

A satellite view of Earth showing a dense layer of white and grey clouds covering the surface. The curvature of the planet is visible at the top of the frame.

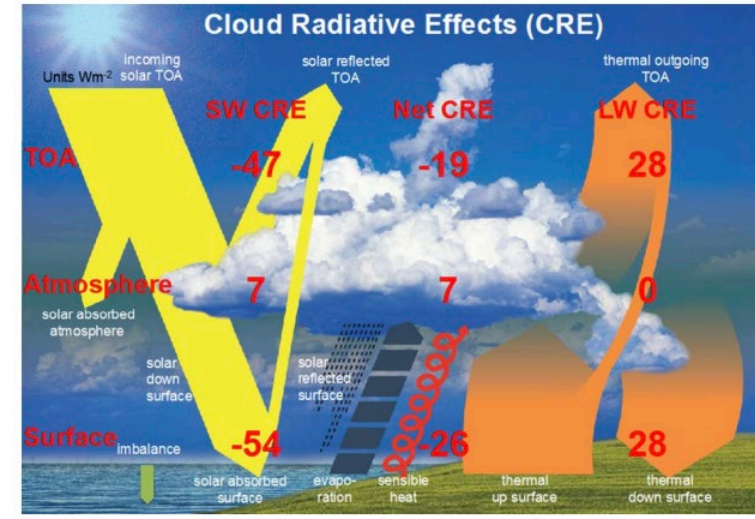
Long-term trend in Cloud Fraction using PATMOS-x v6.0 since 1980.

**With Michael Foster and Coda Philips
Andrew Heidinger and Tristan L'Ecuyer**

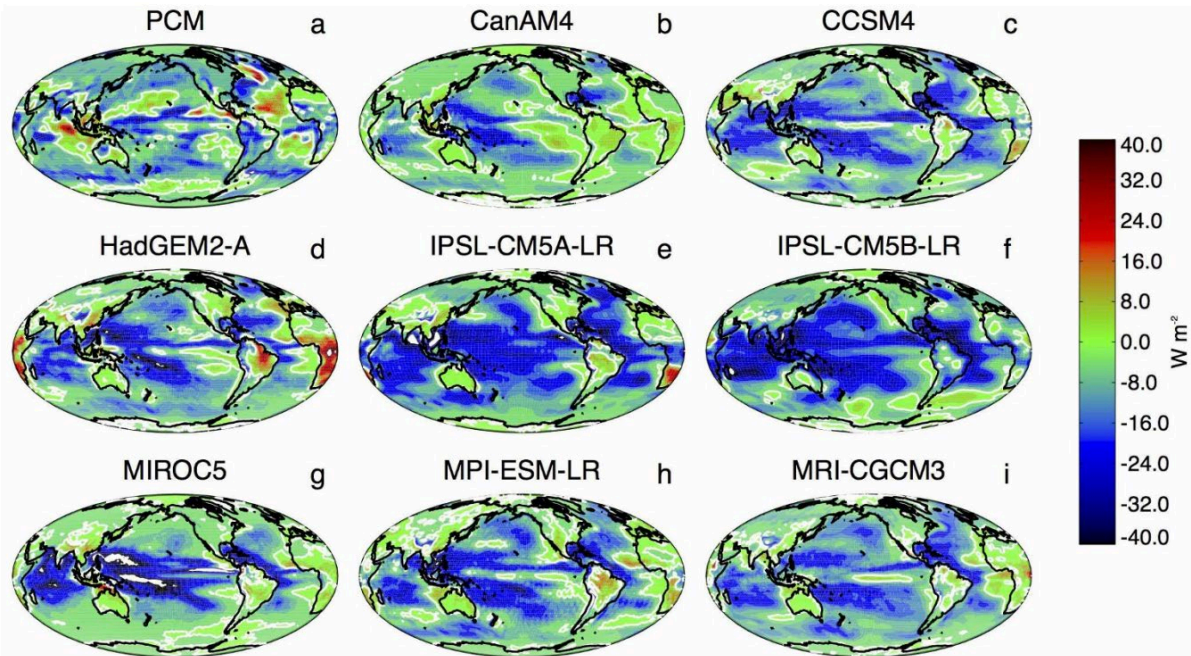
Jongjin Seo (Sam)

Scientific Background

- Clouds play an essential role in the regional weather as well as global climate change through direct and indirect radiative forcing at shortwave as well as longwave radiation.
- Climate models have uncertainties due to their multifaceted radiative and dynamical effects linked with high cloud feedback sensitivity.
- Global satellite-based cloud climate data records (CDRs) are sufficient to observe some variations in cloud amounts and processes on climate time scale (1980 – present).

