



## Introduction

The idea of constructing networks from climate time series taken at geographical grid points states a quite young and promising approach to provide novel insights into the dynamics of the climate system [1-4]. Working on this method aims at a better understanding of the current change in the global climate regime by spotting the climate system's internal dynamics (such as circulation or oscillation patterns) on a global and local scale.

In this work we intend to capture the 1970's warming trend [5,6] by comparing two climate networks constructed from data before and after 1974, respectively. Data is taken from NCAR/NCEP Reanalysis Project [7]. Monthly averaged surface air temperature (SAT), Reanalysis Data, Jan 1948 - Dec 2008, resolution 2.5x2.5.

## Network Construction

A network consists of vertices and edges (in our case,  $N$  geographical grid points and their eventually synchronized behaviour). The climate networks are constructed by thresholding the  $N \times N$  correlation matrix  $M_{ij}$  representing the correlation strength between all spatial grid points calculated from Pearson Correlation Coefficient. The threshold  $\tau = \tau(\rho)$  is chosen according to a prescribed link density  $\rho$ .

The resulting  $N \times N$  adjacency Matrix  $A_{ij}$  represents the climate network:

$$A_{ij} = \begin{cases} 0 & \text{if } M_{ij} < \tau(\rho) \\ 1 & \text{if } M_{ij} \geq \tau(\rho) \end{cases}$$

## Vertex Centrality

Vertex centrality  $VC_\nu$  measures the number of nodes a single vertex  $\nu$  is connected to:

$$VC_\nu = \sum_{i=1}^N A_{\nu i}$$

Regions with high  $VC_\nu$  can include local as well as long range connections and can therefore be interpreted as important in sustaining the network structure.

## Betweenness Centrality

Betweenness centrality  $BC_\nu$  measures the number of topologically shortest paths  $\sigma_{ij}$  containing vertex  $\nu$ :

$$BC_\nu = \frac{\sum_{i,j \neq \nu} \sigma_{ij}(\nu)}{\sum_{i,j=1}^N \sigma_{ij}}$$

Assuming that climate information (e.g., climate dynamics) is circulated along the shortest path, areas with high  $BC$  imply playing a crucial role in information flow within the climate network on a global scale (citation Jona).

## Preliminary Results and Conclusions

The trend analysis reveals a change of network structure in the tropics, as the density of connections between nodes ( $VC$ ) decreased significantly mainly in the Pacific Ocean which might be connected to the reported change of the El Nino Southern Oscillation Pattern ENSO in the 1970's [6,8].

As for the  $BC$  centrality measure, formerly pronounced and coherent current like structures appear to have weakened, almost dissolving. This points to a loss of internal connectivity of the climate system and suggests a decrease of its ability of global information transport.

Further investigation aims at analyzing more in detail the relation to the dynamics of climate change.

