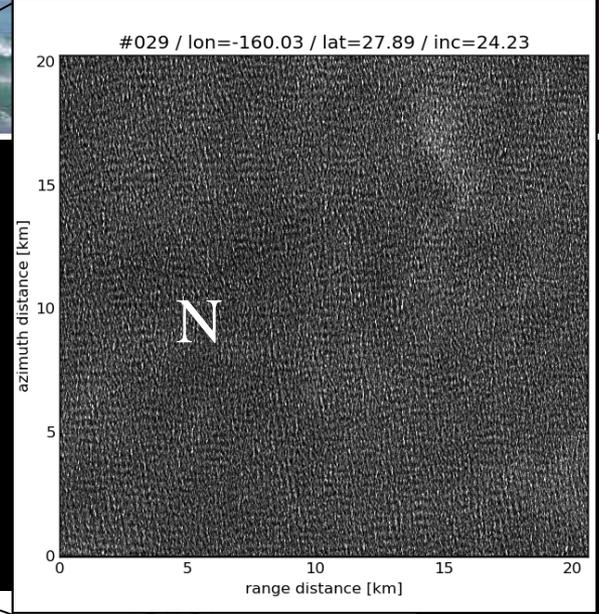
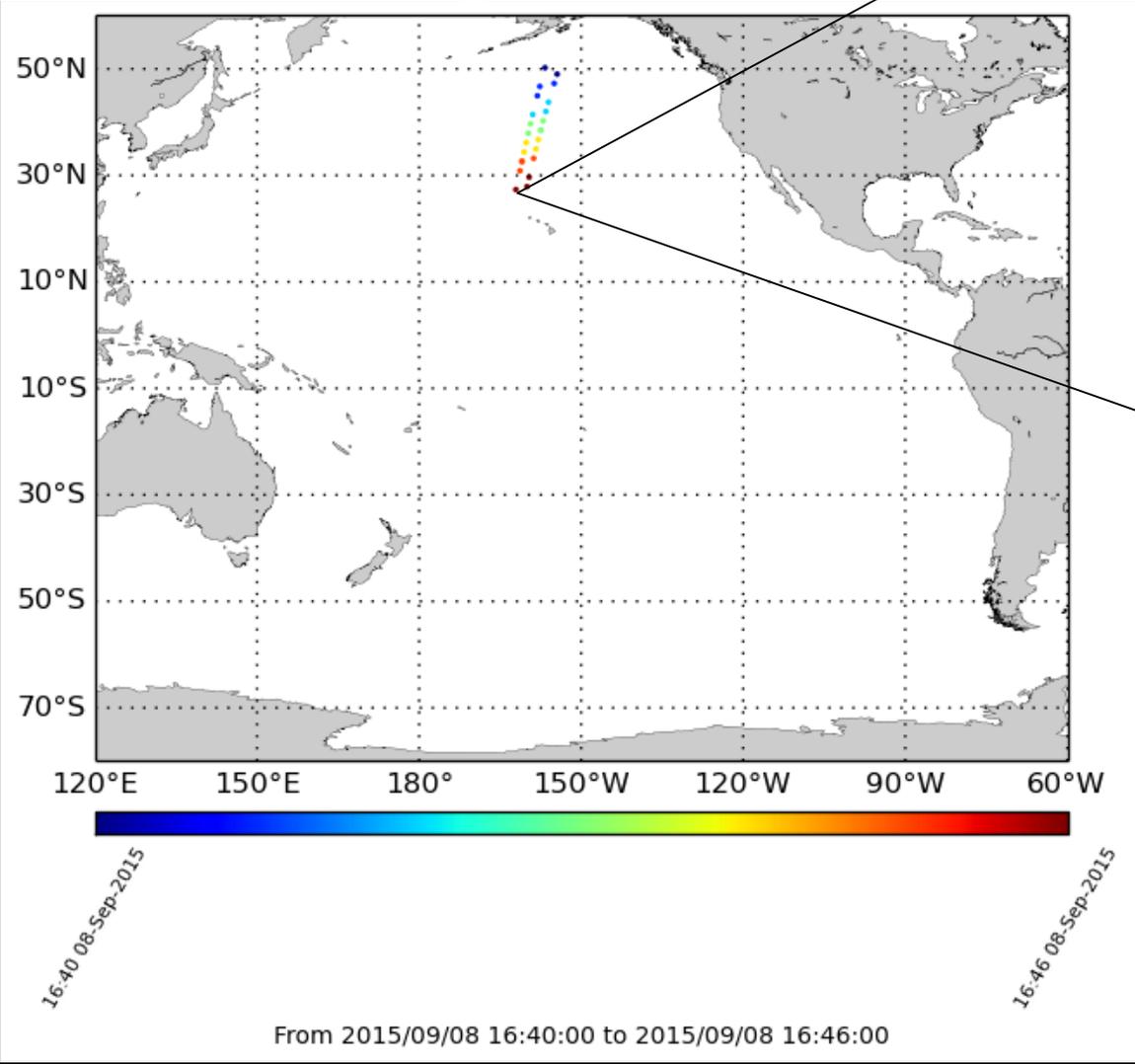


