



# **Objective Determination of Feature Resolution in an SST Analysis**

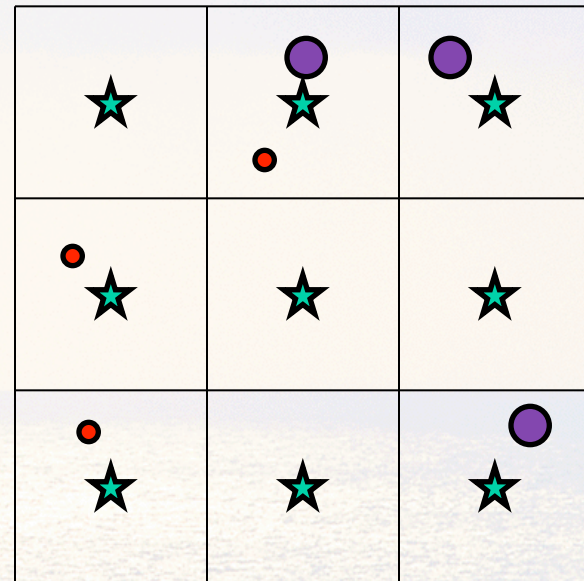
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**Dudley B. Chelton (Oregon State University)**



# What is an Analysis?

- An analysis is a field produced on a regular grid (★) usually using irregularly spaced data
- The data (●, ○) are weighted by distance to the analysis point and by a noise-to-signal ratio





# Input SST Data

- **In situ data: directly measured SST observations from ships and buoys**
- **Remotely sensed satellite Infrared SSTs**
  - 1-9 km resolution
  - Observations must be cloud free
  - E.g., AVHRR (1981-present)
- **Remotely sensed satellite Microwave SSTs**
  - 50 km resolution
  - Observations can be made through clouds but must be precipitation free
  - E.g., AMSR (2002-present)



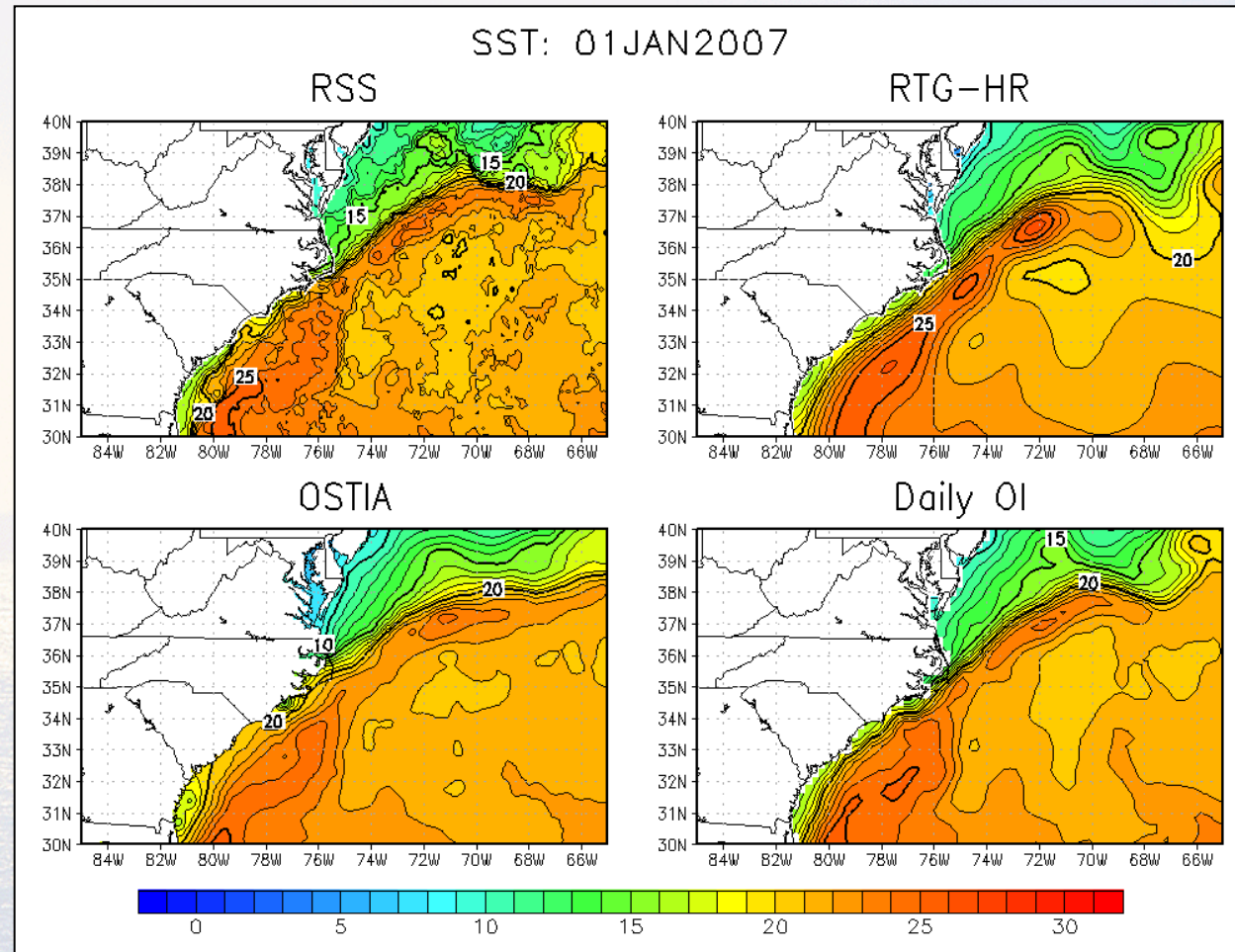
# Background

- **GHRSSST (The Group for High Resolution SST) includes many high resolution SST analyses**
  - **There are differences in input data, grid resolution, analysis procedures**
  - **There are important differences in analyzed SSTs and analysis resolution**
- **Reynolds and Chelton compared 6 SST analyses for 2006-08 to try to identify analysis problems and determine whether any of the analyses are superior**



# SST Analyses, 1 January 2007

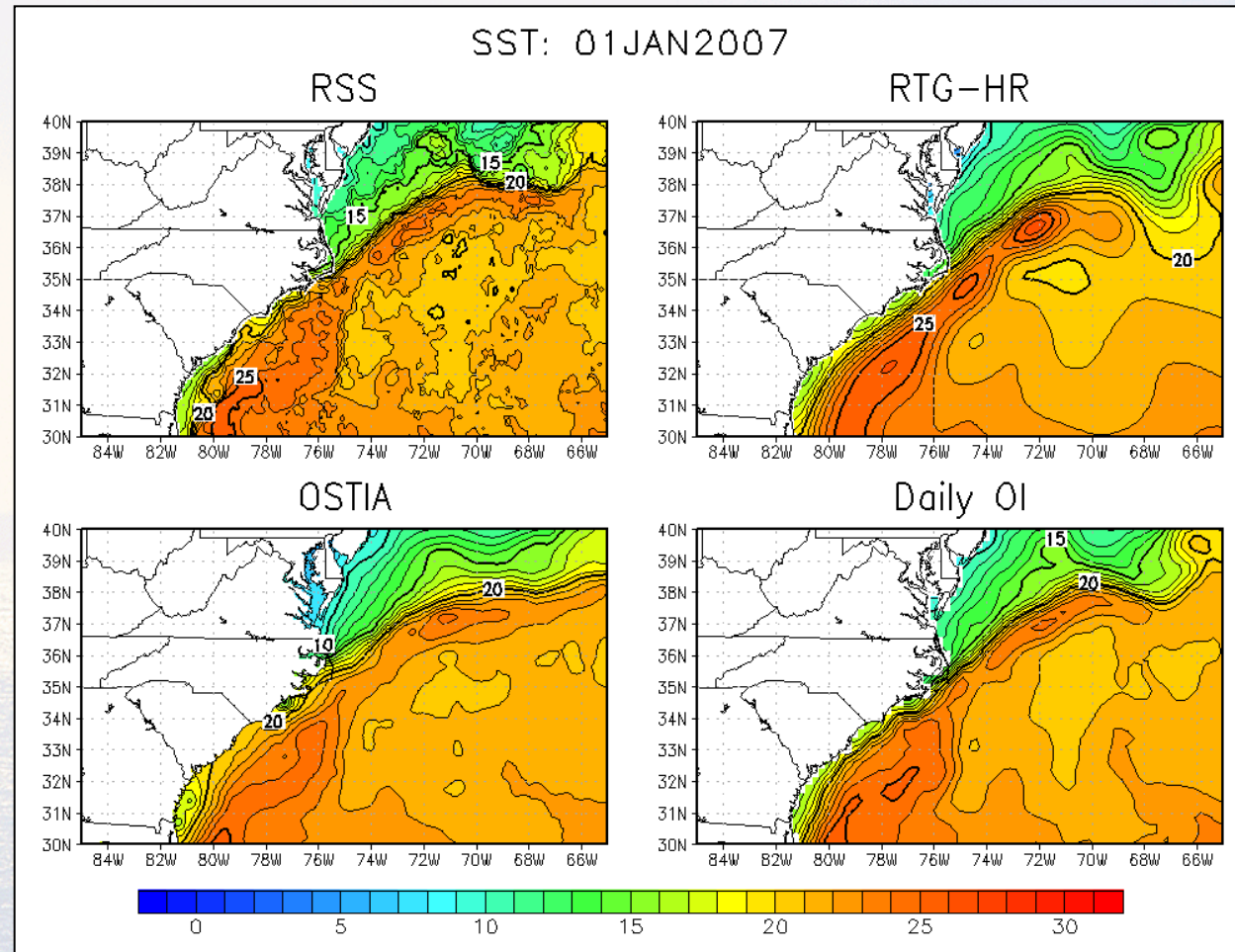
- **RSS OI**
  - ( $\sim 1/11$ )° grid
- **NCEP RTG-HR**
  - ( $1/12$ )° grid
- **UK OSTIA**
  - ( $1/20$ )° grid
- **NCDC Daily OI: (AMSR + AVHRR)**
  - ( $1/4$ )° grid
- **Spatial scales differ**
- **Differences can exceed 5°C off coast**