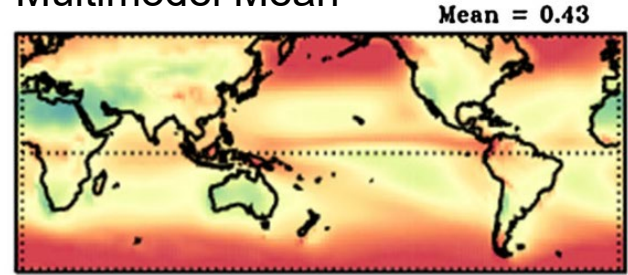


M. Wild et al. 2018

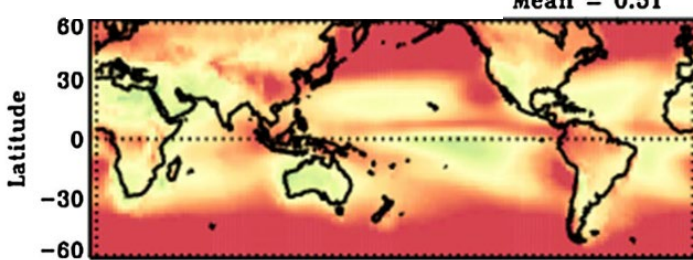


Sherwood et al. 2014

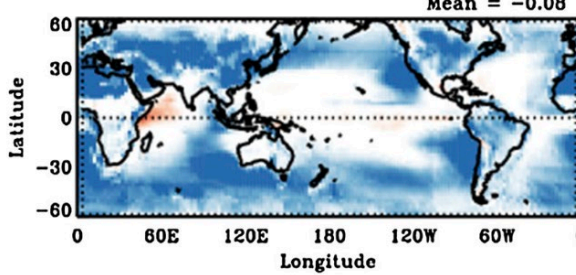
Multimodel Mean



Satellite Observation



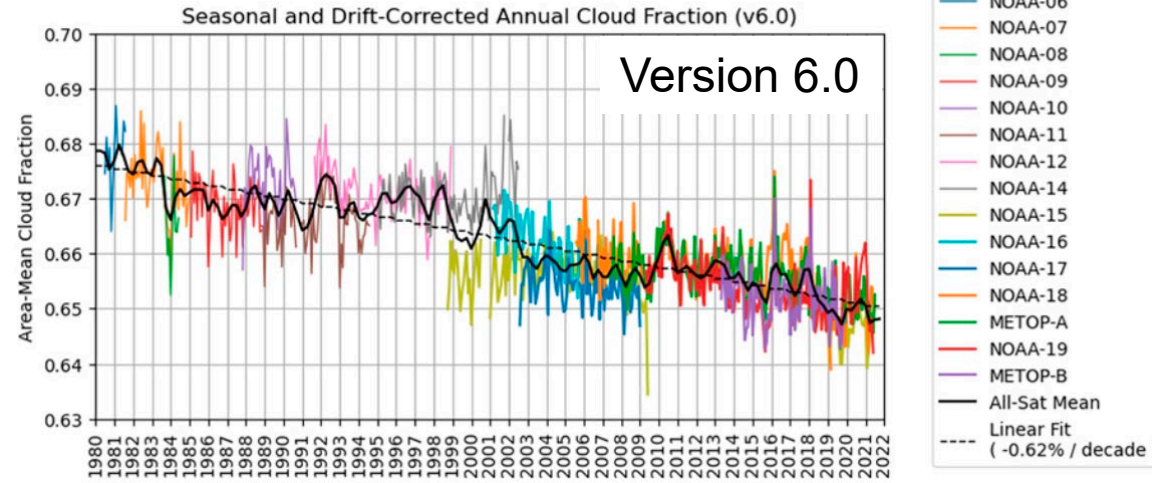
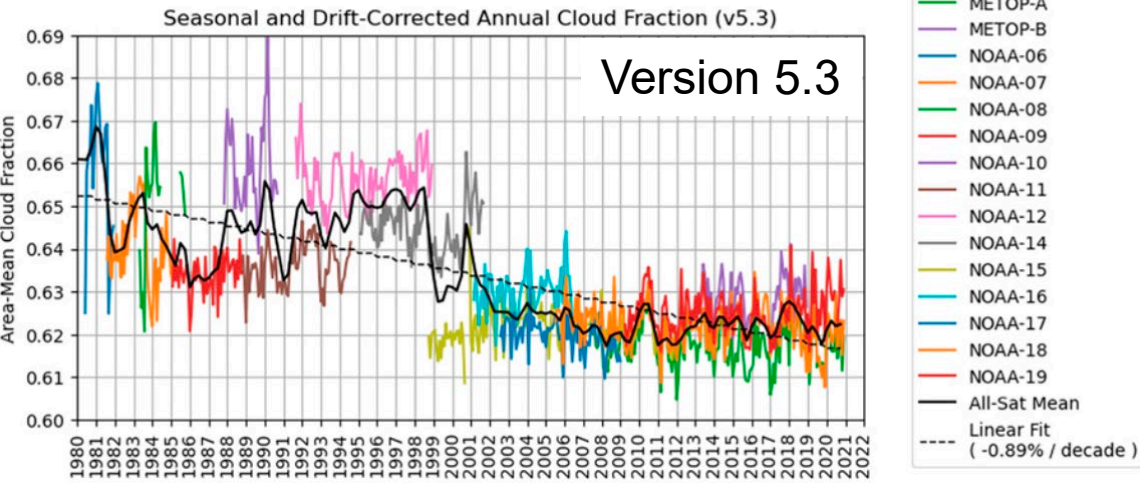
Model – Satellite



Klein et al. 2013

Scientific Background

- The Pathfinder Atmospheres–Extended (**PATMOS-x**) dataset developed by National Oceanic and Atmospheric Administration (**NOAA**) in collaboration with the University of Wisconsin-Madison Cooperative Institute for Meteorological Satellite Studies (**CIMSS**) is a long-term cloud record spanning 1979 to present.
- PATMOS-x cloud products are derived from the Advanced Very High Resolution Radiometer (**AVHRR**) sensors flown on the NOAA polar orbiting satellite series and European Organization for the Exploitation of Meteorological Satellites (**EUMETSAT**) Meteorological Operational (**MetOp**) satellites.
- Primary goal PATMOS-x project is to develop satellite-based climate data records (CDRs) of atmospheric cloud properties.
- PATMOS-x v6.0 (New version) is more stable and has more consistent polar cloud detection, phase distribution, and cloud top height distribution with less inter-satellite variability by using **'imager (AVHRR) plus sounder (HIRS)'** fusion method than PATMOS-x v5.3.



Foster et al. 2022

■ PATMOS-x v6.0 L2b Dataset

- Temporal Resolution = 2 observations per a day (Ascending and Descending)
- Spatial Resolution = $0.1^\circ \times 0.1^\circ$