# Jimena : wave generationx

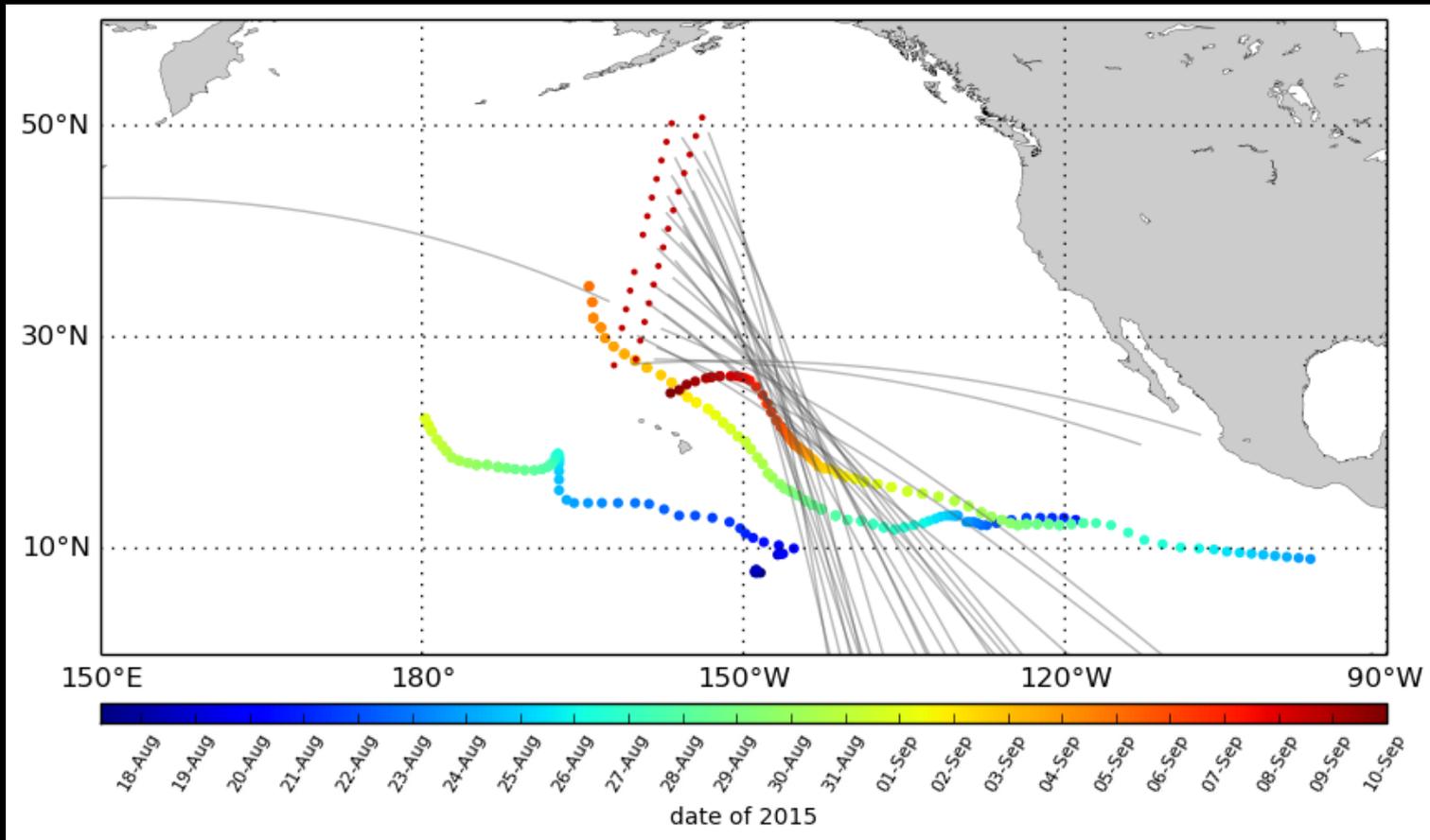
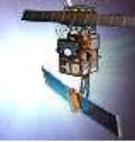


