



**Online Training Course
On**

Visualization of Marine Met Data (Using FERRET)

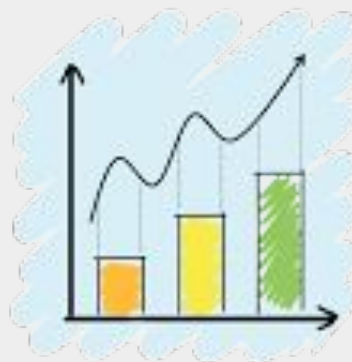
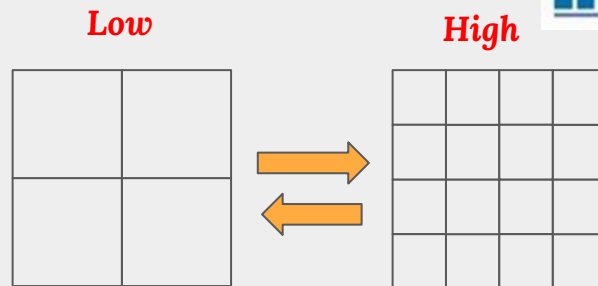
Organised by

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ESSO-INCOIS, MoES, Hyderabad, India

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- ❑ **Regridding Data**
 - Space (Horizontal - XY; Vertical - Z)
 - Time (Time Series - T)
- ❑ **Basic Statistics**
 - Bias
 - Mean
 - Variance
 - Standard deviation
 - RMSE
 - Scatter Index
 - Correlation
 - Climatology
 - Anomaly
 - Regression Analysis
 - FFT
 - Low pass filter

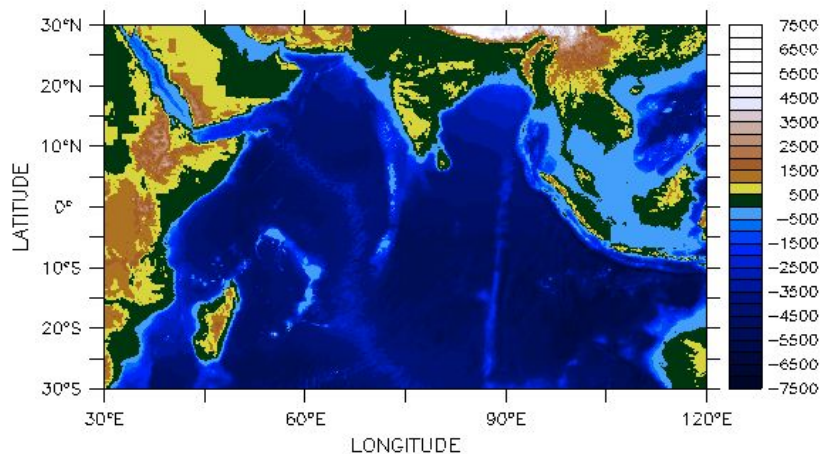


Regridding Data

Space - Horizontal (XY)

High Spatial Resolution

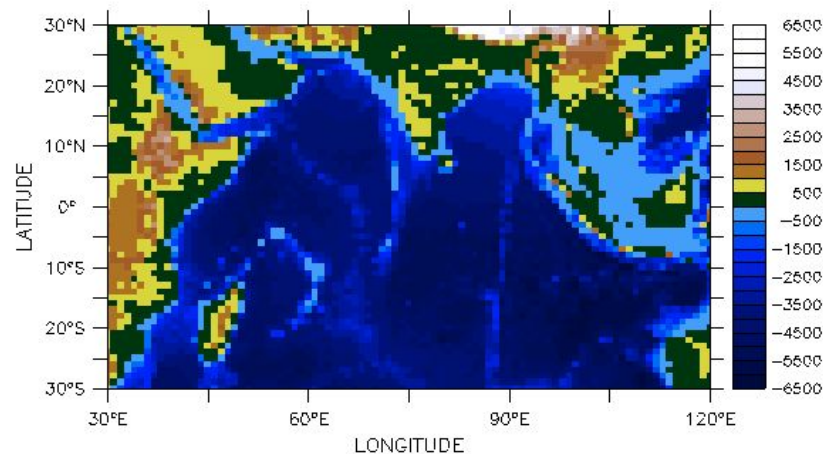
DATA SET: etopo5



Relief Of the Surface of the Earth (meters)