■ Cloud Detecting and Typing

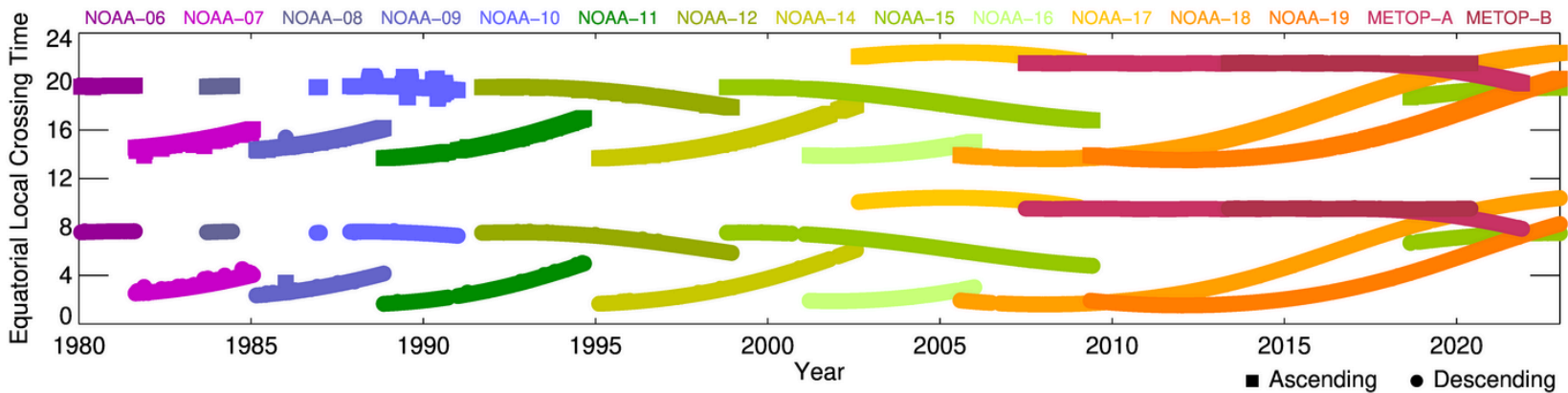
- NESDIS Enterprise Cloud Mask (ECM) represents an evolution of naïve Bayesian cloud detection algorithm (Heidinger et al. 2012)
- Cloud Types are classified with a minimum set of types evident in the spectral signatures. (Pavolonis et al. 2005)
- [Fog, Water, Supercooled Water, Mixed = **Water**, + Opaque Ice, Overlapping, Overshooting, Cirrus = **Ice**] = **All Cloud Type**

■ Make Monthly Mean Cloud Fraction

- All the observations corresponding to a specific month have been collected.
- Merging one hundred of $0.1^\circ \times 0.1^\circ$ pixels to one of $1.0^\circ \times 1.0^\circ$
- Filtering
 - 1) Bad Pixel Mask, 2) Glint Mask, 3) Sensor Zenith Angle $< 50^\circ$, 4) Minimum number of observation days per month > 10
- Surface Type = Ocean, Latitude = 60° S – 60° N

Data and Method

■ Apply Diurnal Correction (Correction for different local crossing time and orbit drifting)



- Do backfitting a Generalized Additive Model (GAM) for each $1.0^\circ \times 1.0^\circ$ grid box. (Foster et al. 2022)

- Give weighting to observations to make daily mean; $y_{\text{daily}} = \sum_{i=1}^{24} y_{\text{obs}} \left[\frac{F(x_i)}{F(x_{\text{obs}})} \right] \left\{ \frac{24^2 - (x_{\text{obs}} - x_i)^2}{24[\sum 24^2 - (x_{\text{obs}} - x_i)^2]} \right\}$ (Foster et al. 2013)

■ Statistical Significance of Trend (Weatherhead et al. 1998)

- Detection of long-term, linear trends is affected by number of factors, including time span of data and the magnitude of variability, and autocorrelation of the noise in the data.

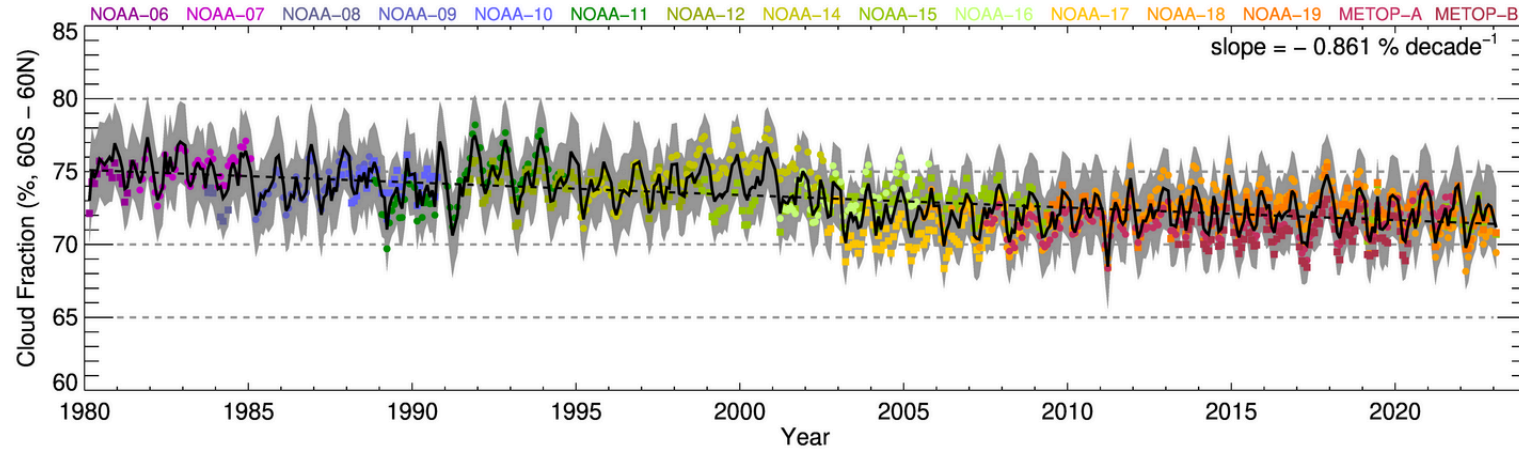
(1) $Y_t = \mu + \omega X_t + N_t$ (2) $N_t = \phi N_{t-1} - \varepsilon_t$

(3) $\sigma_N^2 = \text{Var}(N_t) = \frac{\sigma_\varepsilon^2}{(1-\phi^2)}$ (4) $\sigma_{\hat{\omega}} \approx \frac{\sigma_\varepsilon}{(1-\phi)} \frac{1}{n^{\frac{3}{2}}} = \frac{\sigma_N}{n^{\frac{3}{2}}} \sqrt{\frac{(1+\phi)}{(1-\phi)}}$ [$\sigma_{\hat{\omega}}$; Standard Deviation of generalized least squares estimator of the trend ω]

- $|\omega| > 1.96 \times \sigma_{\hat{\omega}} \rightarrow$ Statistically Significant at the 95% confidence level



Cloud Fraction [All Cloud Type]