# SST Analyses, 1 January 2007

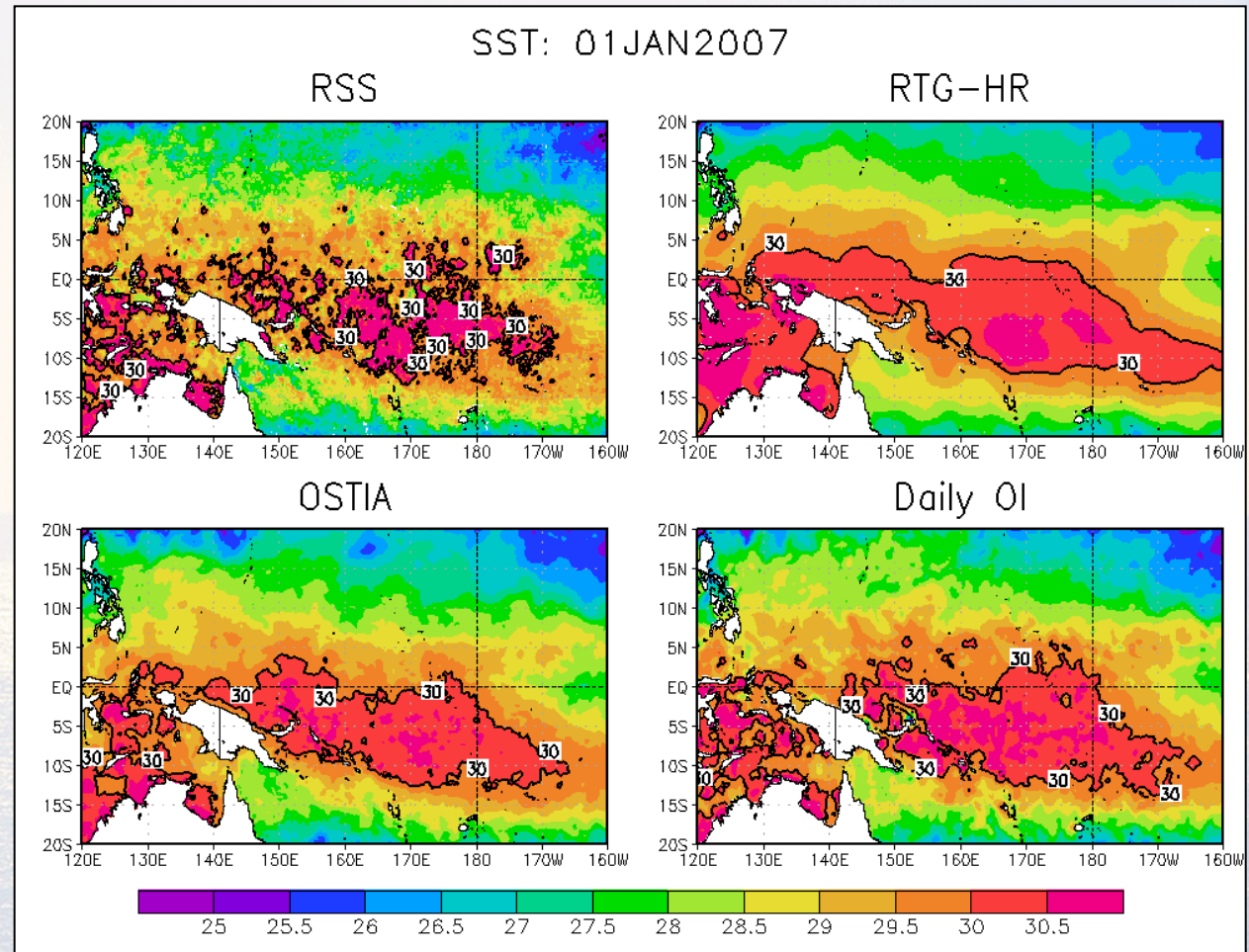
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- **NCDC Daily OI: (AMSR + AVHRR)**
  - ( $1/4$ )° grid
- **This is a daily average**
  - What spatial scales are justified?





# Results

- **There is no clear correlation between resolution and spatial grid size**
  - **GHRSSST and other analysis producers emphasize grid resolution over actual analysis resolution**
  - **Users are confused about the difference**
- **If the analysis resolution is pushed beyond the spatial and temporal resolution of the data: the apparent SST signal is simply just noise**
- **How can we objectively define the analysis resolution?**



# Experiments with Synthetic Data

- Analyze the complete SST fields produced by an ocean general circulation model (OGCM) on a high-resolution grid over a given time period
  - Assume these fields are “truth”
  - Sub-sample the full SST field using actual satellite observation times and locations
- Use the full and sub-sampled (reduced) SST fields as “Data”
- Produce SST analyses of the full and reduced SST data sets
  - Compare the results

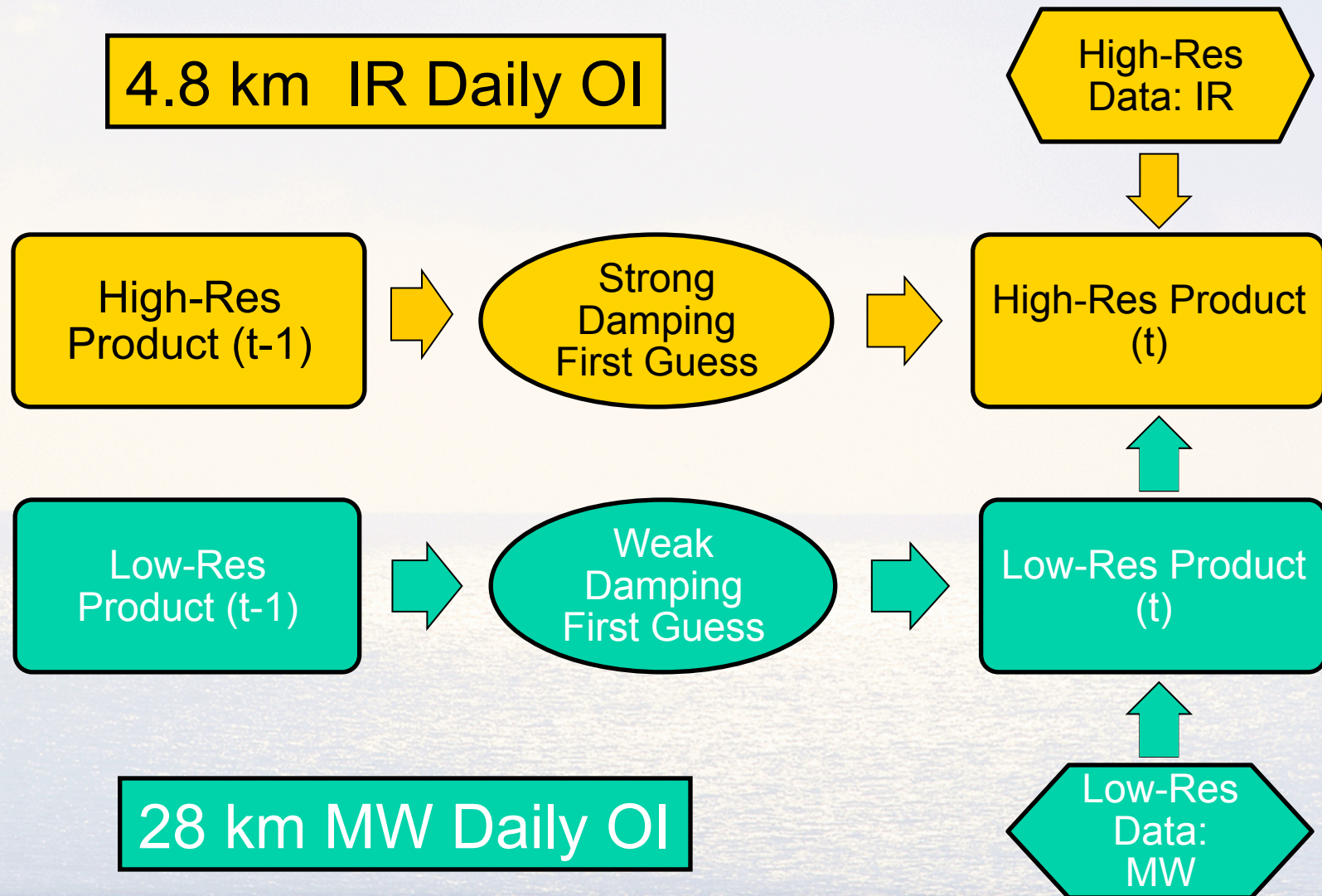


# SST from ECCO2 is “Truth”

- **1/16° OGCM (courtesy Dimitris Menemenlis)**
  - Estimating the Circulation and Climate of the Ocean, Phase II (ECCO2) ocean model
  - Horizontal model grid : 6.9 km at equator; 4.9 km at 45° lat
- **Use model SST data for 2 daily periods**
  - January 1993; July 1993
- **Use AMSR and Pathfinder AVHRR data coverage (day plus night) for 2 daily periods**
  - January 2004; July 2004
  - Note: Actual AMSR and AVHRR SSTs are NOT used
  - Linearly interpolate model SSTs to pathfinder v5 grid (4.8 km at equator) for simulated high-res AVHRR data
  - Smooth model SSTs to 50 km and average on 1/4° grid (27.8 km at equator) for simulated low-res AMSR data



# Two Stages





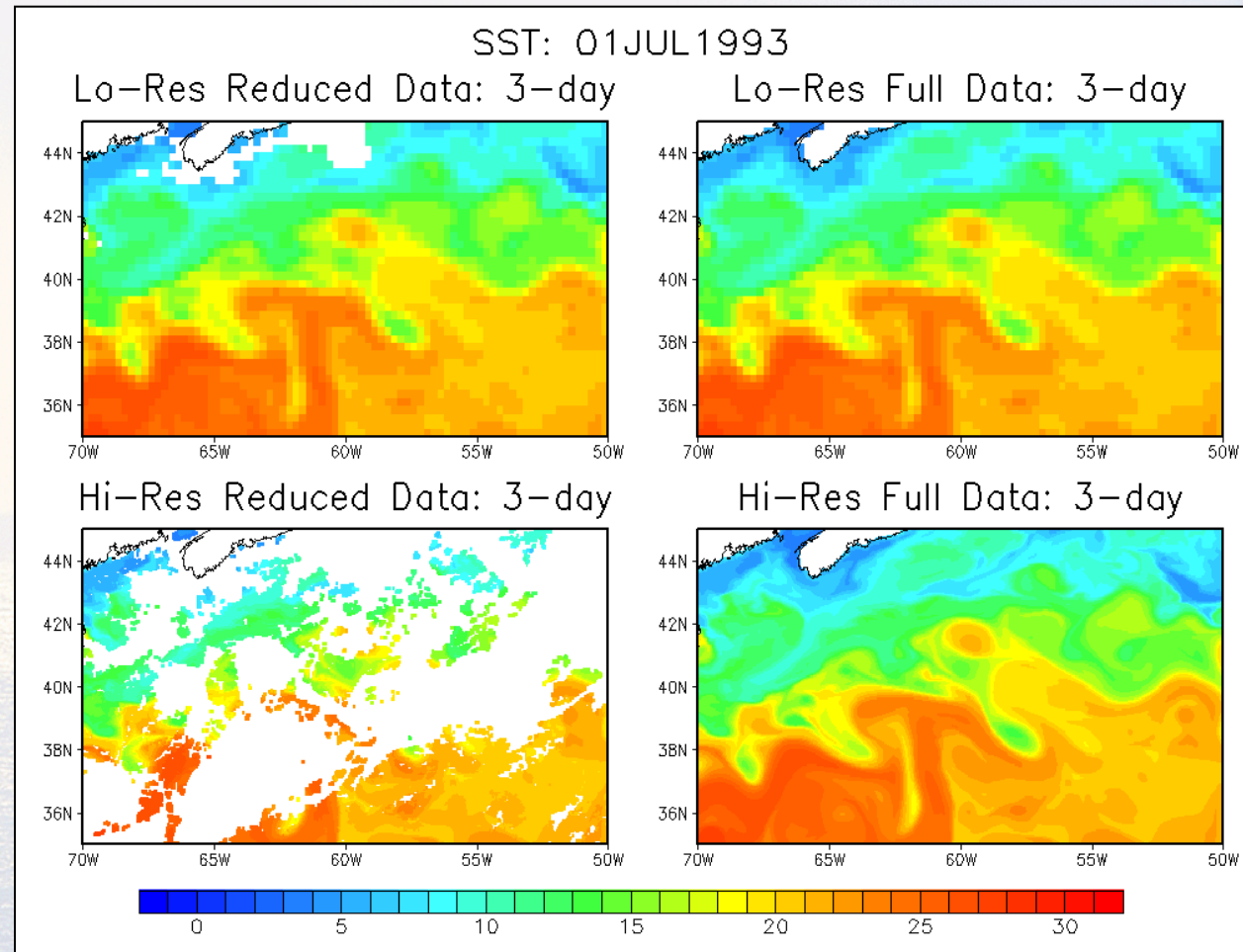
# Results

- **Daily low- and high-resolution OI run for two one-month periods using complete "data" coverage (full) and data subsampled to simulate actual satellite data coverage (reduced)**
  - **Because of limited high resolution coverage due to clouds: 3 days of low- and high-resolution data were used**
  - **Two periods; January & July 1993 using January & July 2004 data coverage**
- **Products to be examined**
  - **Low-resolution data (3-day): Full & Reduced**
  - **Low-resolution OI analysis: Full & Reduced**
  - **High-resolution data (3-day): Full & Reduced**
  - **High-resolution OI analysis: Full & Reduced**