Example of Sentinel-1 A Acquisition  
2015 Sept 8. From 16:40 to 16:46

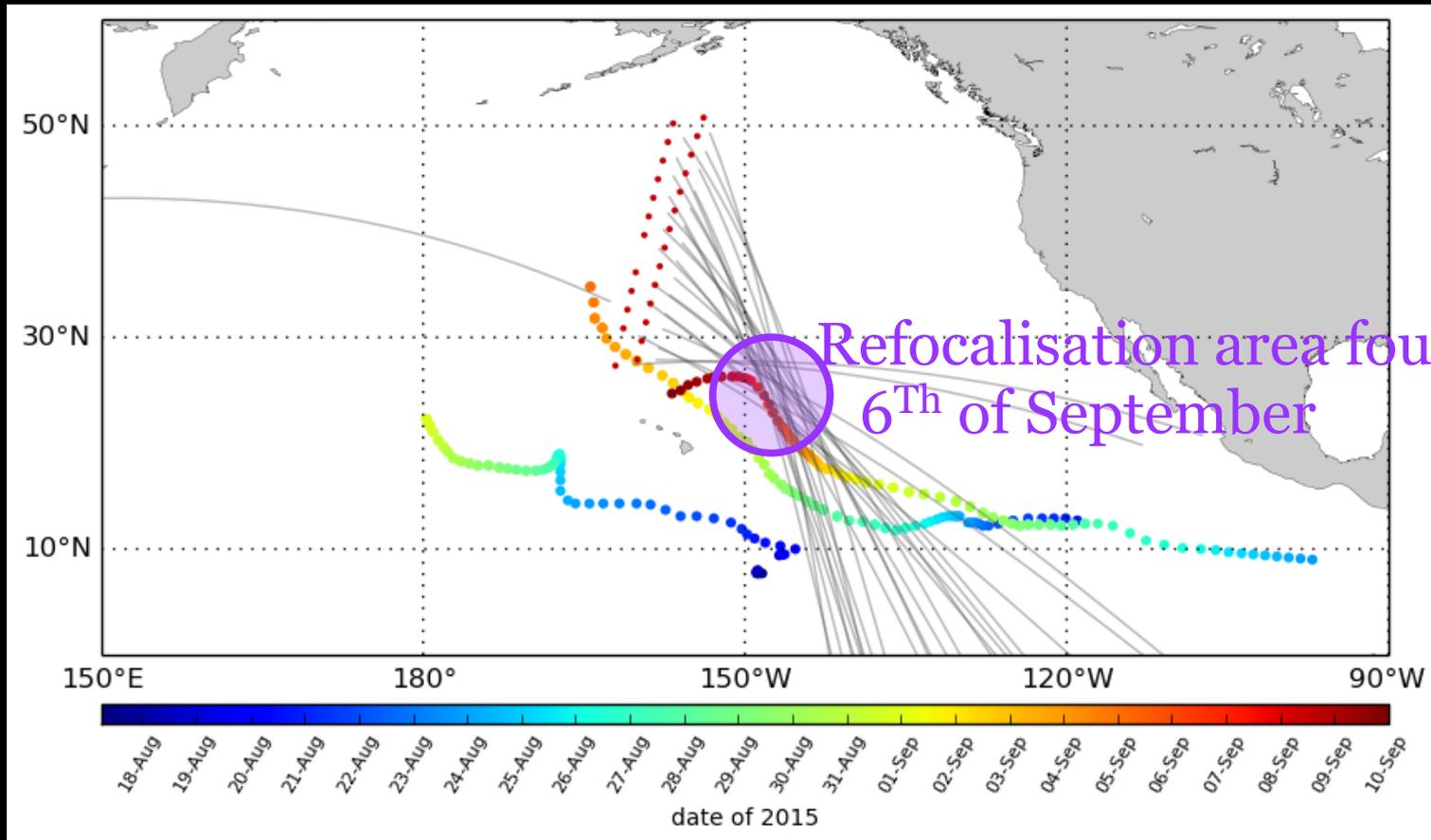
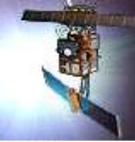
# Jimena : wave generation