Low Spatial Resolution

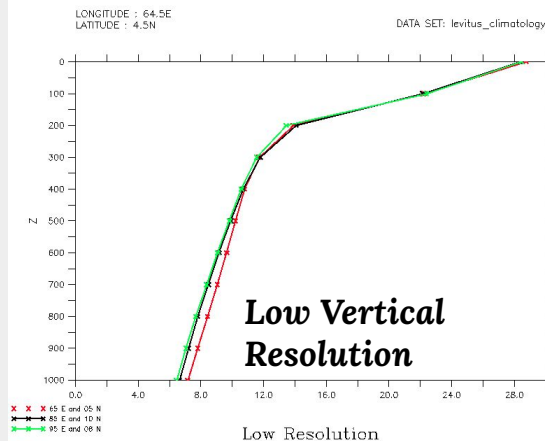
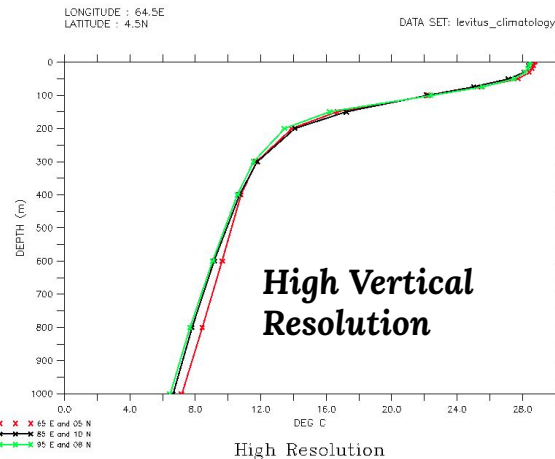
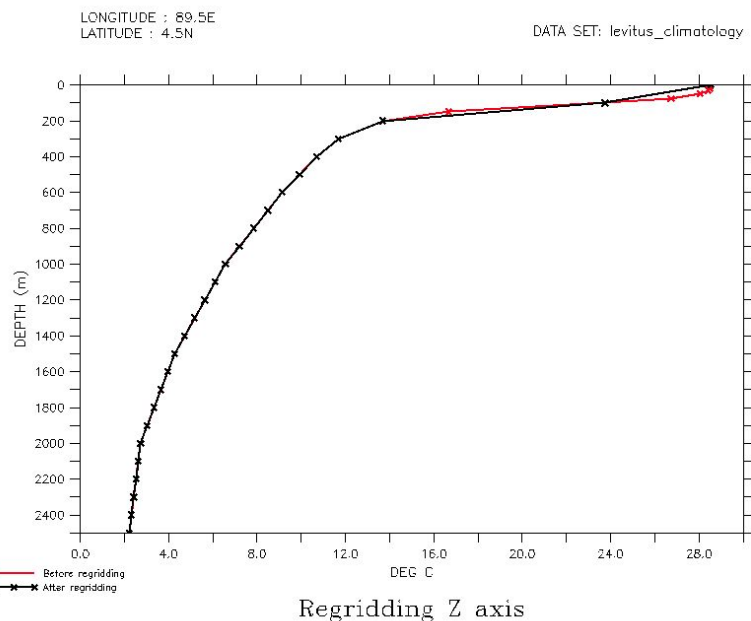
DATA SET: etopo5



ROSE[G=NGRD]