# SST Data, 1 July 1993

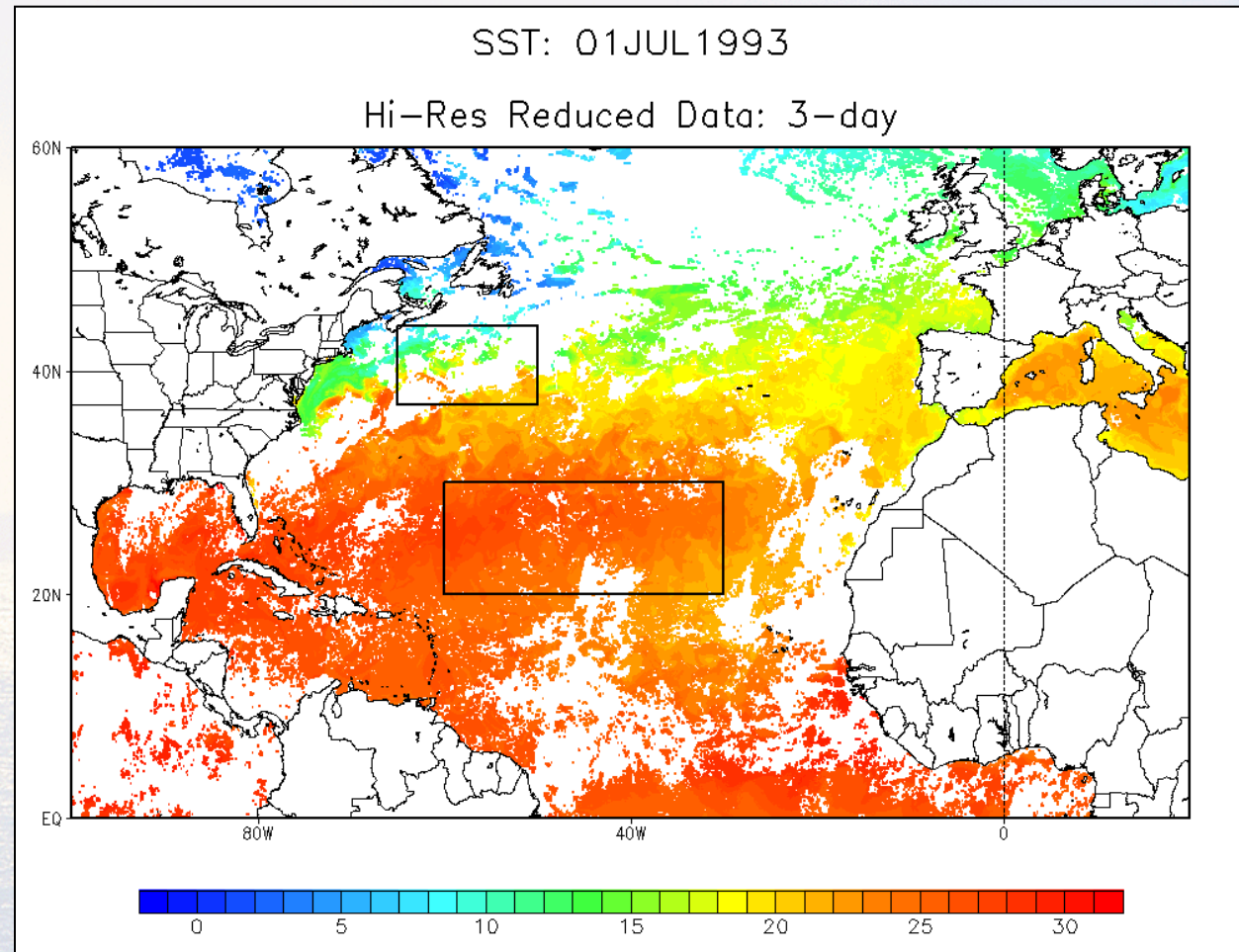
- **Simulated Low-Resolution Data: top 2 panels**
  - **Small** differences between Reduced (left) and Full sampling (right)
- **Simulated High-Resolution Data: bottom 2 panels**
  - **Large** differences between Reduced (left) and Full sampling (right)
- **High and Low resolution feature differences are apparent**





# SST Hi-Res Reduced Data, 1 July 1993

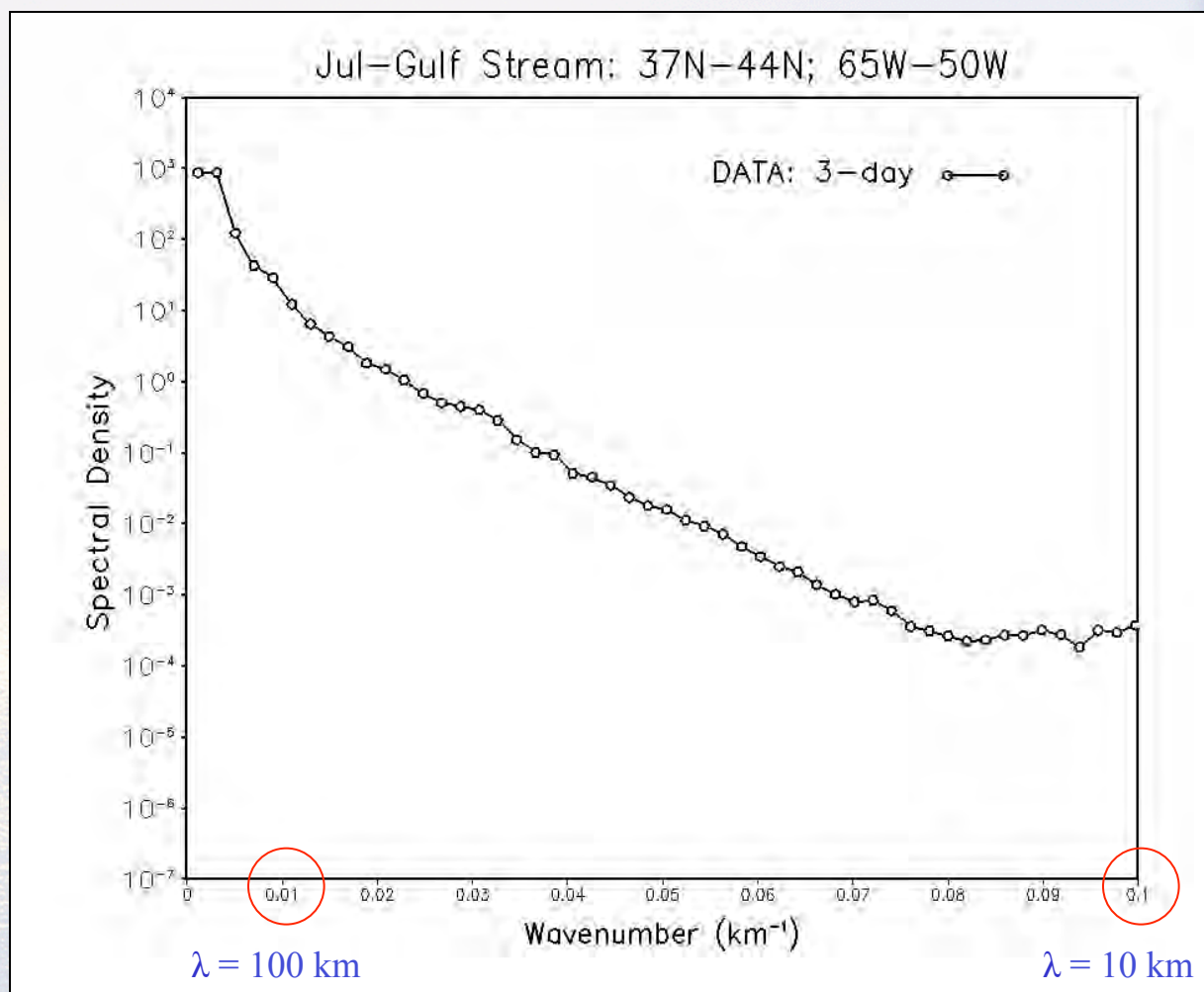
- Focus is on the zonal wavenumber ( $\lambda^{-1}$ ) of spatial variance for 2 regions:
  - Gulf Stream
  - Sargasso Sea
- Wavenumber spectra computed:
  - Monthly average for 31 days along zonal line at center of the box
  - Daily average along 31 zonal lines closest to zonal line at the box center