Example of Sentinel-1 A Acquisition  
2015 Sept 8. From 16:40 to 16:46



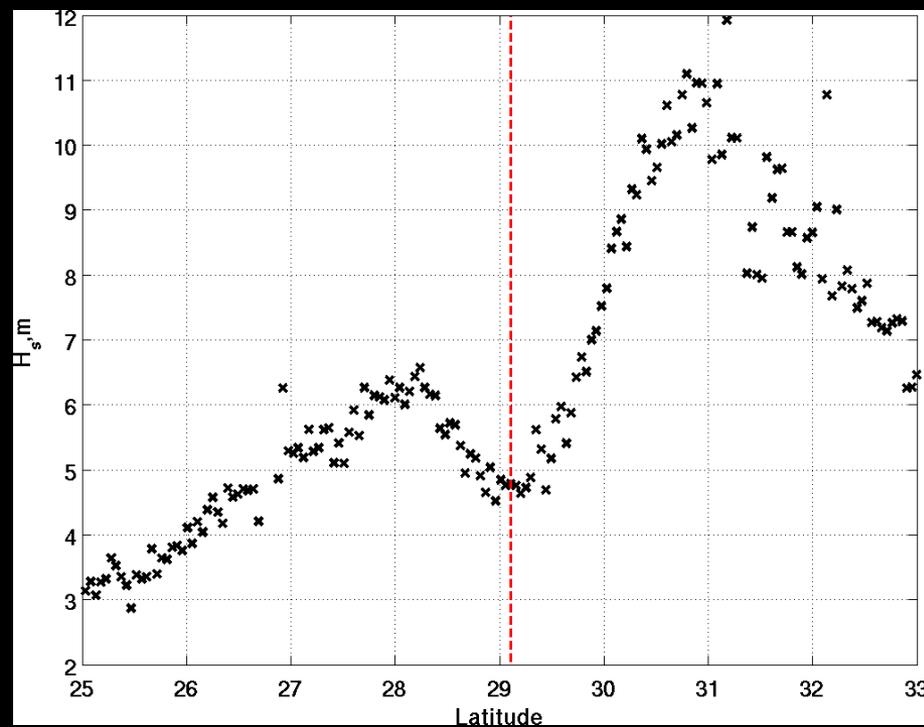
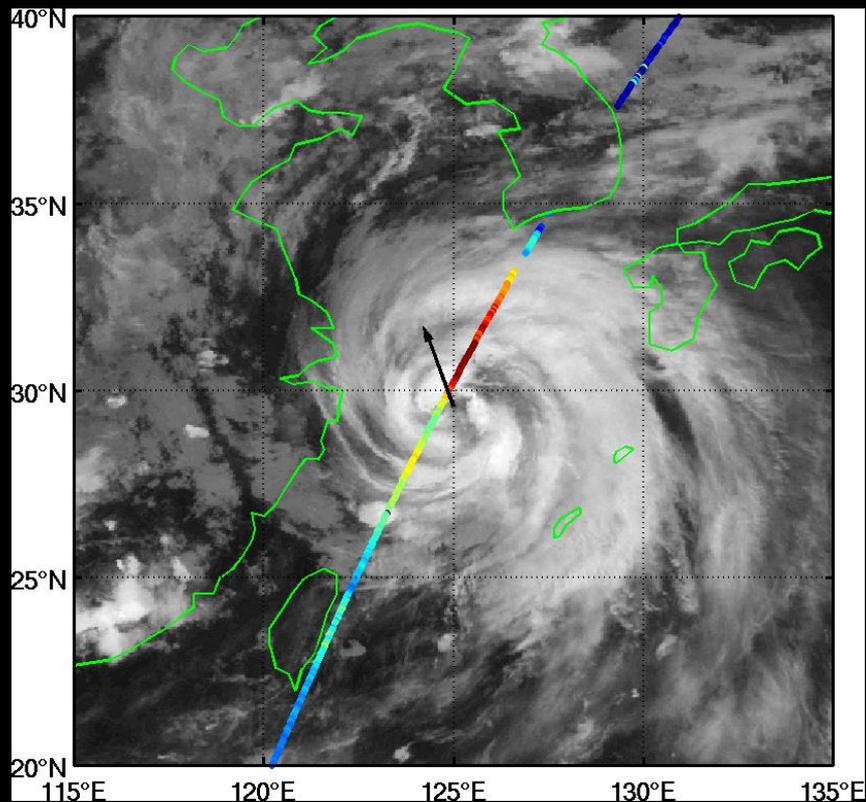
- Example of retro-propagated Sentinel-1 A Swell Measurements. Data acquired the 2015 Sept 8 16:40 to 16:46 UTC
- 3 tracks corresponding to the 3 hurricanes Kilo, Ignacio and Jimena (from left to right) are overplotted. Color code is time.