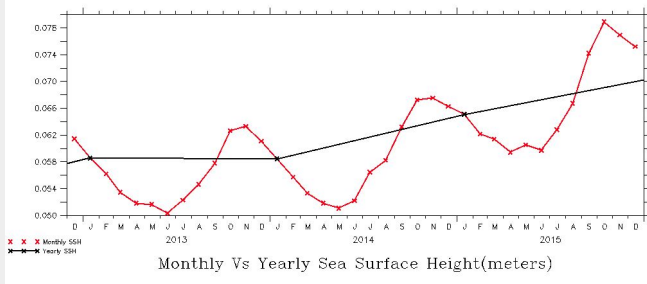
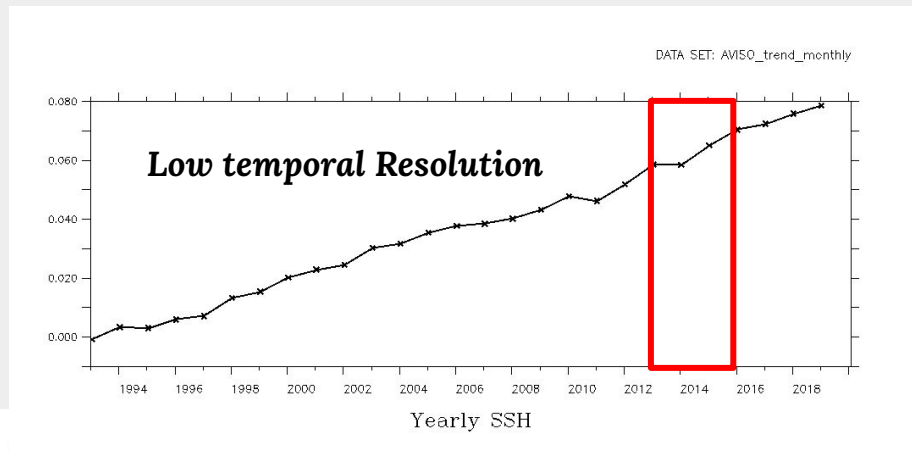
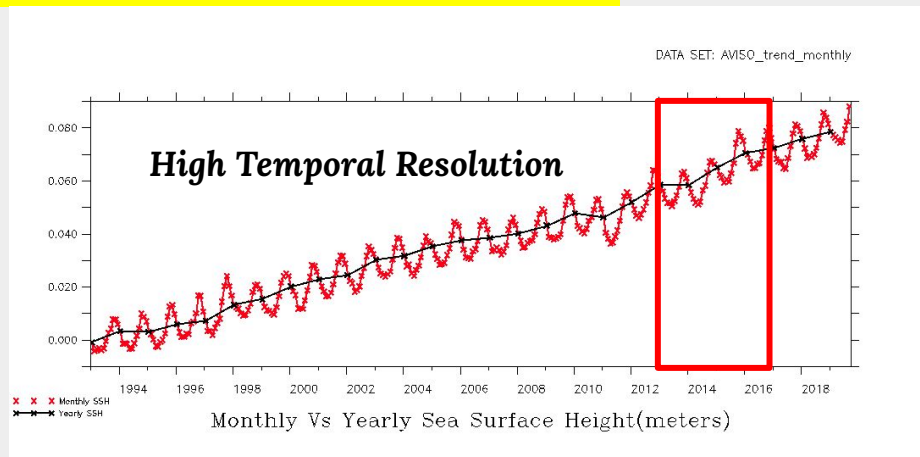
Regridding Data

Space - Vertical (Z)



Regridding Data

Time - Time Series (T)



Basic Statistics

Default Ferret functions for Statistics

- ❑ Average (variable[l=@AVE])
- ❑ Standard Deviation (variable[l=@STD])
- ❑ Monthly Climatology (variable[GT=month_reg@MOD])
- ❑ Anomaly (variable - variable[GT=month_reg@MOD])
- ❑ Regression (go regresst or regressx or regressive)
- ❑ Correlation (go variance)
- ❑ FFT (ffta(variance) (https://ferret.pmel.noaa.gov/static/Demos/ef_fft_demo/ef_fft_demo.html))
- ❑ Lowpass (lsl_lowpass (variable, cutoff_period, filter_span))