1948-74

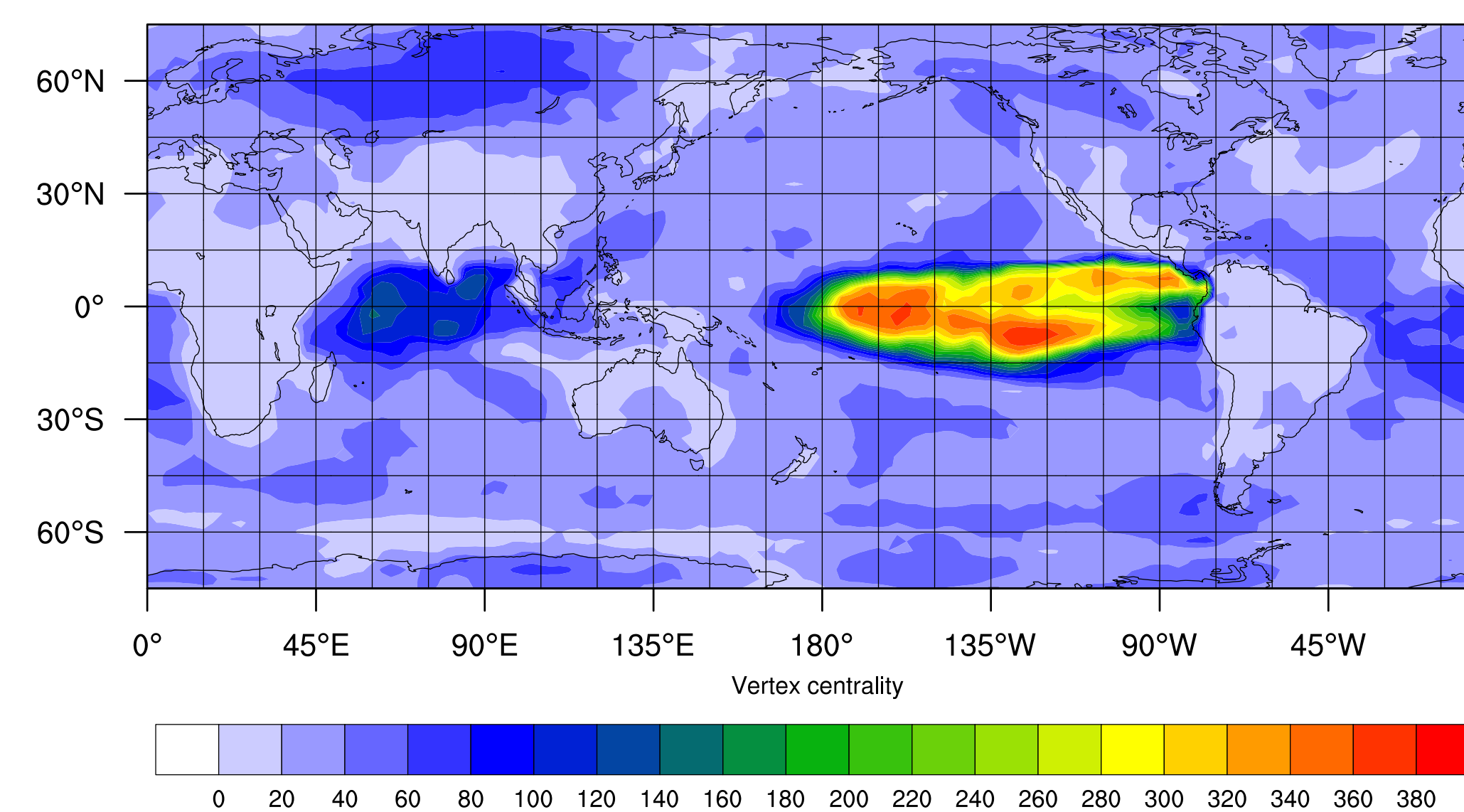


FIGURE 1: Vertex Centrality for SAT network, 1948-1974, NCEP/NCAR reanalysis,  $\rho = 0.005$