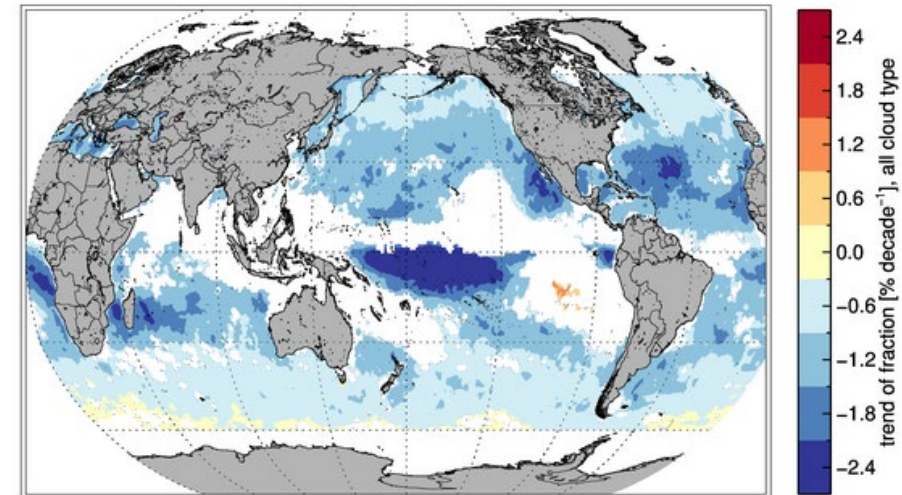
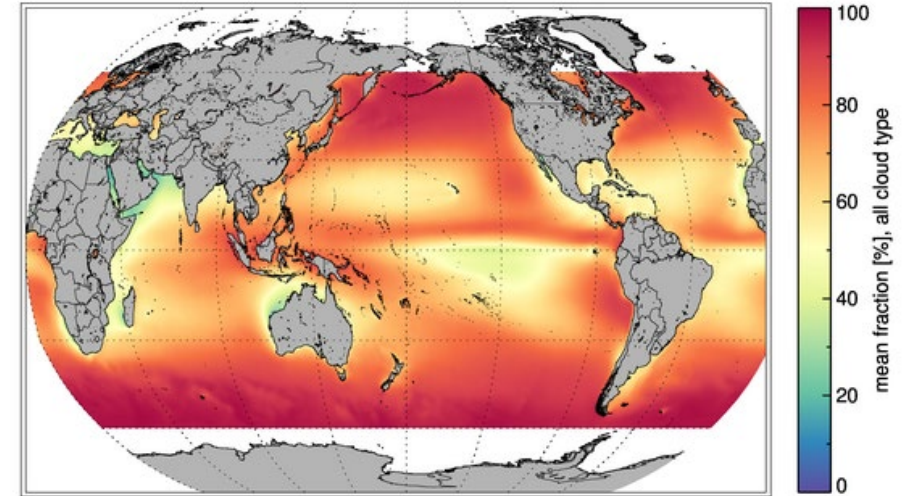


TimeSeries of Mean Cloud Fraction over Ocean

- Mean Cloud Fraction between 60°S and 60°N is decreasing by 0.86 % per decade.
- Min. Statistical Significance trend at the 95% confidence level = 0.20 % per decade.
- Decreasing trend of global cloud fraction is statistically significance.

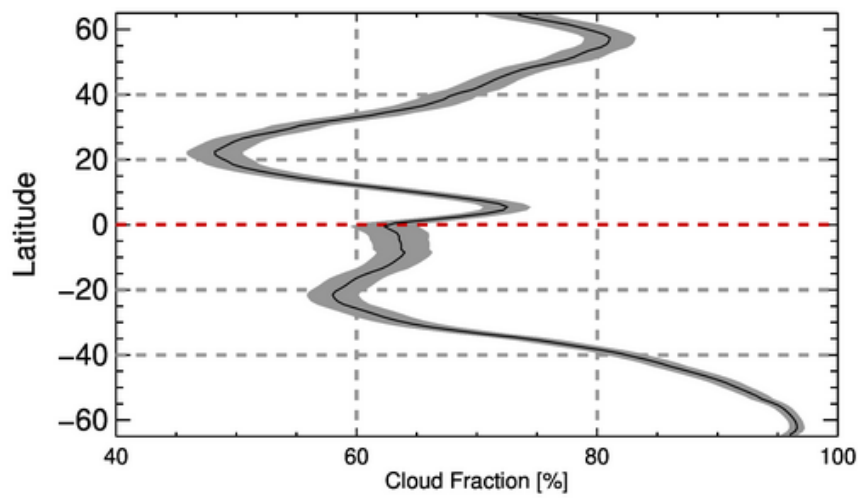
Global Map of Mean and Trend of Cloud Fraction

- Significant decreases are being observed in the central Pacific Ocean and mid-Latitude.
- In South America's west coast and Indonesia, there is a trend of increasing.
- Many regions continue to show a decreasing trend in cloudiness even after the statistical significance test.



Cloud Fraction [All Cloud Type]

Mean



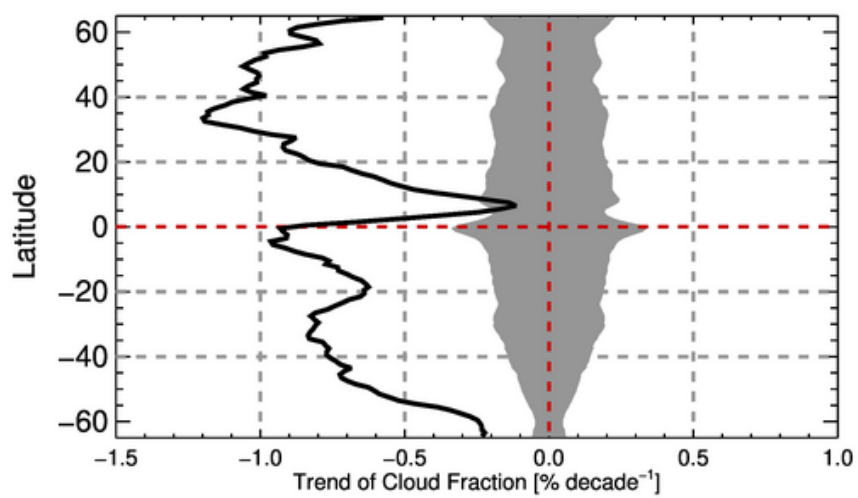
■ Monthly Cloud Fraction

- Range of Mean Cloud Fraction is from 65% on August to 74% on December.
- Min. Statistical Significance trends at the 95% confidence level < 0.10 % per decade.
- Clouds show a decreasing trend in all months (July = -0.63%, April = -0.84%)