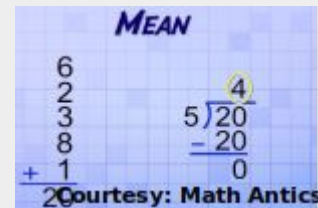
Basic Statistics

Bias and Mean

Mean (or) Average:

For dataset, mean/average is the **summation/addition of the values divided by the number of values in sample**. i.e. In other words, it is the sum divided by the count.

$$\bar{O} = \frac{\sum_{i=1}^N O_i}{N} \quad \bar{X} = \frac{\sum_{i=1}^N X_i}{N} \quad \bar{X} = \frac{\sum X}{N}$$



Bias (or) Error:

It is **difference between the forecasted and observed values in dataset**. i.e. In other words, bias/error is the tendency of a statistic to overestimate or underestimate a parameter

$$\text{Bias} = \frac{\sum_{i=1}^N F_i - O_i}{N}$$

variable[l=@AVE]

<https://www.youtube.com/watch?v=QqibyNJdyDU&t=769s>

My Videos for more details on Basic Statistics

Basic Statistics

Variance and Standard Deviation

Standard Deviation :

Standard deviation is the **square root of the variance**. i.e. and it can never be negative.

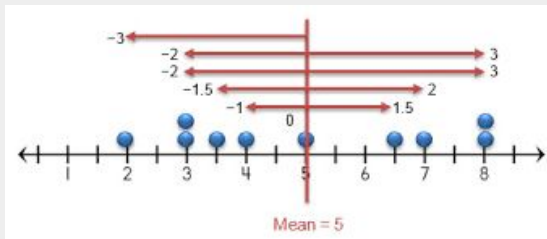
It is a **measure of how far each observed value from the mean** and can be derived from variance by taking square root of variance.

Values in data are widely spread (far) from mean if high and narrow spread (near) from mean if low

It's denoted by σ and units are same as parameter itself.

$$\sigma = \sqrt{\frac{\sum_{i=1}^N (o_i - \bar{o})^2}{N}}$$

variable[l=@STD]



Variance :

It is calculated as the **average squared difference of each number from the mean of the data set**.

Variance measures the average degree to which each point differs from the mean and it can be derived from standard deviation by taking the square of the standard deviation.

It is denoted by σ^2 and units are squared units of parameter itself.

$$\sigma^2 = \frac{\sum_{i=1}^N (o_i - \bar{o})^2}{N}$$

Basic Statistics

RMSE

Root Mean Square Error (RMSE):

RMSE is the standard deviation of the residuals (prediction errors or difference between forecast and observation .i.e. [F-O]).

RMSE is a **measure of how spread out these residuals are**. In other words, it tells you how concentrated the data is around the line of best fit.

$$RMSE = \sqrt{\frac{\sum_{i=1}^N (F_i - O_i)^2}{N}}$$

Difference between and Standard deviation actually shows how spread out a group of values are from the mean by looking at the square root of variance whereas, variance measures the average degree to which each point differs from the mean.

Basic Statistics

Scatter Index

Scatter Index (SI):

It is the **RMSE normalized with the averaged observed value** and calculated by dividing RMSE with mean of the observations. i.e. $SI = RMSE / \text{mean of observations}$

It represents the percentage of RMSE with respect to mean observation and gives the expected error for the parameter.

It can also be represented in percentage (%) by multiplying SI with 100. i.e. $SI * 100$

$$SI = \frac{RMSE}{\bar{O}}$$

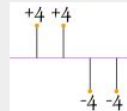
$$SI = \frac{\sqrt{\frac{\sum_{i=1}^N (F_i - O_i)^2}{N}}}{\bar{O}}$$

Why square root the differences?

If we add the differences from the mean, the negatives negate the positives:

Then Absolute?

$$\frac{|7| + |1| + |-6| + |-2|}{4} = 4$$



$$\frac{+4 + 4 - 4 - 4}{4} = 0$$

Then Square root?

$$\frac{\sqrt{(42 + 42 + 42 + 42)}}{4} = \frac{\sqrt{(168)}}{4} = 4$$



$$\frac{\sqrt{(72 + 12 + 62 + 32)}}{4} = \frac{\sqrt{(180)}}{4} = 4.74$$



Basic Statistics

Correlation

Correlation (R)

It is the **measure of the degree of linear relationship between forecasted and observed data** and it can be calculated by using formula given below.