1975-2008

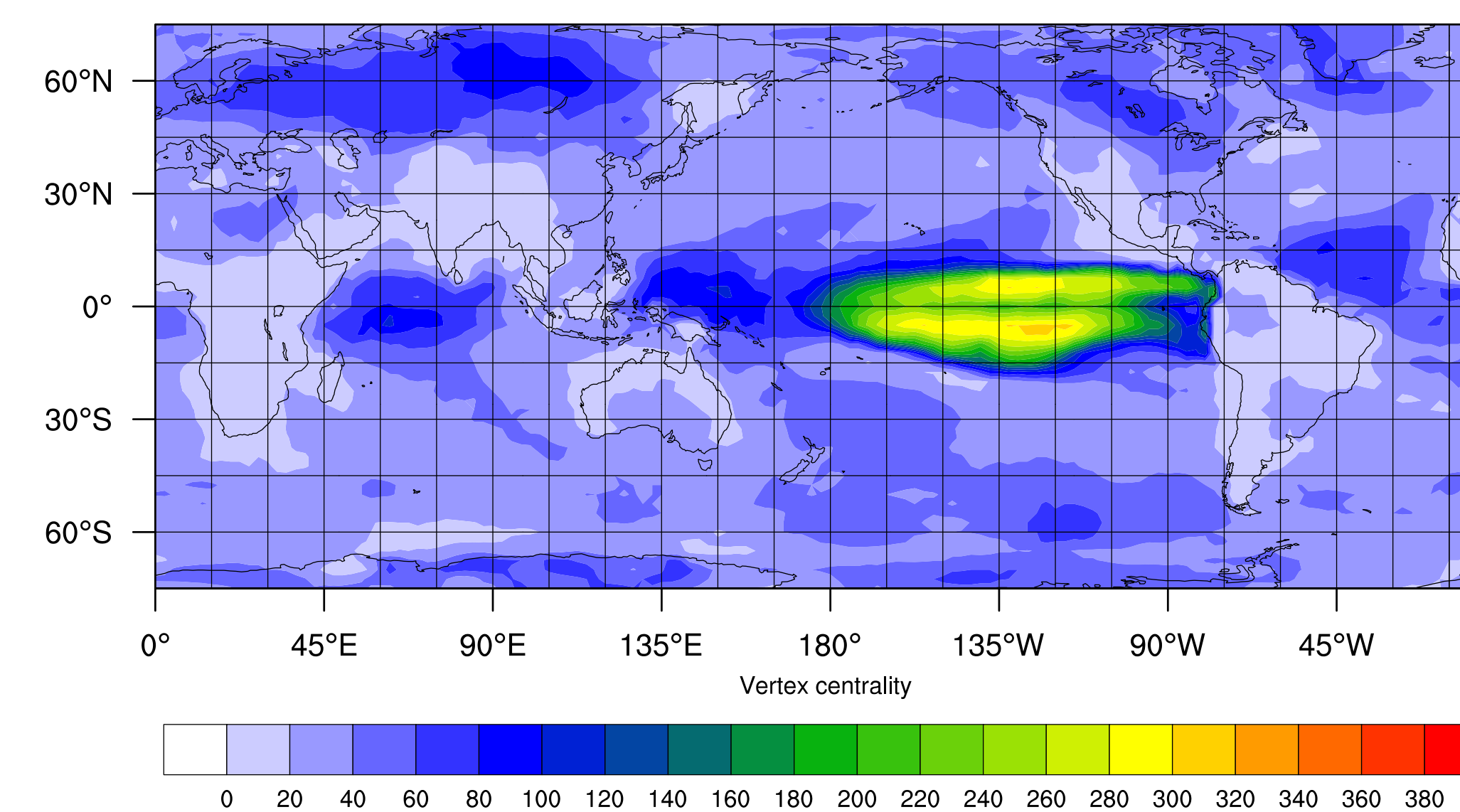


FIGURE 2: Vertex Centrality for SAT network, 1975-2008, NCEP/NCAR reanalysis,  $\rho = 0.005$