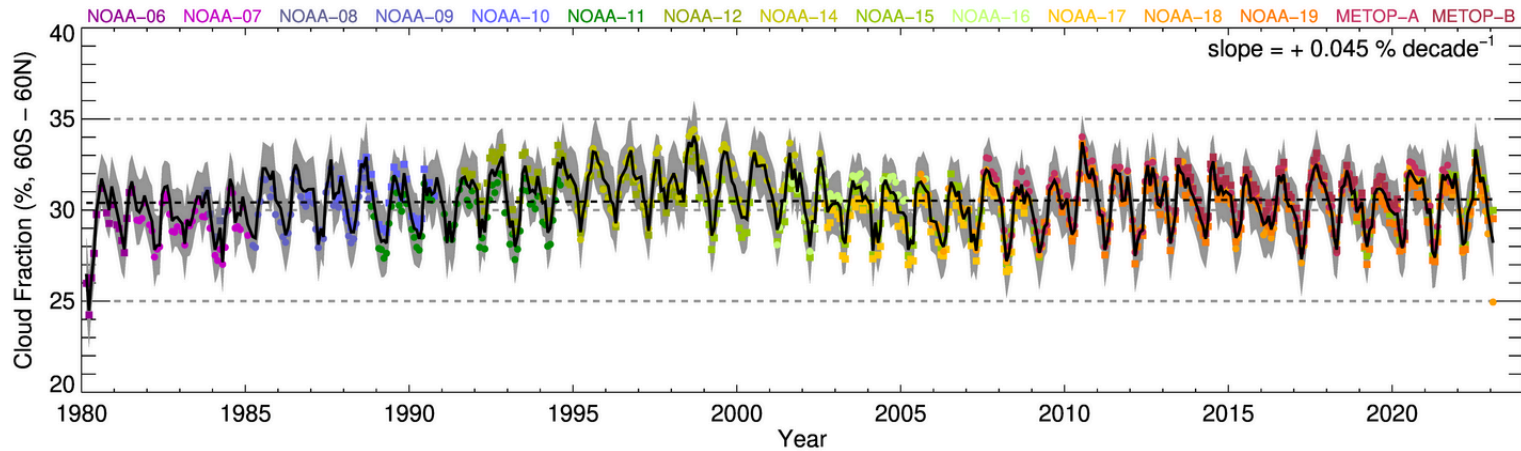
■ Latitudinal Cloud Fraction

- Range of Mean Cloud Fraction is from 50% at 20°N and 90% at 60°S.
- Cloudiness is decreasing at all latitudes, and most of trends are statistically significant except near the equator.
- The highest decreasing trend is observed at 30°N (-1.2% per decade)

Trend



Cloud Fraction [Water Cloud Type]

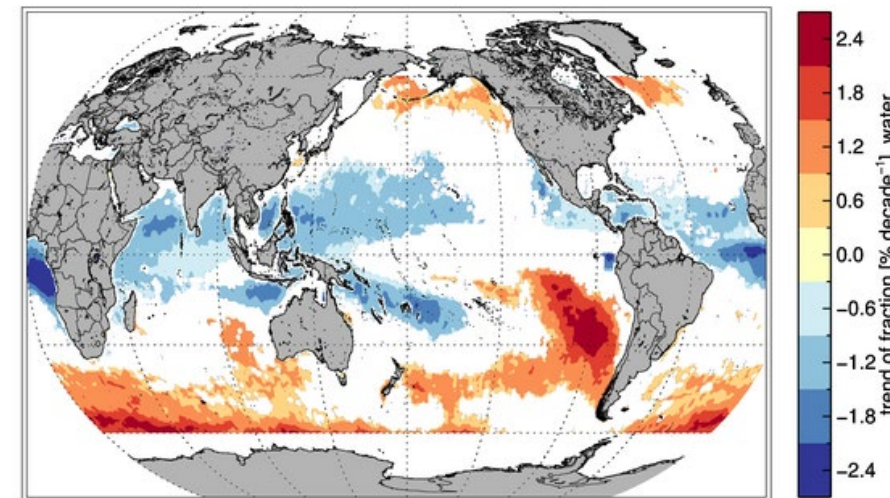
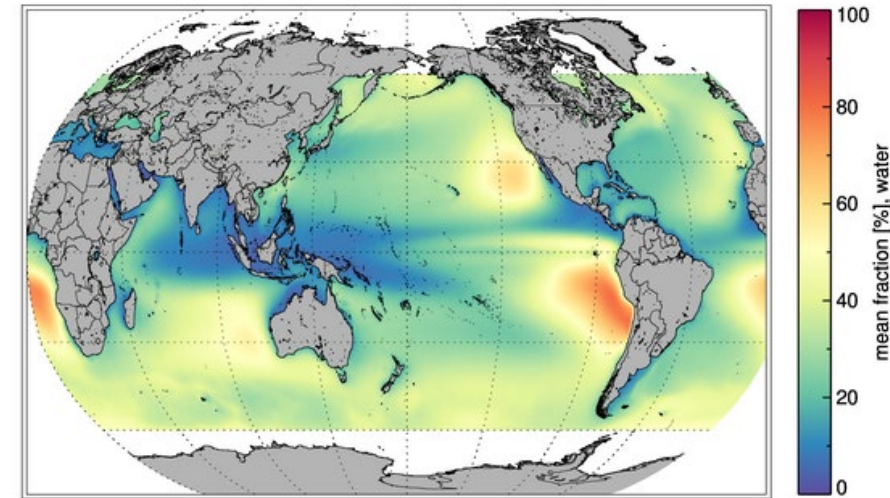


TimeSeries of Mean Cloud Fraction over Ocean

- Mean Cloud Fraction between 60°S and 60°N is increasing by 0.045 % per decade.
- Min. Statistical Significance trend at the 95% confidence level = 0.26 % per decade.
- Trend of global water cloud fraction is not statistically significance.