# Gulf Stream Auto-Spectra, July 1993

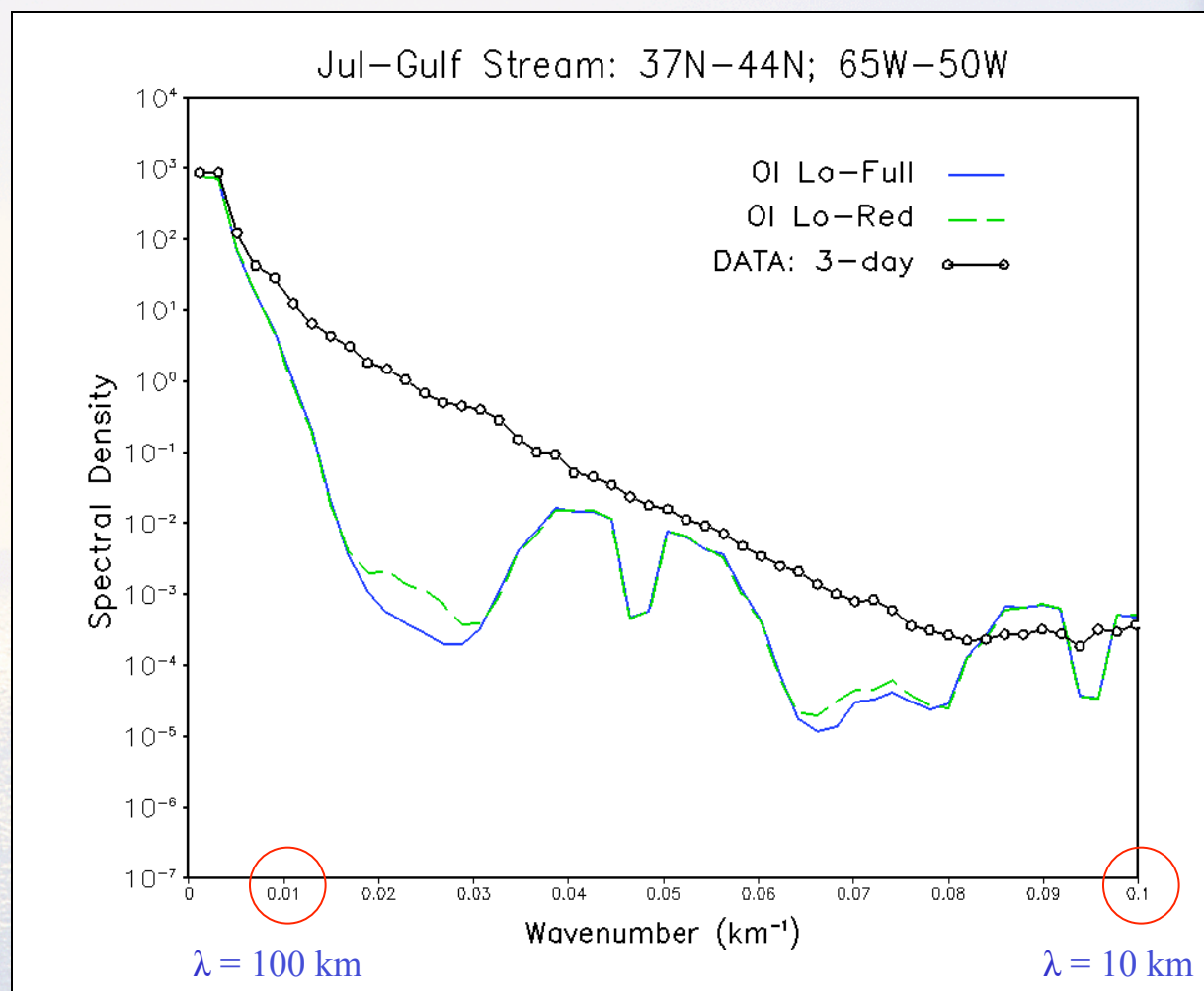
- **Horizontal Axis**
  - Wavenumber ( $\lambda^{-1}$ )
  - Range: 0-0.1  $\text{km}^{-1}$
- **Vertical axis**
  - Spectral density
  - Powers of 10
- **3-days of hi-res data**
  - Data Range:  $10^3 - 10^{-3}$
  - Roughly flat: 0.08 - 0.10  $\text{km}^{-1}$
- **Min resolution**
  - ~ 12 km
    - Model grid = 5.2 km at 40.5° lat
  - Smallest Nyquist  $\lambda = 10.4 \text{ km}$





# Gulf Stream Auto-Spectra, July 1993

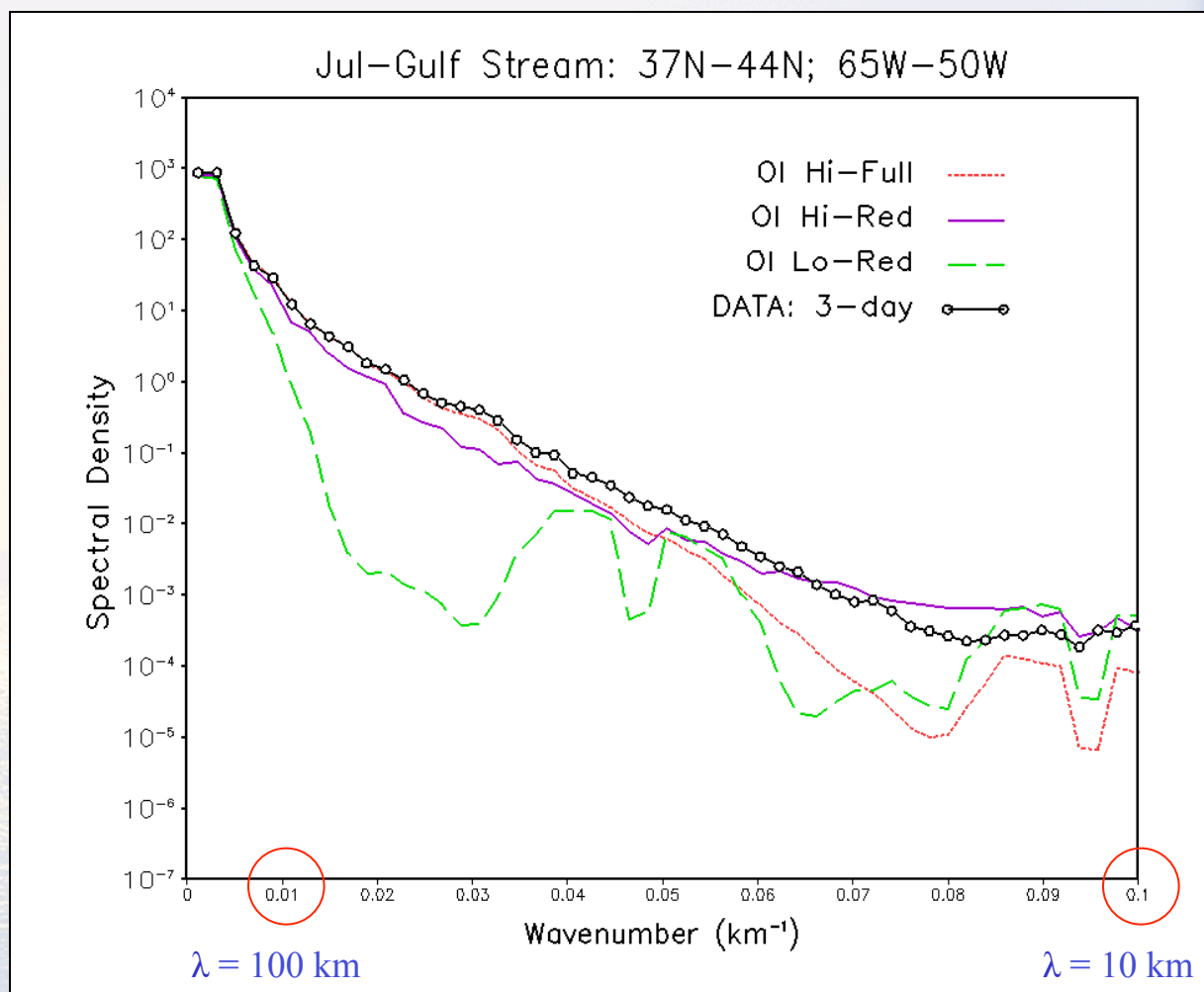
- Showing
  - Data Hi-Res Full
  - OI Low-Res Full & OI Low-Res Red
- Both OI Low-Res versions very similar & lower than data
  - $10^1 \sim 0.01 \text{ km}^{-1}$
  - $10^4 \sim 0.02-0.03$
- OI Low-Res has ringing at high  $\lambda^{-1}$ 
  - Due to bilinear interpolation from low to high resolution





# Gulf Stream Auto-Spectra, July 1993

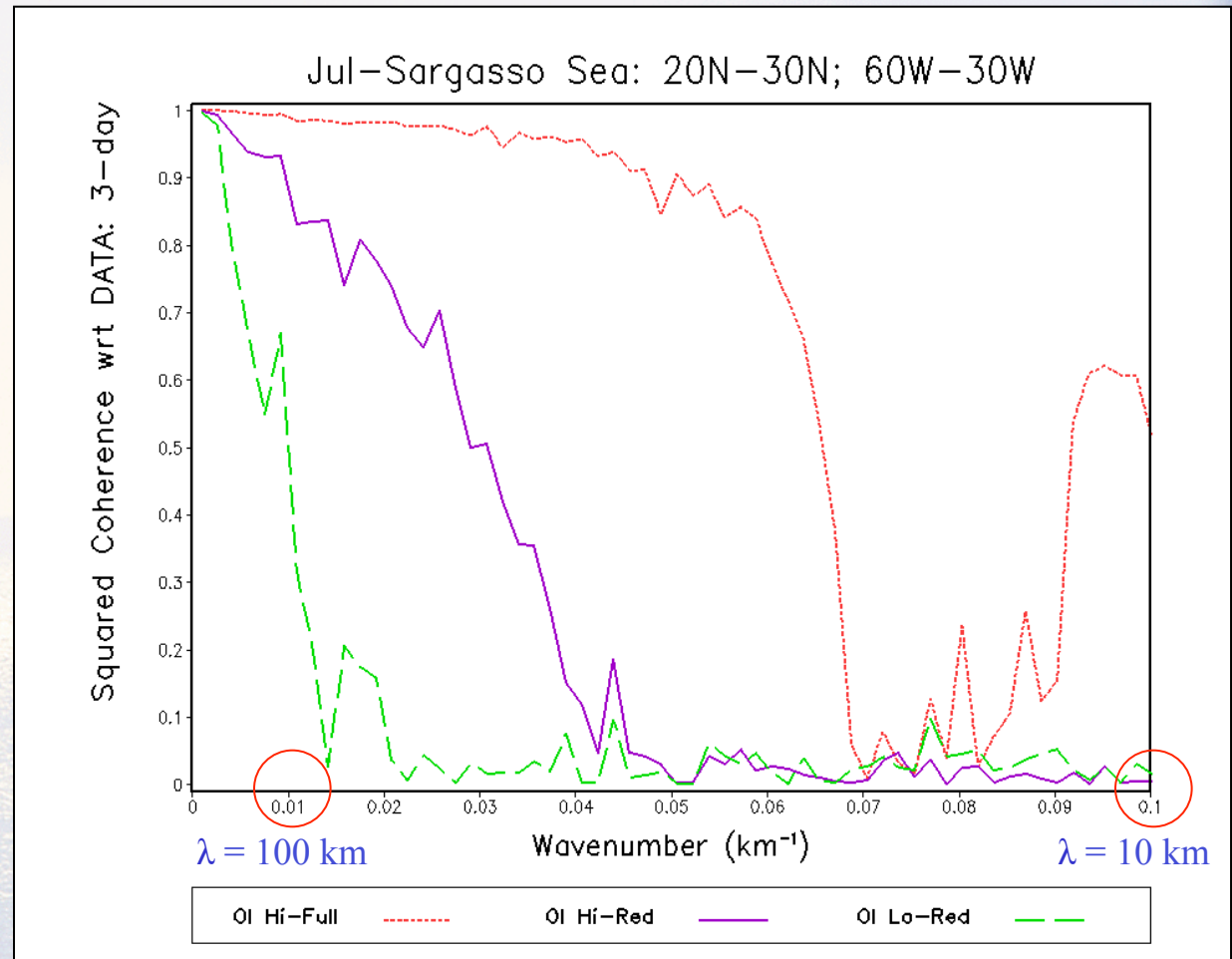
- Add OI Hi-Res
  - Both **OI Hi-Res Full** & **OI Hi-Res Red** very similar to **DATA** at wavenumbers ( $\lambda^{-1}$ ) smaller than  $0.06 \text{ km}^{-1}$
  - **OI Hi-Res Full** smaller than both **Data** & **OI Hi-Res Red** above  $0.06 \text{ km}^{-1}$
  - **OI Hi-Res Full** has ringing at  $\lambda^{-1}$  above  $0.08 \text{ km}^{-1}$
- What is signal?
- What is noise?