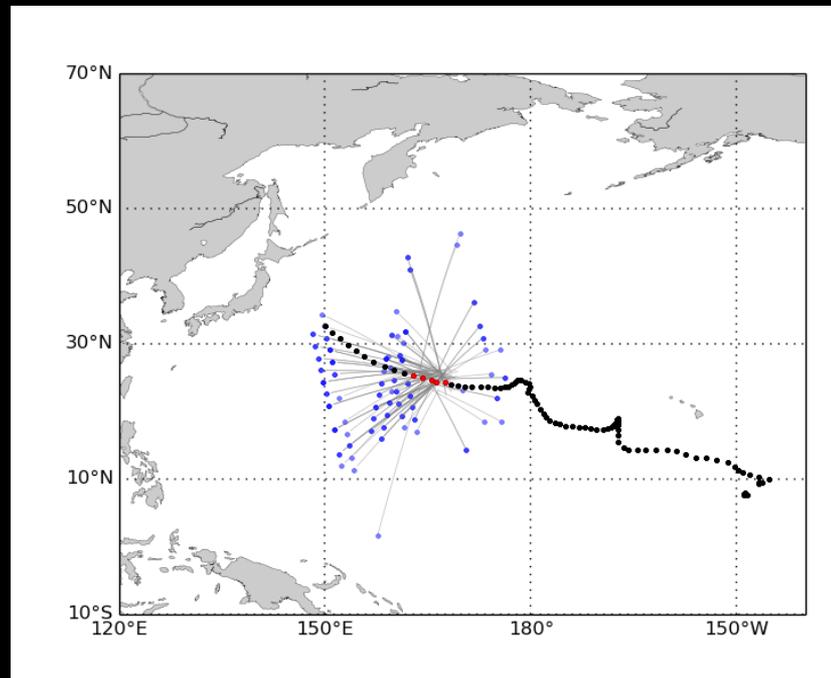
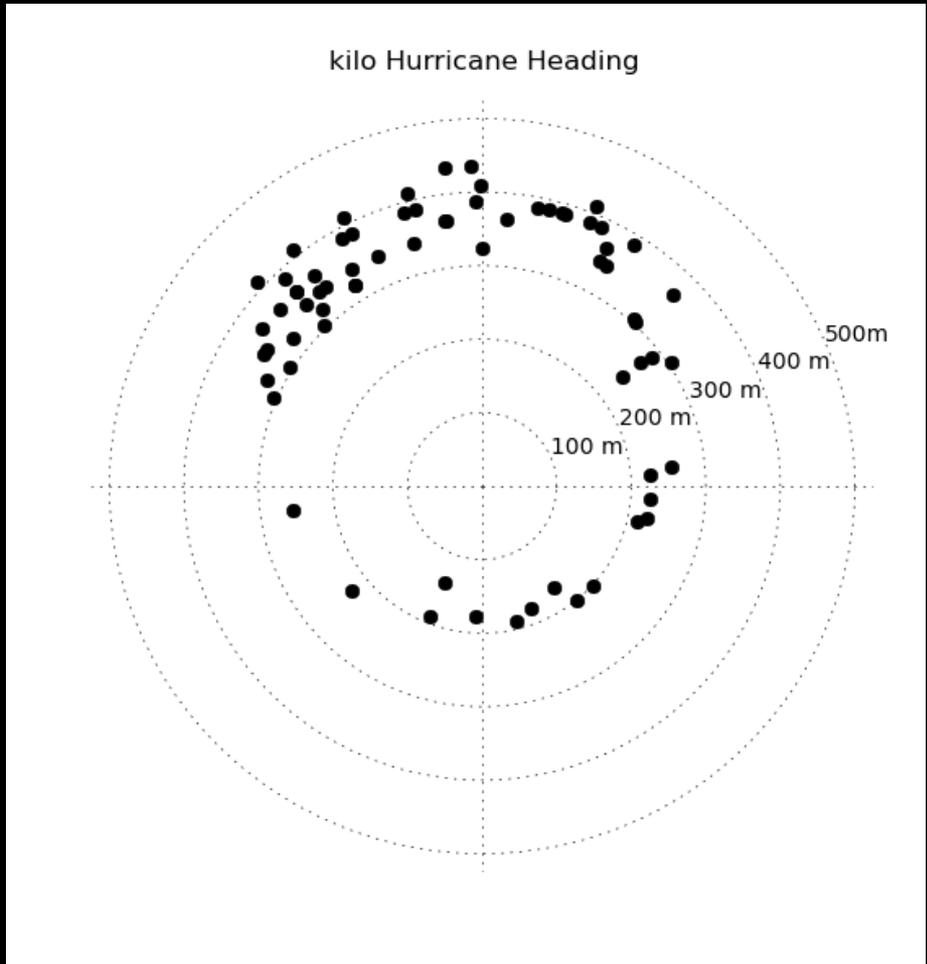
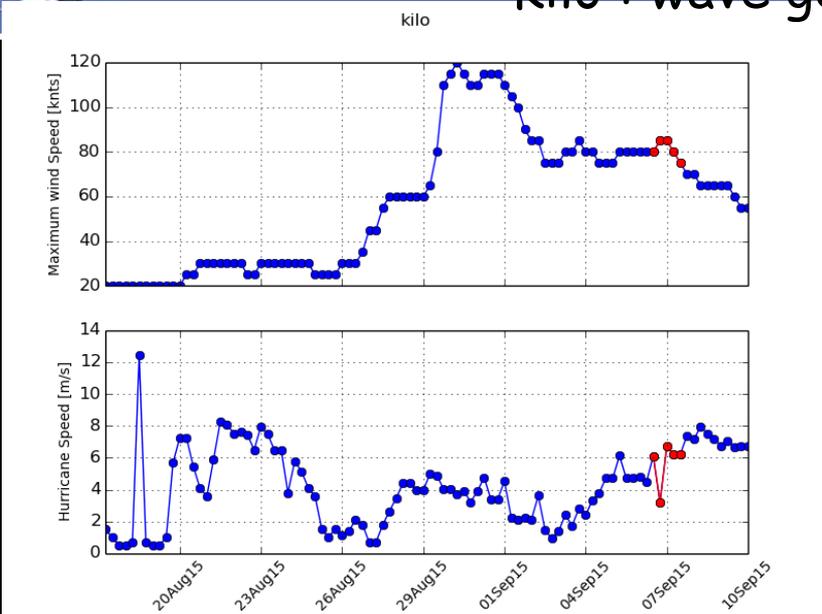
- Example of retro-propagated Sentinel-1 A Swell Measurements. Data acquired the 2015 Sept 8 16:40 to 16:46 UTC
- 3 tracks corresponding to the 3 hurricanes Kilo, Ignacio and Jimena (from left to right) are overplotted. Color code is time.
- Refocalisation area is found along the Jimena track the 6<sup>th</sup> of September. On the right hand side of the track.