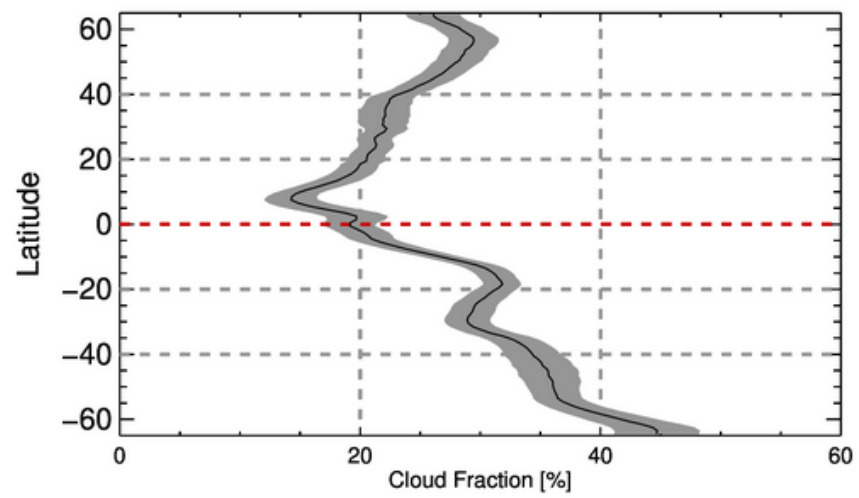
Global Map of Mean and Trend of Cloud Fraction

- Significant decreasing are being observed near the equator and west coast of Africa.
- In South America's west coast and mid-latitudes, there is a trend of increasing.
- Many regions continue to show a decreasing and increasing trend in cloudiness even after the statistical significance test.



Cloud Fraction [Water Cloud Type]

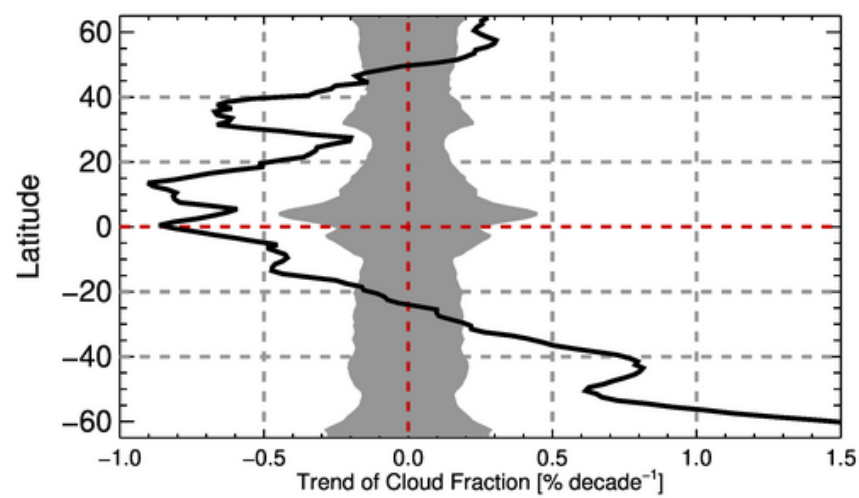
Mean



■ Monthly Cloud Fraction

- Range of Mean Cloud Fraction is from 25% on April to 29% on October.
- Min. Statistical Significance trends at the 95% confidence level < 0.06 % per decade.
- Clouds show a decreasing trend in most months except for August (+0.03%).
- There are eight months with a statistically significant decreasing trend.

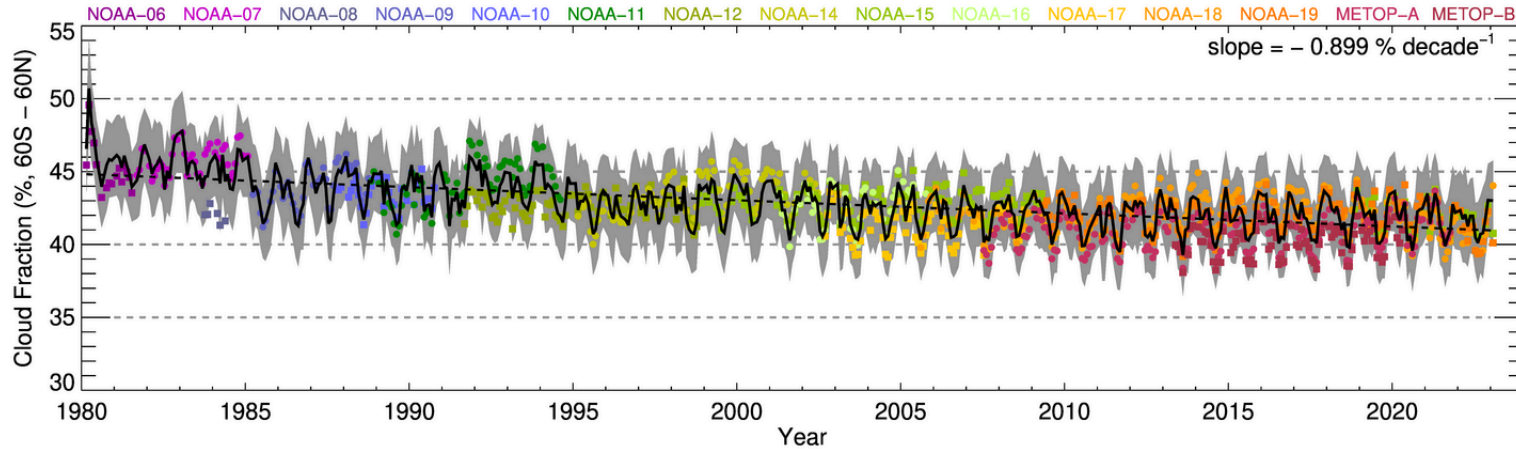
Trend



■ Latitudinal Cloud Fraction

- Range of Mean Cloud Fraction is from 15% at 10°N and 45% at 60°S.
- Cloudiness is decreasing between 20°S and 40°N
- The highest decreasing trend is observed at 15°N. (-0.9% per decade)
- Cloud Fraction is increasing above 50°N and 30°S.
- The highest increasing trend of water cloud is observed at 60°S. ($+1.5\%$ per decade)