# Sargasso Squared Coherence ( $\gamma^2$ ), July 1993

- Coherence: correlation as a function of wavenumber ( $\lambda^{-1}$ )
- Coherence computed with respect to 3-days of data
- **OI Low-Res Red**
  - OI Low-Res  $\gamma^2$  only 0.5 at  $0.01 \text{ km}^{-1}$  and then drops quickly
- **OI Hi-Res Full**
  - OI  $\gamma^2$  above 0.9 until  $0.07 \text{ km}^{-1}$  and then drops quickly
- **OI Hi-Res Red**
  - $\gamma^2$  above 0.7 until  $0.03 \text{ km}^{-1}$  and then drops





# Gulf Stream Squared Coherence ( $\gamma^2$ ), July 1993

- **OI Low-Res Red**

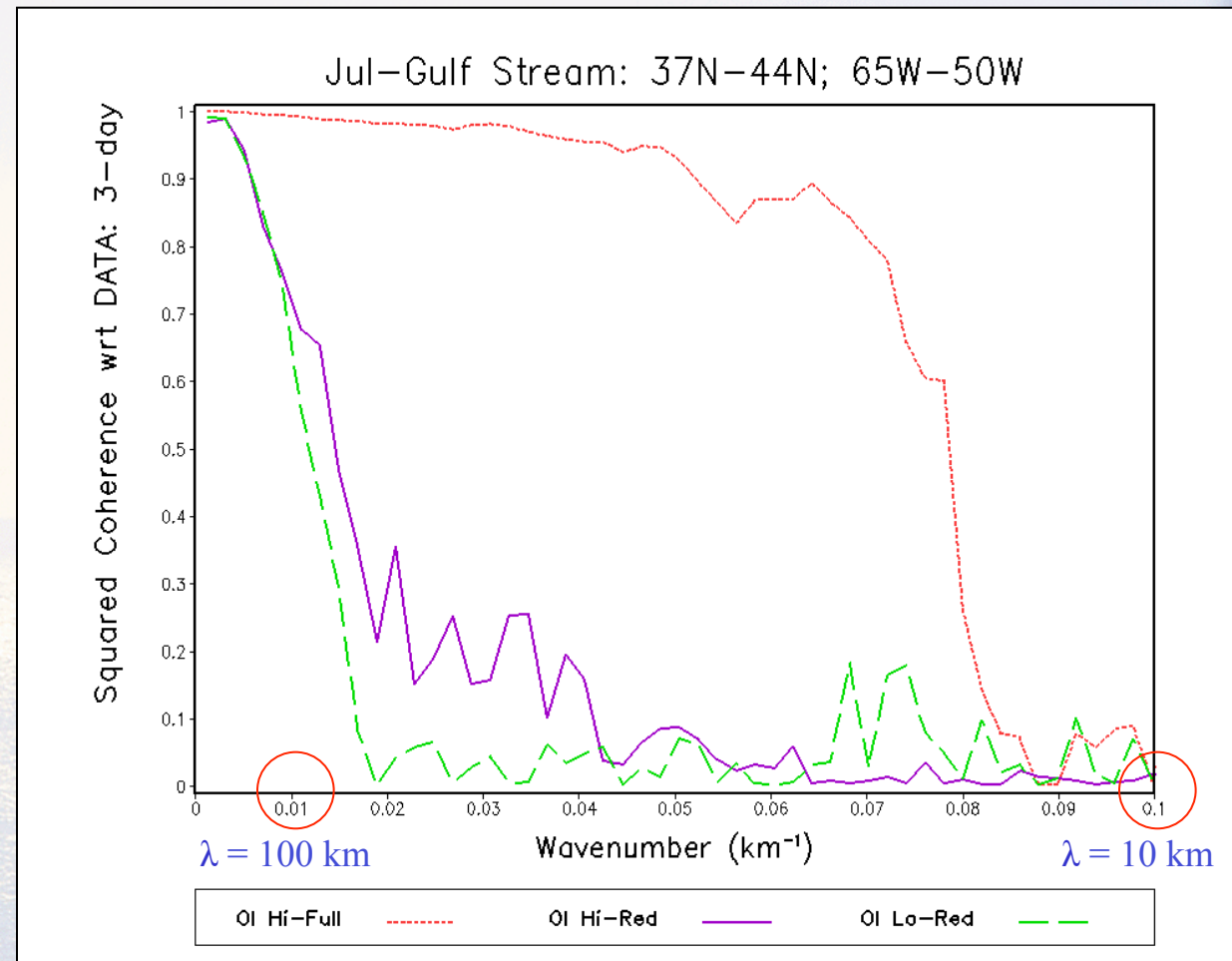
- OI Low-Res  $\gamma^2$  only 0.6 at 0.01  $\text{km}^{-1}$  and then drops quickly

- **OI Hi-Res Full**

- OI  $\gamma^2$  above 0.9 until 0.06  $\text{km}^{-1}$  and then drops quickly

- **OI Hi-Res Red**

- $\gamma^2$  above 0.7 until 0.6 at 0.01  $\text{km}^{-1}$  and then drops
- Little monthly high resolution!
- January even worse

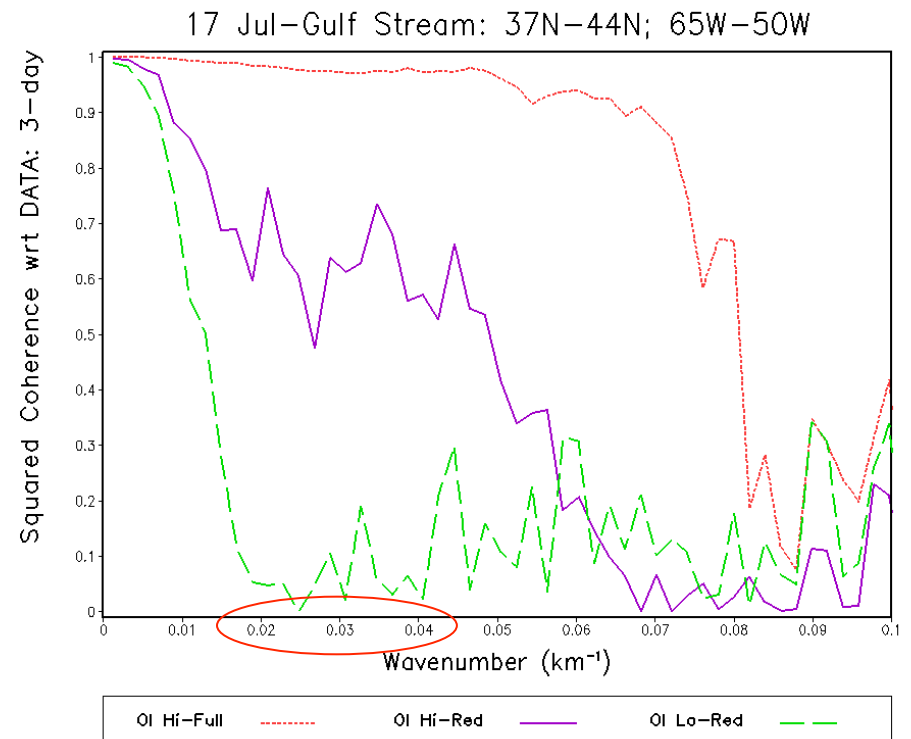
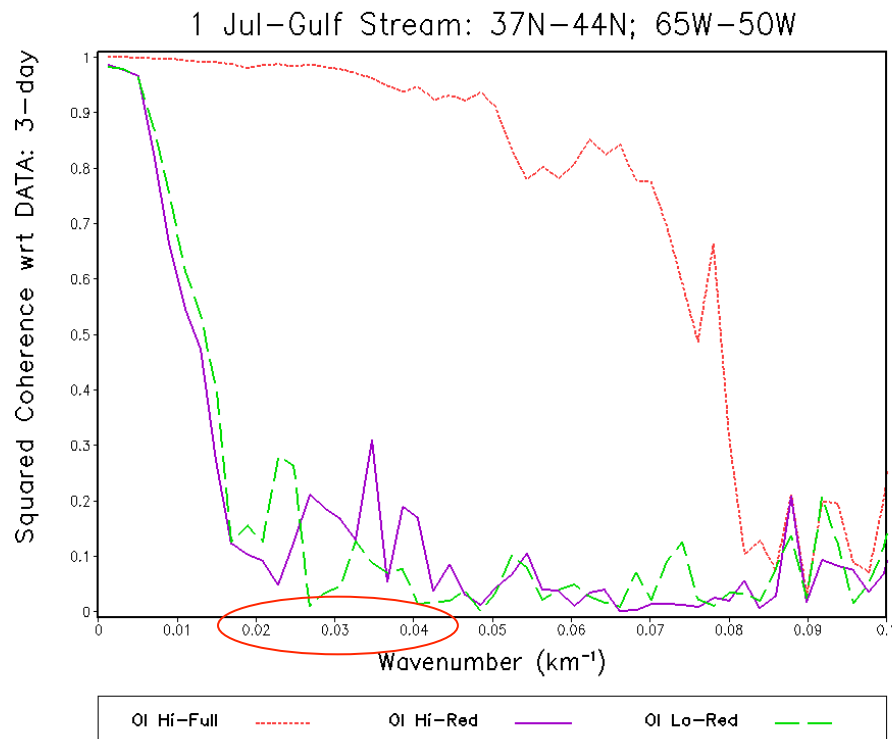




# Gulf Stream Squared Coherence ( $\gamma^2$ )

## 1 & 17 July 1993

- Left panel: 1 July: Right panel: 17 July
- OI Low-Res Red & OI Hi-Res Full
  - Both days show results very similar to monthly results
- OI Hi-Res Red
  - Much larger  $\gamma^2$  values below  $0.06 \text{ km}^{-1}$  on 17 July 1993 compared to 1 July 1993