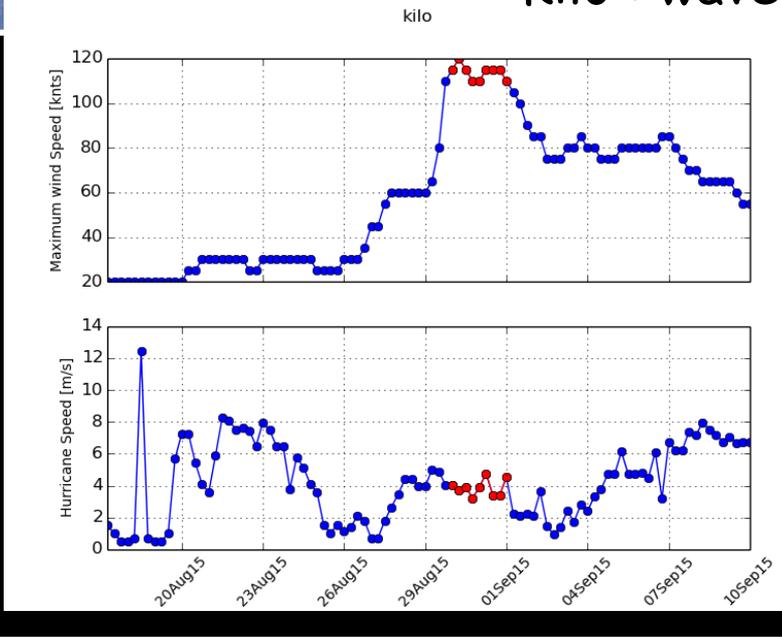
# Trapped-fetch waves - distinctive feature of TC wave field