Cloud Fraction [Ice Cloud Type]

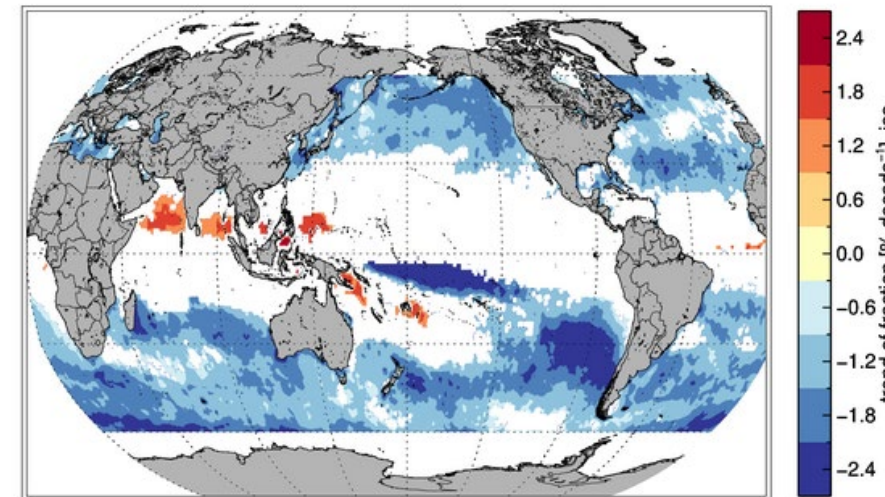
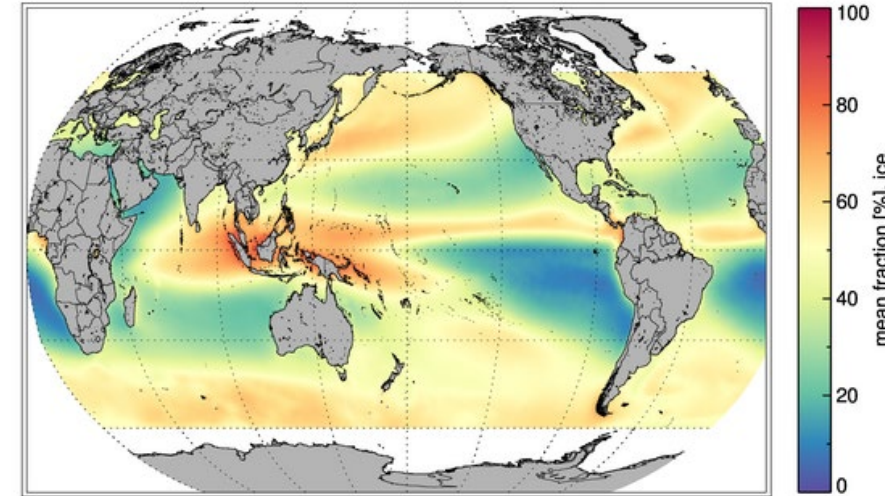


TimeSeries of Mean Cloud Fraction over Ocean

- Mean Cloud Fraction between 60°S and 60°N is decreasing by 0.899 % per decade.
- Min. Statistical Significance trend at the 95% confidence level = 0.20 % per decade.
- Decreasing trend of global ice cloud fraction is statistically significance.

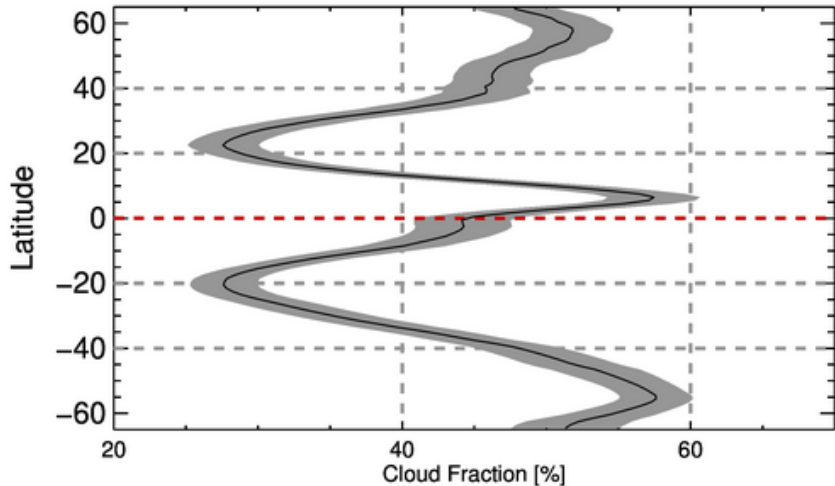
Global Map of Mean and Trend of Cloud Fraction

- Decreasing trends are dominant except for Indonesia and Arabian Sea.
- Mid-latitude regions continue to show a decreasing trend in cloudiness even after the statistical significance test.



Cloud Fraction [Ice Cloud Type]