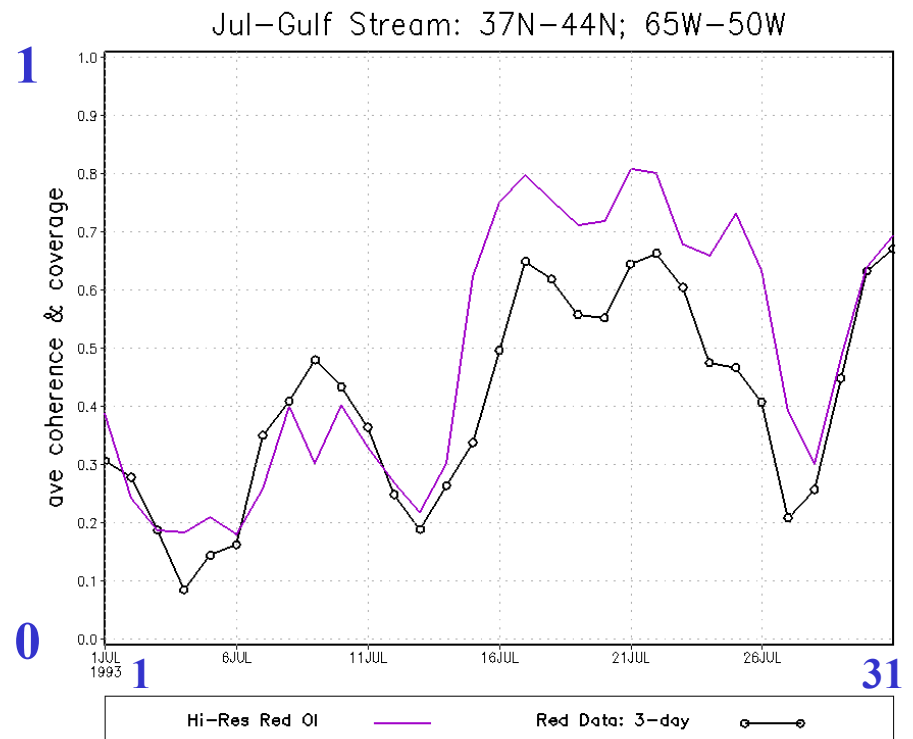
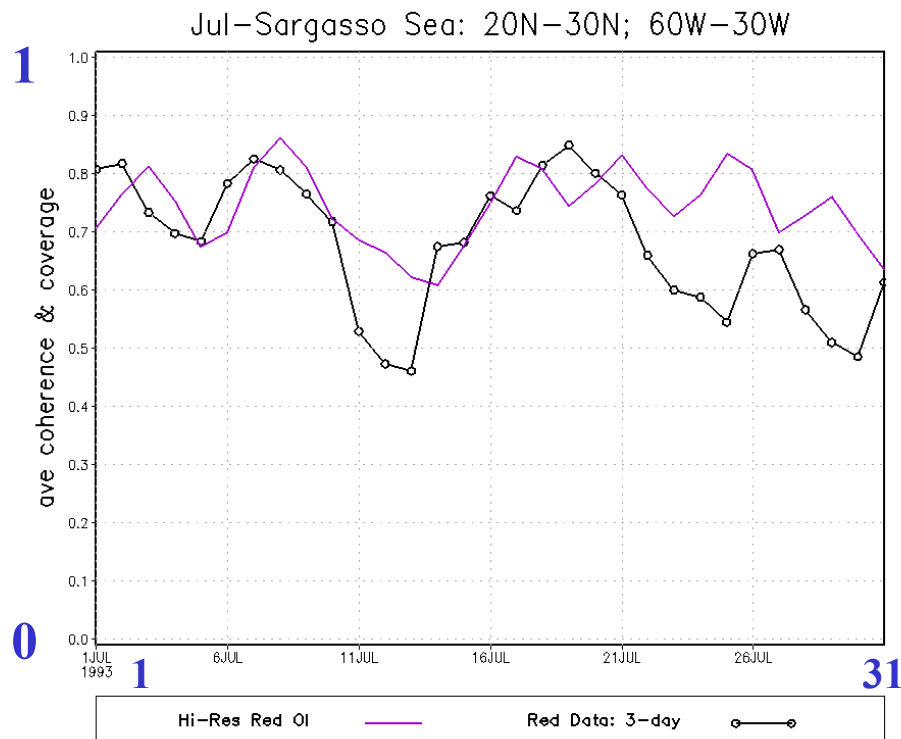




# Sargasso & Gulf Stream Regions

## Daily Coverage & Coherence for July 1993

- X-axis: July Days, 1-31
- Y-axis: Daily Fraction of Coverage for Reduced Data, 0-1
- Y-axis: Average OI Hi-Res Coherence ( $\gamma$ ) with Reduced Data
  - Average computed between 0.2 and 0.4  $\text{km}^{-1}$
- Note rough correlation between the 2 curves
  - Coverage can be used as proxy for Coherence

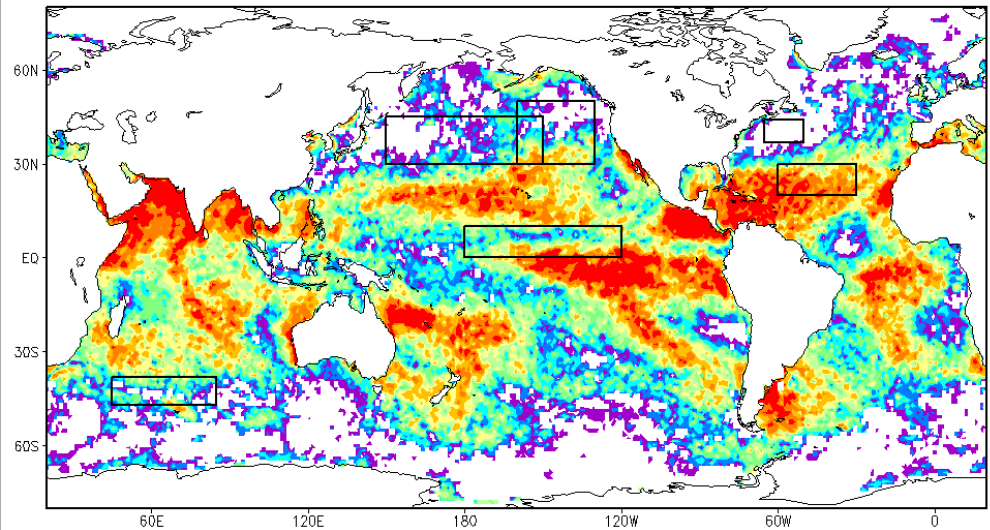




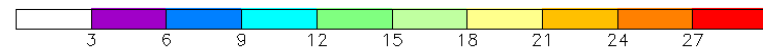
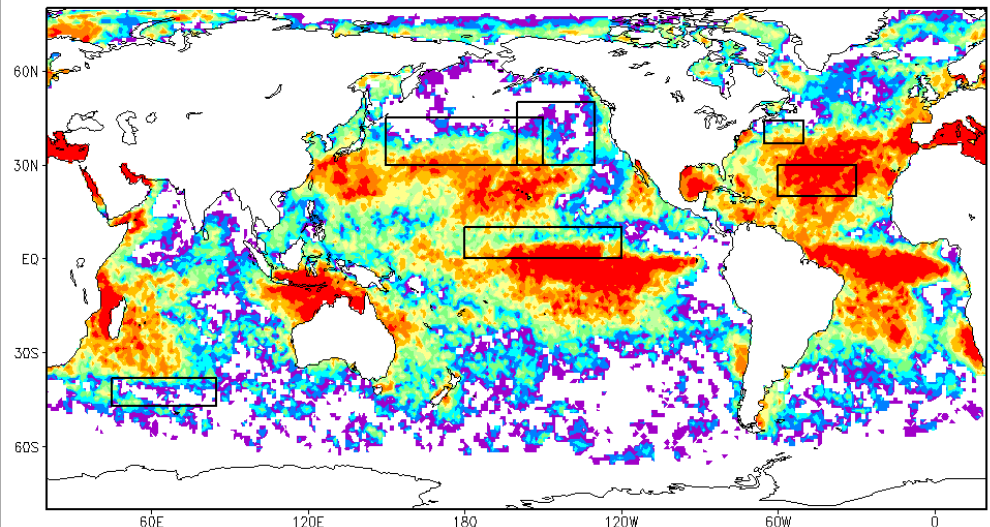
## 30% Coverage Days: January & July 2004

- Number of days with at least 30% ocean grid points with data
  - Computed on 1° spatial grid
  - January - top
  - July - bottom
- Note strong seasonal differences, for example
  - Gulf Stream
  - N. Hem Indian Ocean
  - Mediterranean
- Users now have a simple way to understand
  - Where high resolution analysis is possible
  - How often it is possible