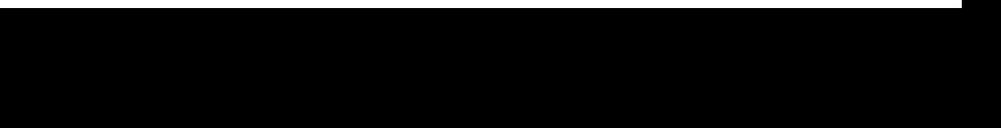
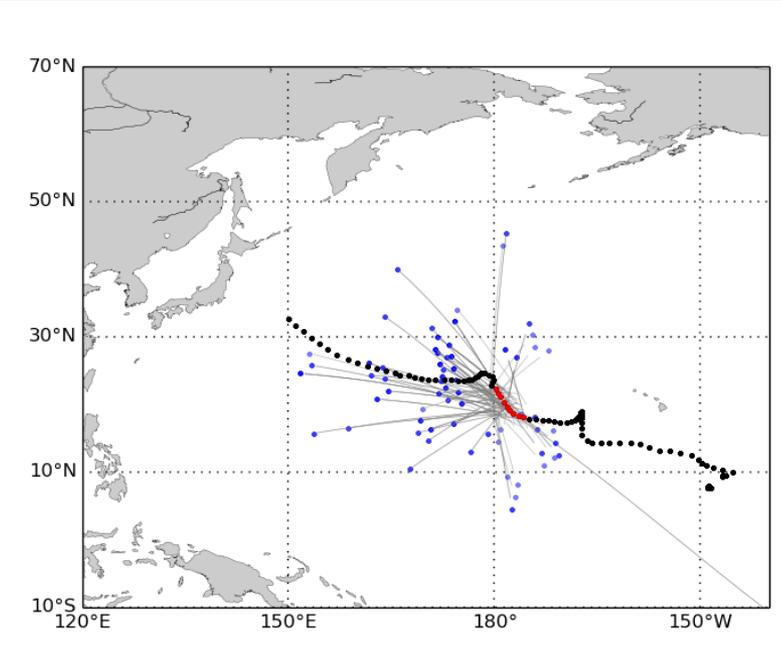
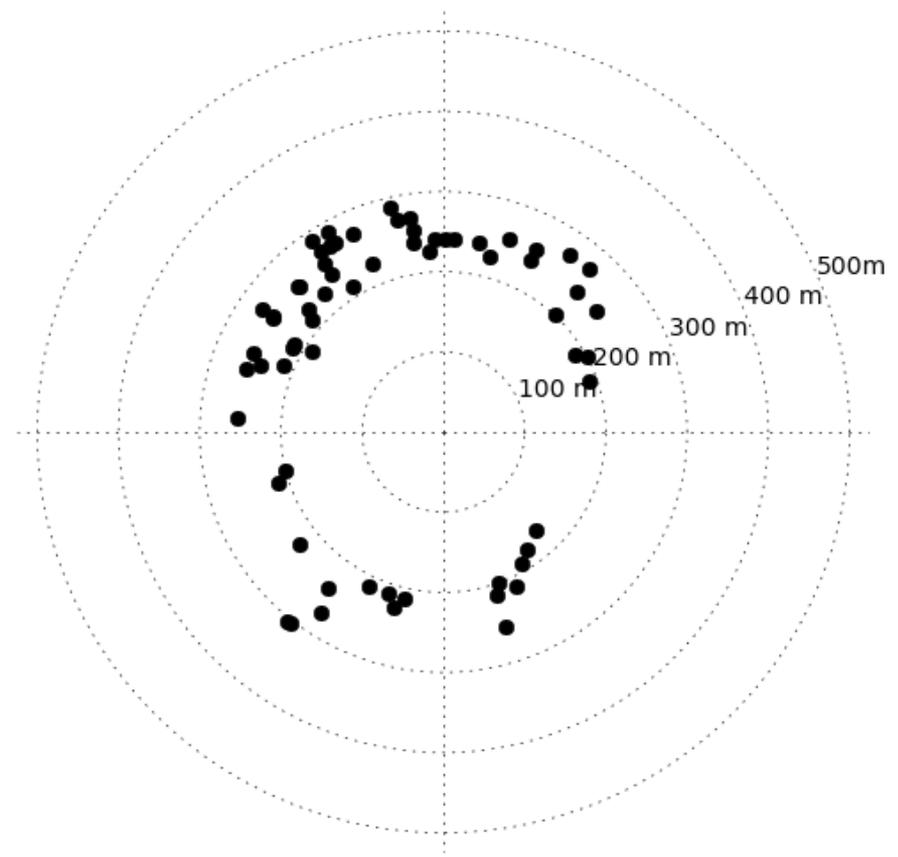
# Kilo : wave generation