Mean



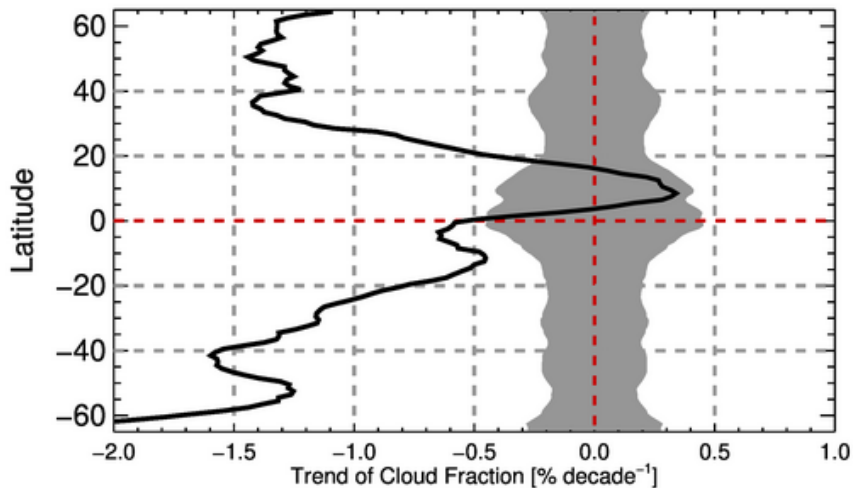
■ Monthly Cloud Fraction

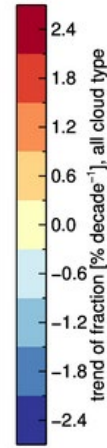
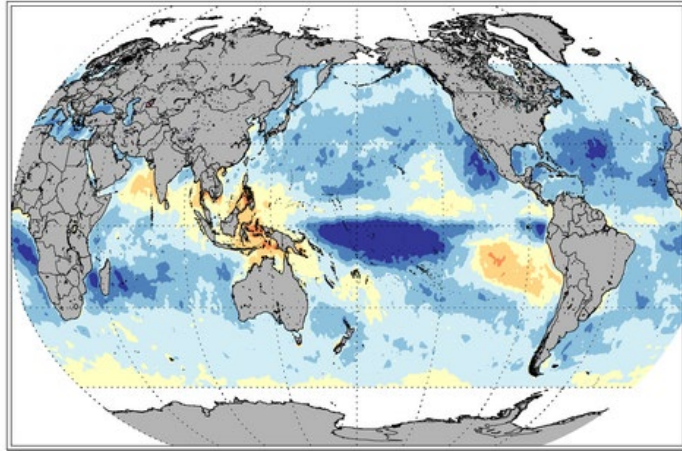
- Range of Mean Cloud Fraction is from 38% on September to 48% on December.
- Min. Statistical Significance trends at the 95% confidence level < 0.10 % per decade
- Clouds show a decreasing trend in all months and statistically significant. (Oct; -1.1% , July; -0.76% per decade)

■ Latitudinal Cloud Fraction

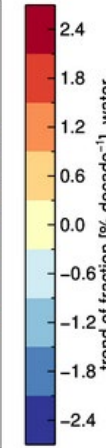
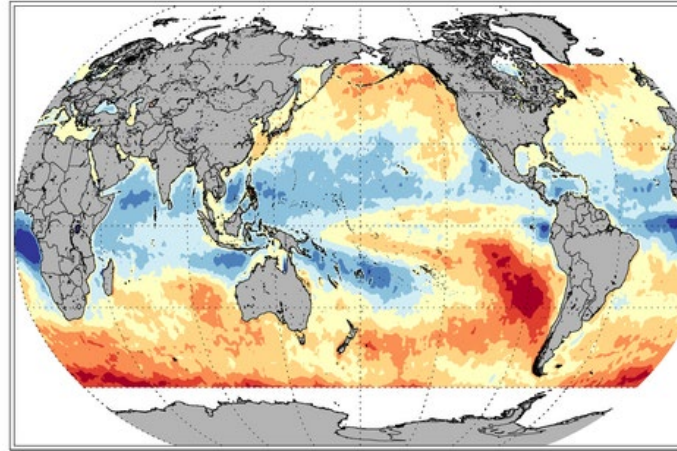
- Range of Mean Cloud Fraction is from 30% at 20°N/S and 60% at 5°N and 60°S.
- Cloudiness is decreasing except for between 0°N and 20°N
- The highest decreasing trend is observed at 60°S. (-2.0% per decade)
- Cloud Fraction is increasing between 0°N and 20°N.
- An Increasing trend of ice clouds is observed at 10°N. ($+0.35\%$ per decade), but it is not statistically significant.

Trend

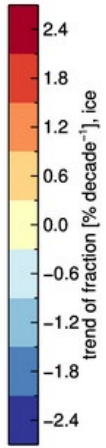
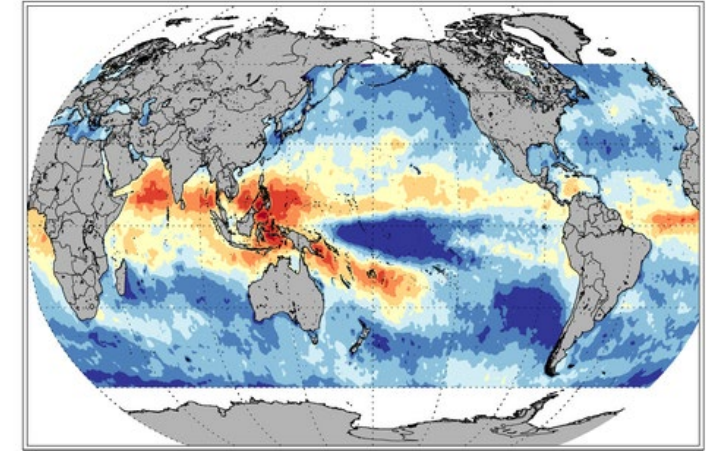




All Cloud Type



Water Cloud Type



Ice Cloud Type

■ All Cloud Type

- Cloudiness is decreasing in most regions, and these are statistically significant.
- Decreasing trends are being observed at every latitude and month.

■ Water Cloud Type

- Decreasing trends are observed near the equator and increasing trends are observed at the west coast of South America and mid-latitude regions.
- Decreasing trends are dominant in monthly mean water cloudiness.

■ Ice Cloud Type

- Ice cloudiness is decreasing in most regions, and most of the decreasing trends are statistically significant.
- Decreasing trends are being observed at every latitude and month.
- Ice cloudiness is increasing near the equator, but it is not statistically significant.

- **Comparison with other observations and models.**

- Other dataset from satellites using AVHRR, MODIS, and CALIPSO, Climate models...

- **Studying trends in other cloud products**

- Cloud Radiative Effect, Cloud Top Height, Cloud Top Pressure, and Cloud Top Temperature.

- **Investigating relationship between trends in cloudiness and atmospheric drivers**

- ENSO, inversion strength, surface temperature, vertical velocity at 500 mb, ...

- **Developing ECM2 Cloud Masking**

- Investigating classifiers and training dataset to improve accuracy of cloud detection.

- **Investigating Consistency between AVHRR satellites and VIIRS satellites**

- Comparing between AVHRR (NOAA-18 and 19, and MetOp-A and B) and VIIRS satellites (NOAA-20 and Suomi-NPP)

Thank You 😊