Days with at least 30% Coverage: Jan 2004



Days with at least 30% Coverage: Jul 2004

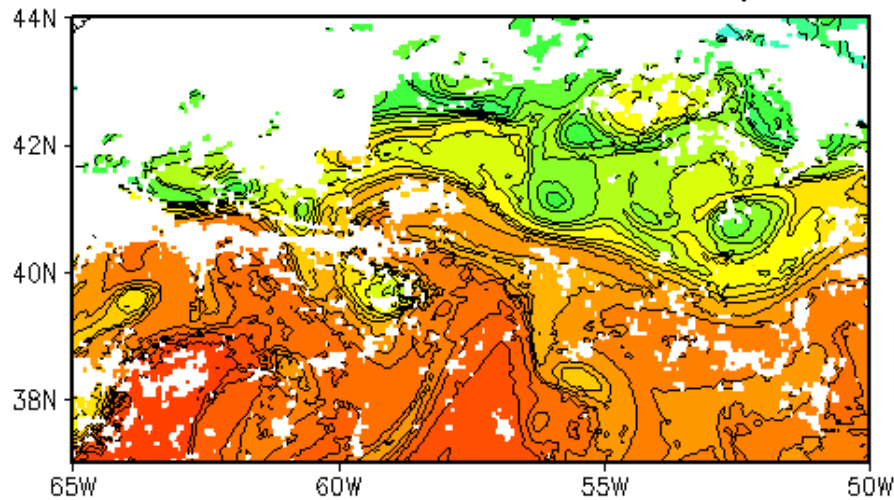


Number of Days

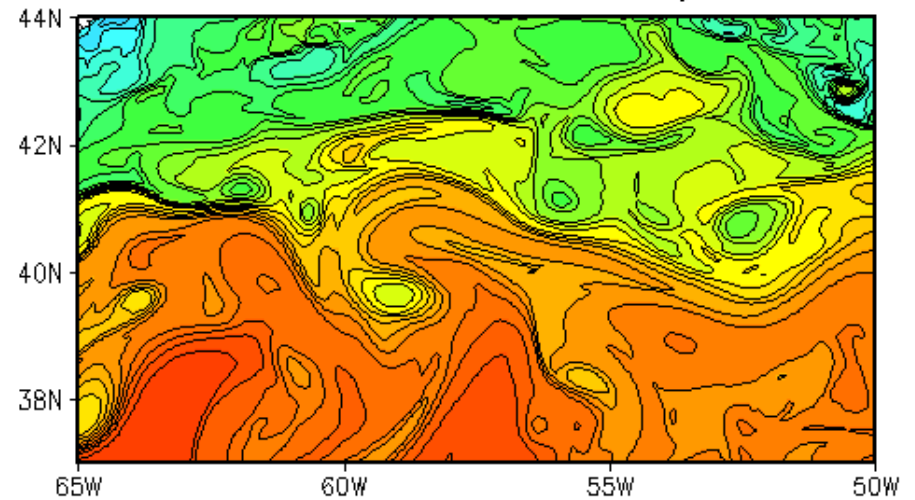


# HIGH-RES SST: 31 JUL 1993

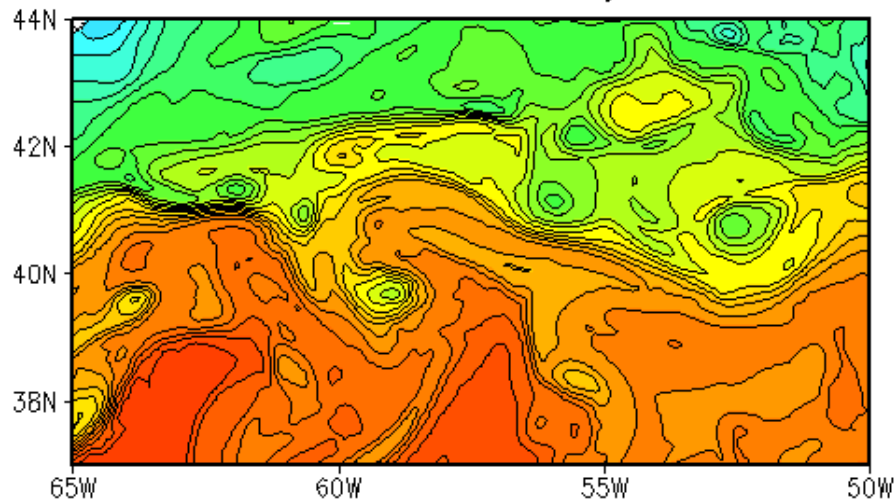
## Reduced Data: 3-day



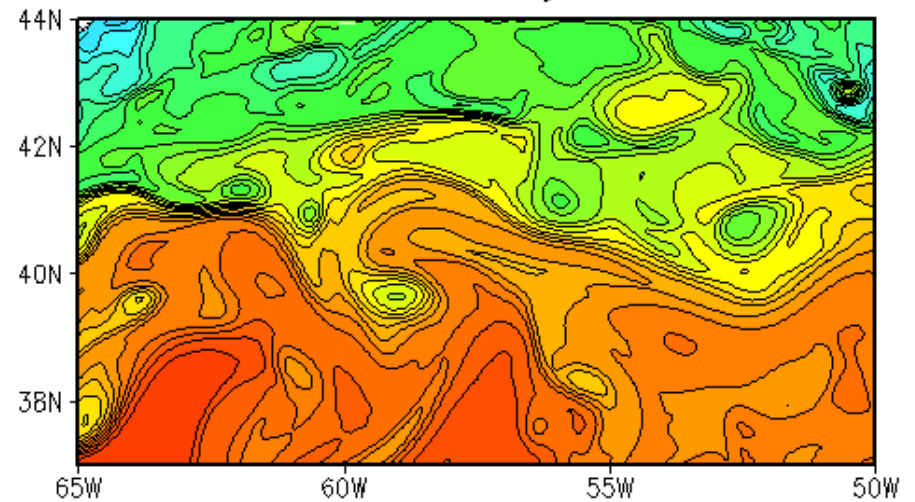
## Full Data: 3-day



## Reduced Analysis



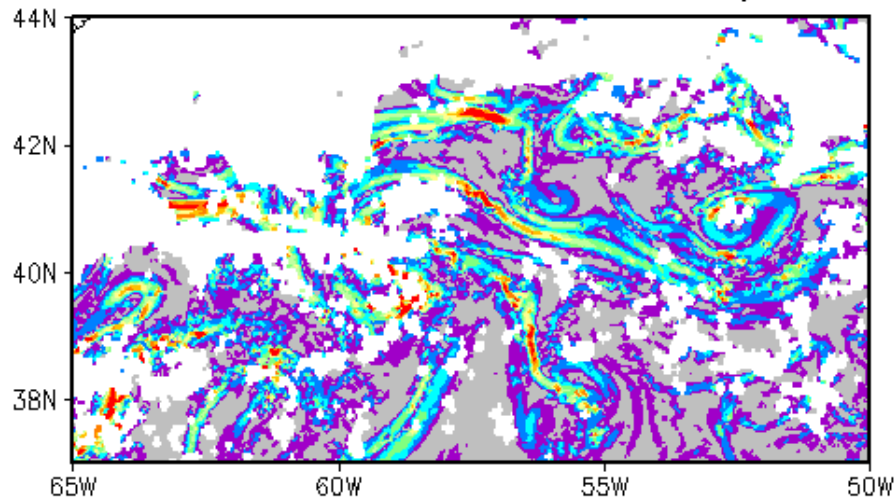
## Full Analysis



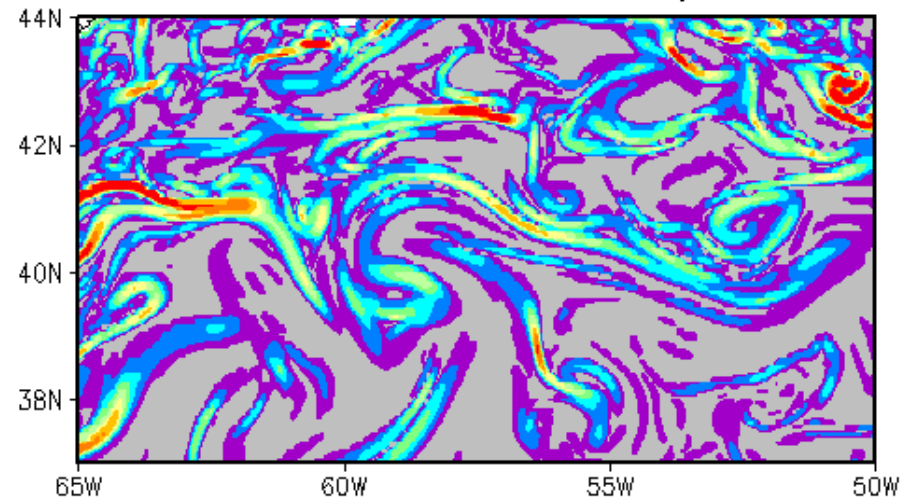


# HIGH-RES SST Grad ( $^{\circ}\text{C}/100\text{km}$ ): 31JUL1993

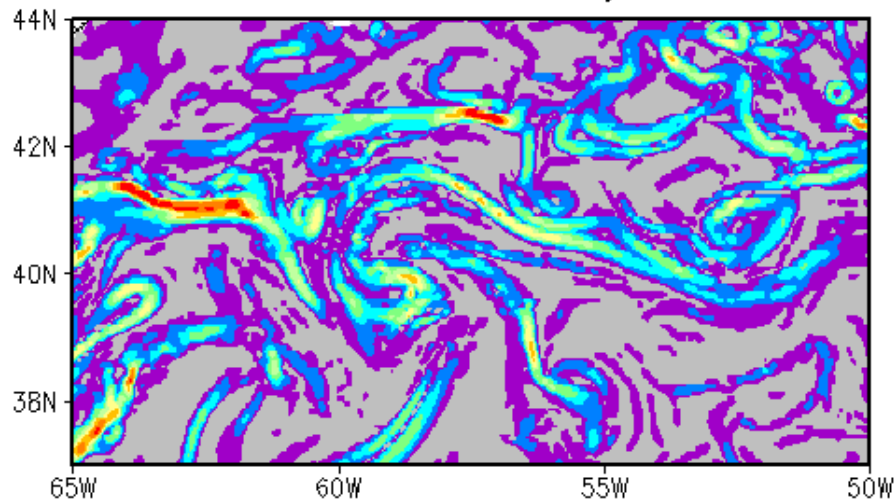
## Reduced Data: 3-day



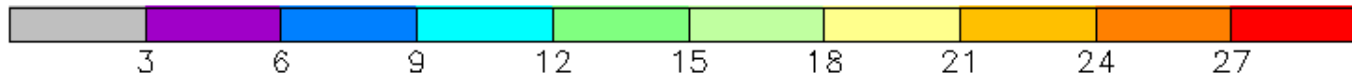
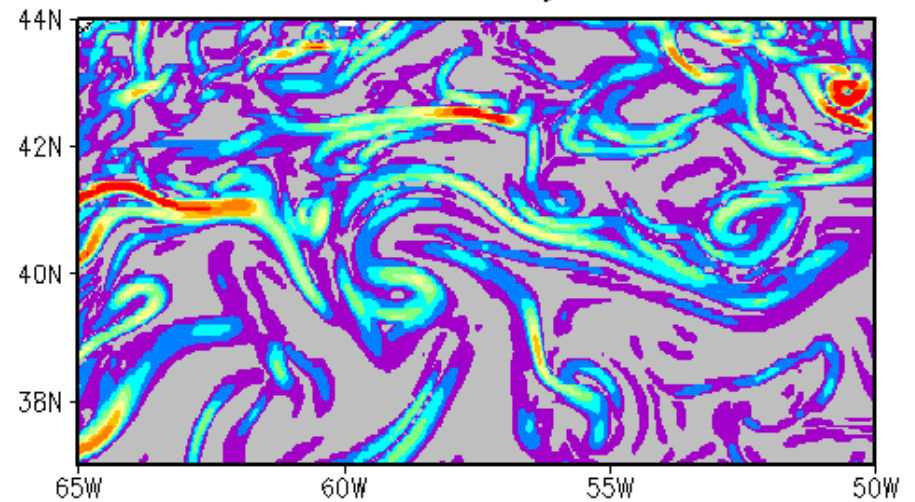
## Full Data: 3-day