# Kilo : wave generation



### kilo Hurricane Heading





## *Main message ...*

- Today ideal instrument ... (wide-swath, high-resolution, topography, roughness, Doppler, emissivity, reflectance, ...) = the combined use of observations, including in situ measurements
- Very (too) large number of spatio-temporal scales under local and non-local interactions
- Improved technologies (instruments, resolution, computer capabilities, storage, dissemination) all contribute to improved combined analysis
- Theoretical frameworks and numerical simulations can be used to assess the causes and contexts of the different observations (including sensor physics, observability conditions and instrument capabilities), to refine dynamical/statistical gap filling methods
- New challenges, new altimeter instruments (SARAL, Sentinel-3, SWOT, ..., CubeSat opportunities), possible new high-resolution microwave instruments (10-20 km), Doppler measurements to infer sea surface currents (SAR and/or RAR-SKIM or DopplerScat), and combined roughness contrasts as local quantitative proxies to trace strong surface gradient areas



# Opening the Pandora's box ?

Archiving data leads to very large heterogeneous and multimodal databases

Data assimilation is growing in response to the growth of data collected, but (personal opinion) tremendous amounts of information still remain hidden in data archives.

Knowledge trees and complex algorithms are essential to avoid the Google's principle, i.e. pertinence = popularity

Research efforts to be concerned with the definition of adequate exploratory processes to detect relevant patterns in large, heterogeneous, multidimensional observation data sets with different resolutions to better approach complex spatial and/or temporal dynamics of the ocean system.

LETTRE XX.

De M. JEAN SPOONER,  
A. B. S.<sup>t</sup> JOHN'S CAMBRIDGE.

Gènes 1.<sup>er</sup> Mai 1822.

Vous m'avez fait l'honneur, M. le Baron, de me demander un extrait du mémoire que j'ai pris la liberté de vous communiquer relativement à un phénomène lumineux qui se montre sur la mer lorsque le soleil ou la lune y donnent dessus (\*), et que vous voulez avoir la bonté d'insérer dans votre *Correspondance*

L'équation en question est:

$$\frac{a^2}{a^2 + x^2 + y^2} + \frac{2 \cos. Z a}{\sqrt{a^2 + x^2 + y^2}} + \cos.^2 Z = \frac{2 \cos.^2 J + 2 \cos.^2 J . a . \cos. Z}{\sqrt{a^2 + x^2 + y^2}} - \frac{2 \cos. J \sin. Z . x}{\sqrt{a^2 + x^2 + y^2}}$$

Par la quatrième observation.

$$A^2 = \frac{.0000013 + .0005593 + .0585262}{2 + .0005593 - 1 . 9281164} = \frac{.0590868}{.0724429}$$

De-là,  $\log. A = 1.95574725 = \log. \cosin. \text{ de } 25^\circ 26'$