Its value ranges from +1 to -1

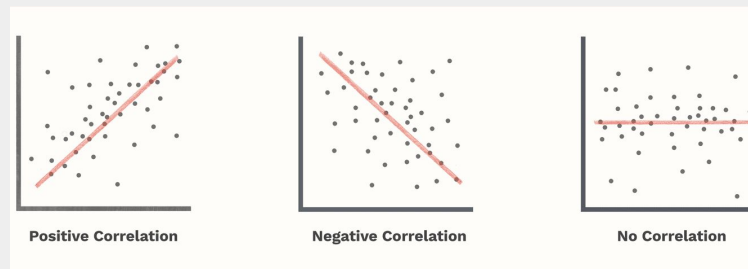
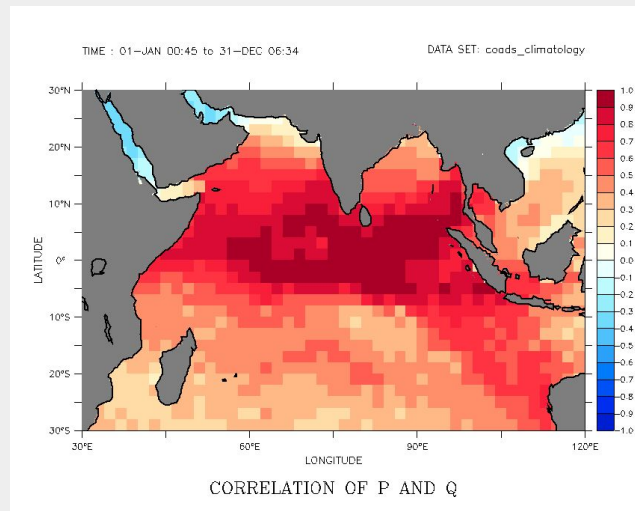
It is Positive (R=1), Negative (R=-1) and No correlation (R=0)

$$R_{(o,f)} = \frac{\sum_{i=1}^N (O_i - \bar{O})(F_i - \bar{F})}{\sqrt{\sum_{i=1}^N (O_i - \bar{O})^2 \sum_{i=1}^N (F_i - \bar{F})^2}}$$

$$R_{(o,f)} = \frac{\text{Cov}(O, F)}{\text{Std}_O \cdot \text{Std}_F}$$

$$R_{(o,f)} = \frac{\text{Covariance}(O, F)}{\sqrt{\text{variance}_O \cdot \text{variance}_F}}$$

Go variance



Basic Statistics

Climatology

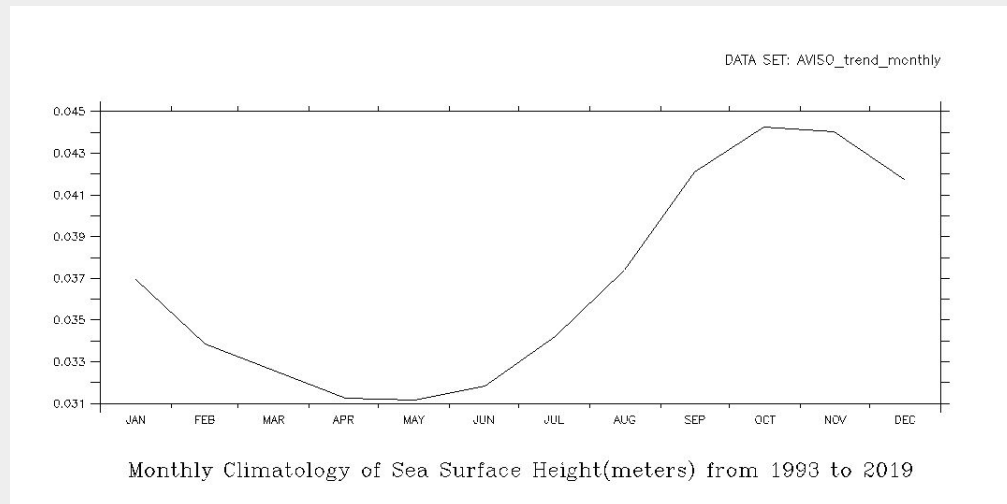
Climatology:

Long term average

Annual and Inter annual

Monthly and Seasonal etc.