## Reduced Analysis



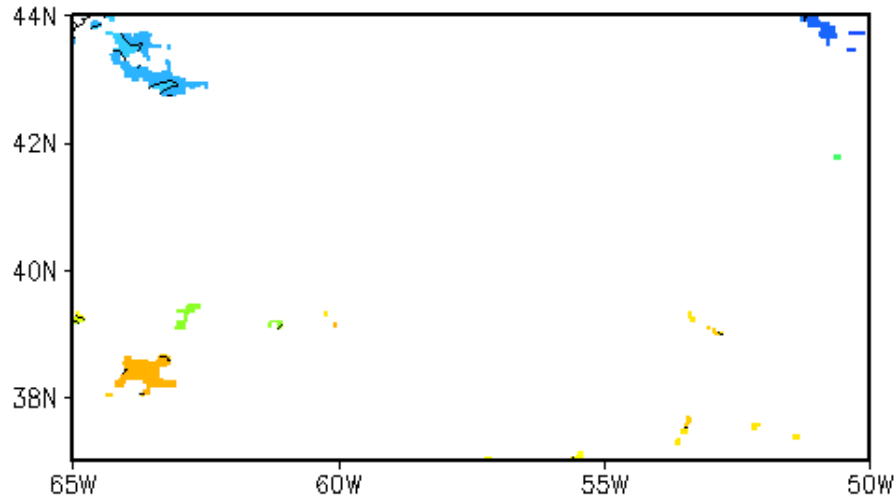
## Full Analysis



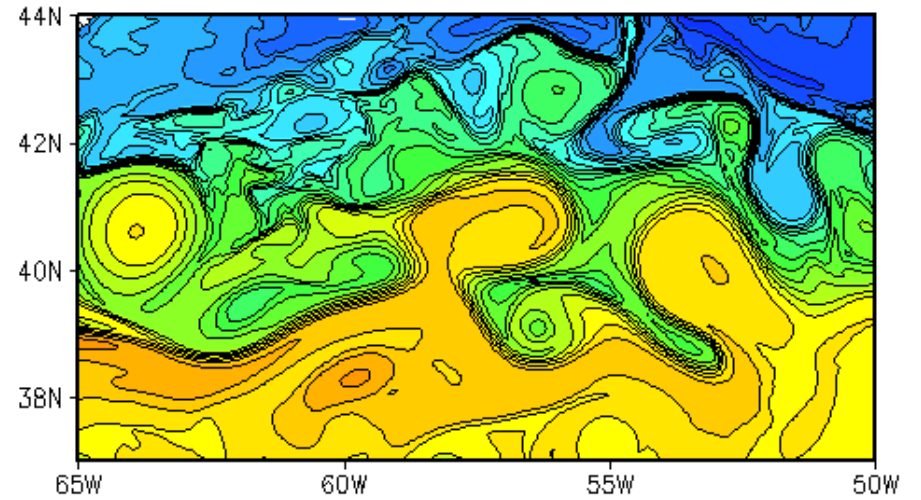


# HIGH-RES SST: 04JAN1993

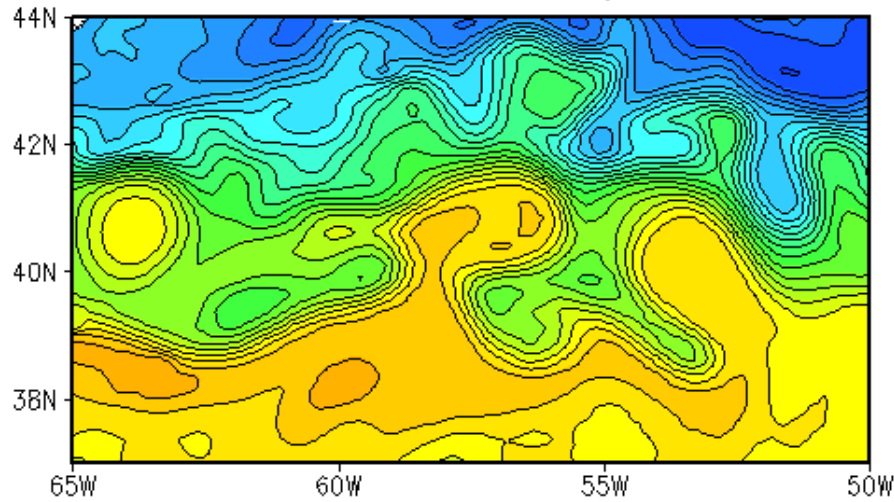
## Reduced Data: 3-day



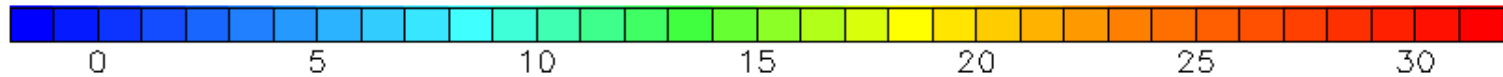
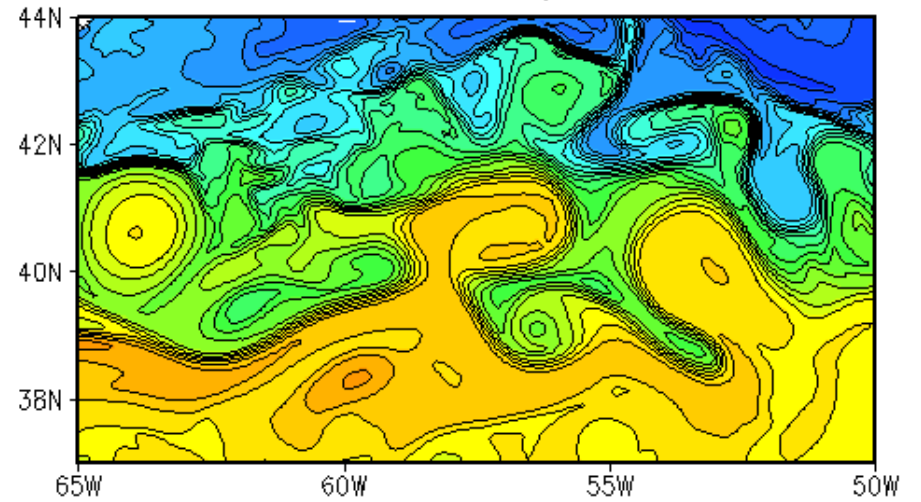
## Full Data: 3-day



## Reduced Analysis



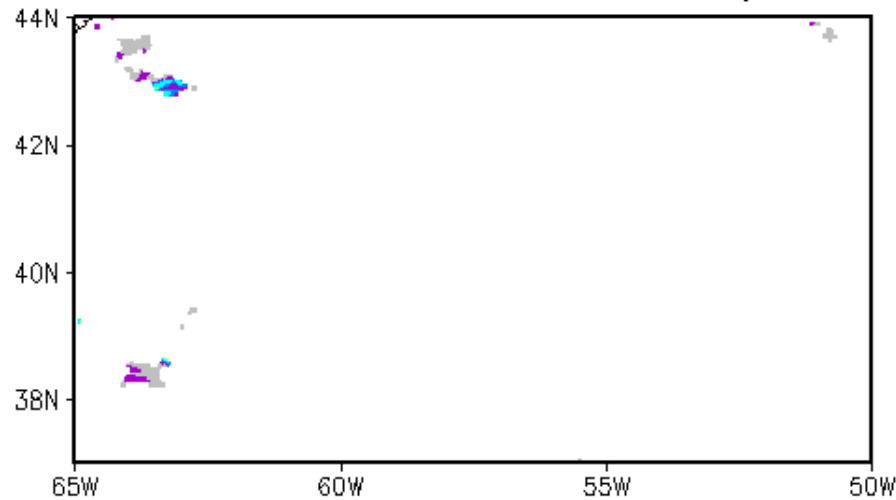
## Full Analysis



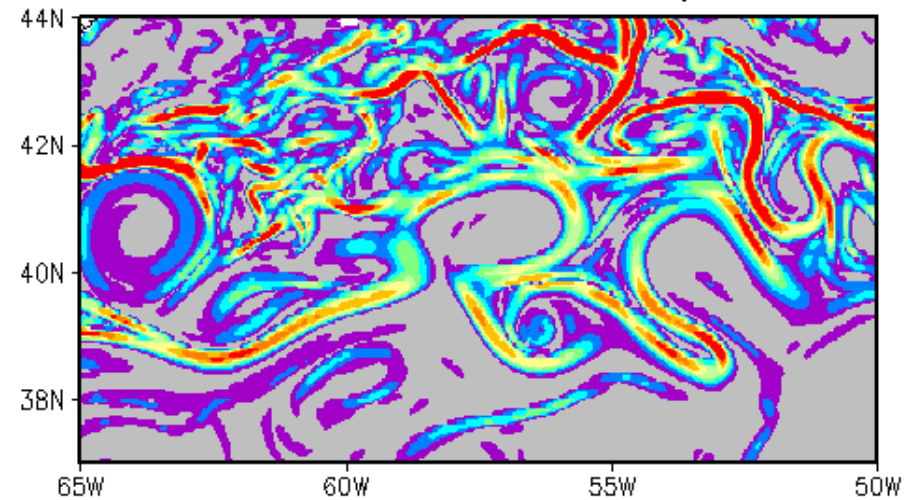


# HIGH-RES SST Grad ( $^{\circ}\text{C}/100\text{km}$ ): 04JAN1993

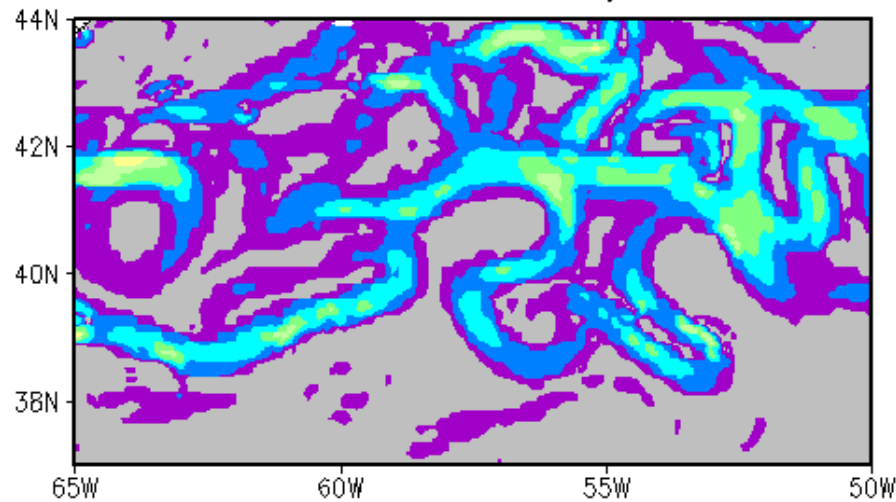
## Reduced Data: 3-day



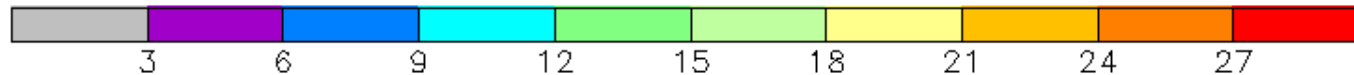
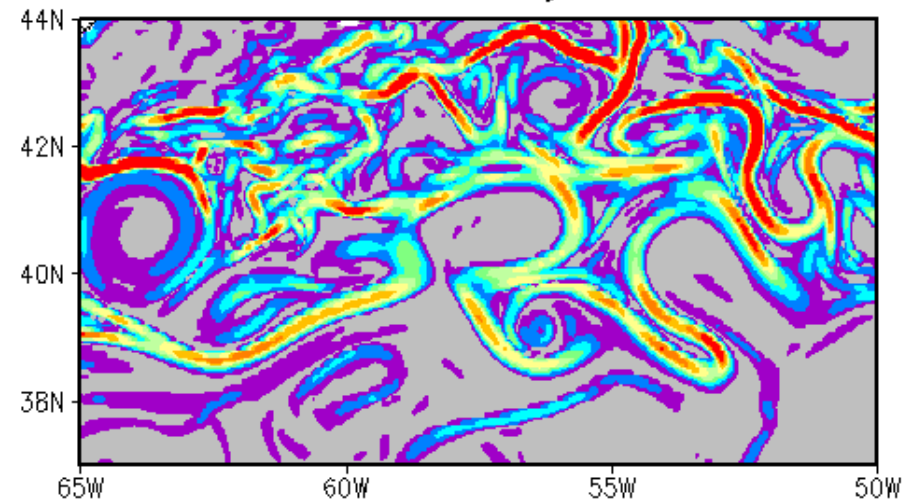
## Full Data: 3-day



## Reduced Analysis



## Full Analysis





# Summary

- Using “Synthetic SST Data” as “Truth” is a useful procedure for studying the effects of sampling errors on SST analyses
  - Noise has not be added to the model SST
  - Thus, high resolution simulations are optimistic
- Monthly maps of data coverage can provide a useful way for users to understand **where** and **how often** high-resolution analyses **actually have** high-resolution **signals**