Used mostly for climatological long spatial and temporal scale studies



`variable[GT=month_reg@MOD]`

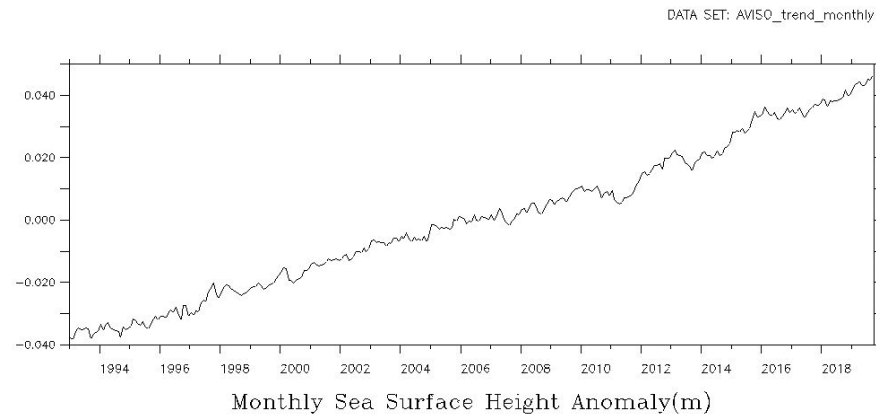
Basic Statistics

Anomaly

Anomaly:

Deviation from long term climatological mean

Used to various variabilities and corresponding processes



Variable - Variable[GT=month_reg@MOD]

Basic Statistics

Regression Analysis

Regression Analysis:

Degree of association between two or more parameters

Regression analysis is a statistical method that shows the relationship between two or more variables.

It generally contains, independent, dependent variables, slope, intercept and constants.

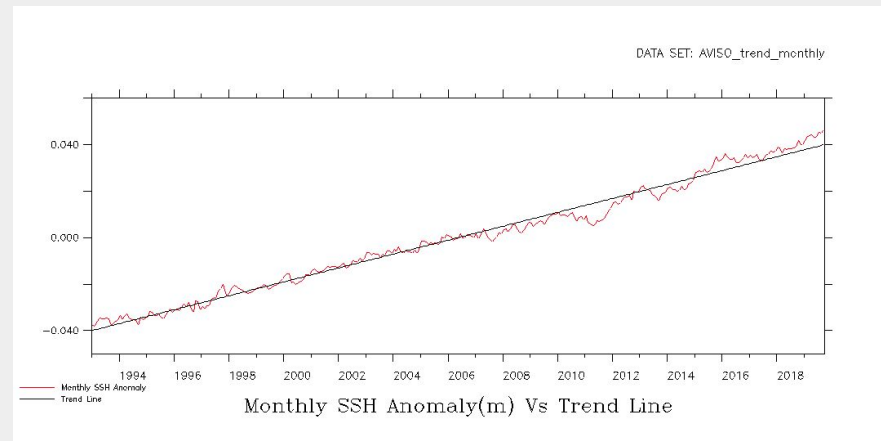
Various regression analysis are there such as

Linear

Multiple

Logistic etc.

Uses for future predictions and forecast



Go regresst

Basic Statistics

FFT

ffta(variable[l=])

Basic Statistics

Low Pass Filter

`lsl_lowpass (variable, cutoff_period, filter_span)`



Thank You for your kind patience

For more details, you can approach me through

INCOIS: - s.borra-p@incois.gov.in

Quora: <https://www.quora.com/profile/Sivaiah-Borra>

YouTube: <https://www.youtube.com/@guidemycareer-meteorology8816/featured>