Difference

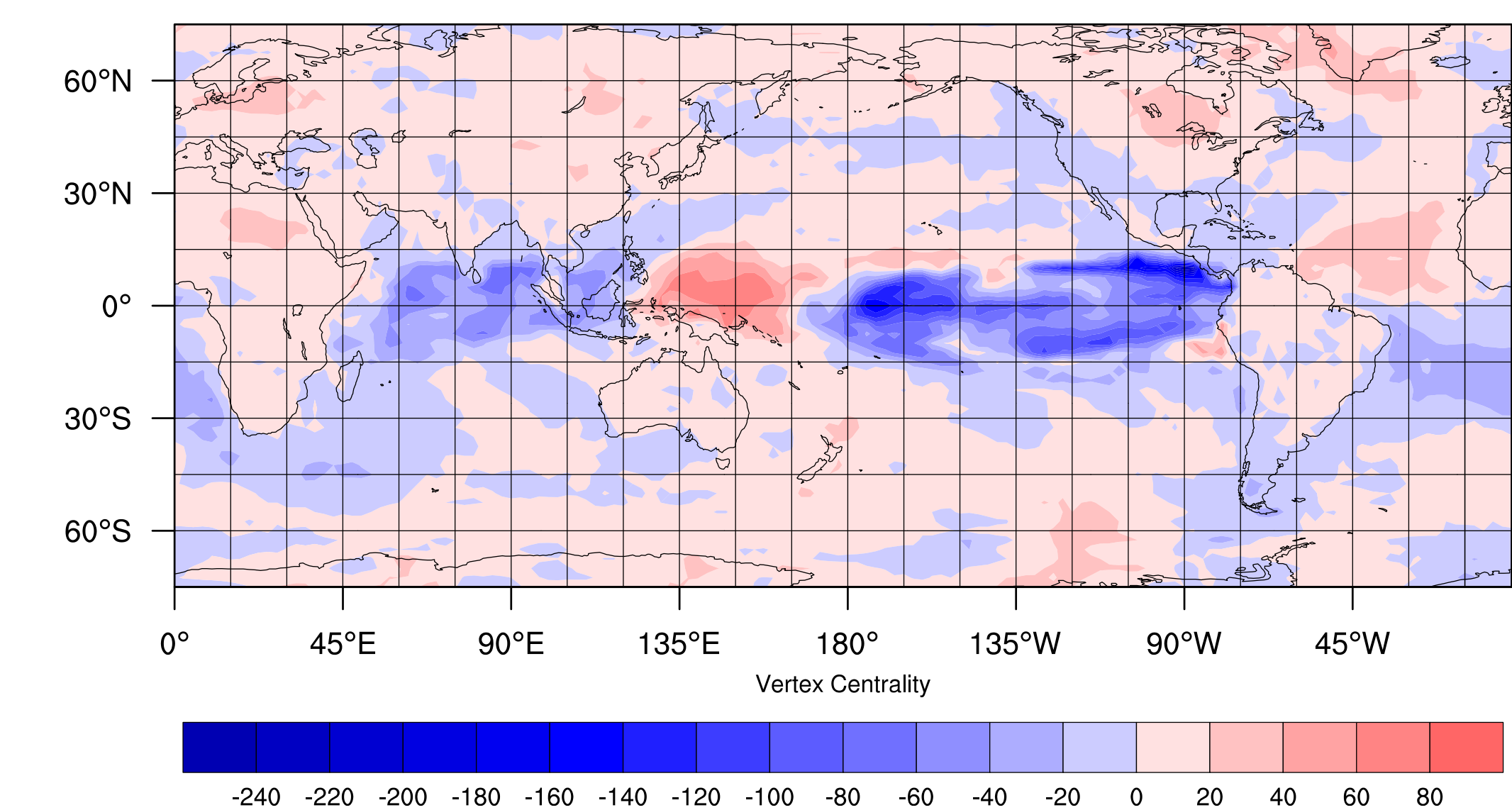


FIGURE 3: Trend Difference in Vertex Centrality

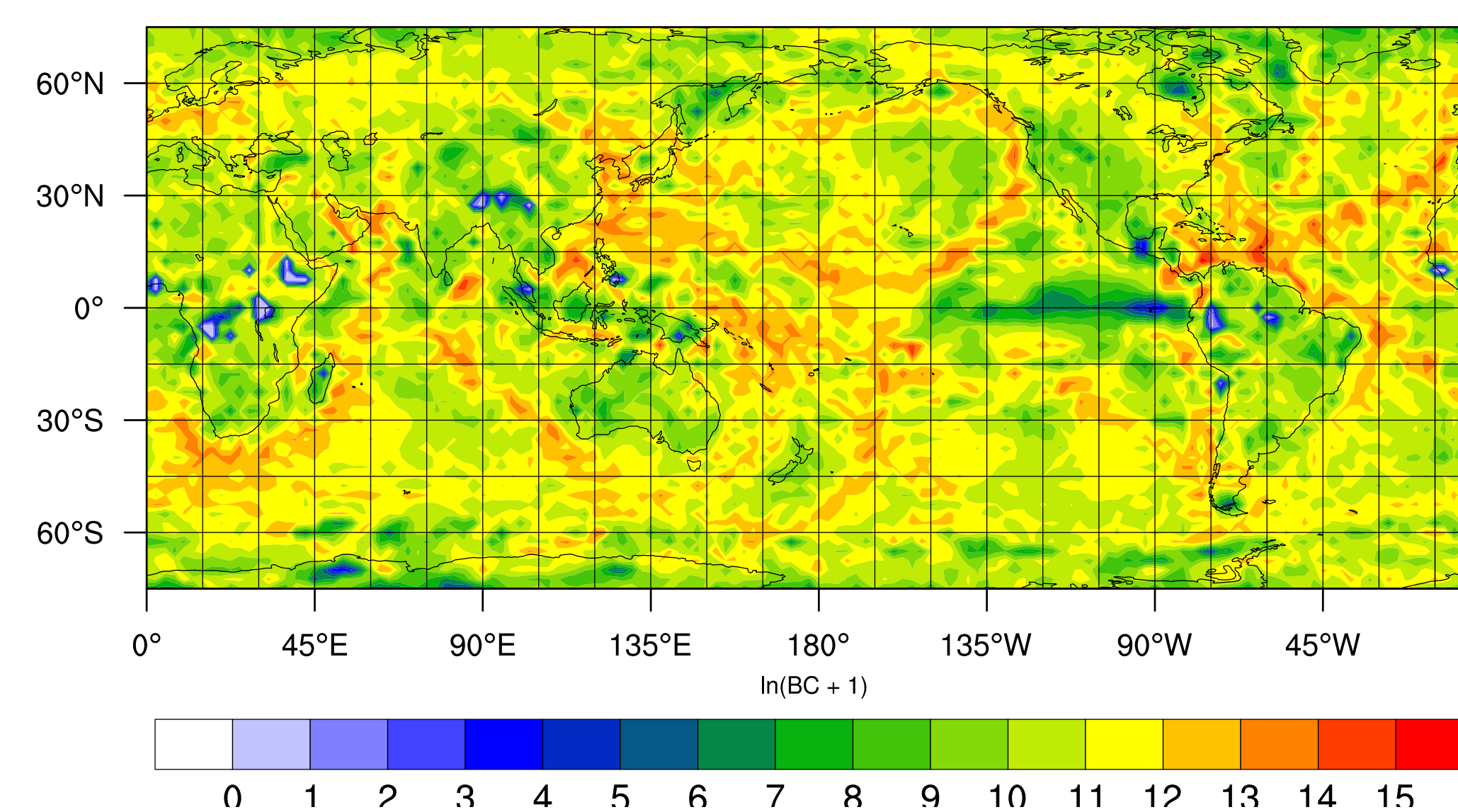


FIGURE 1: Betweenness Centrality for SAT network, 1948-1974, NCEP/NCAR reanalysis,  $\rho = 0.005$

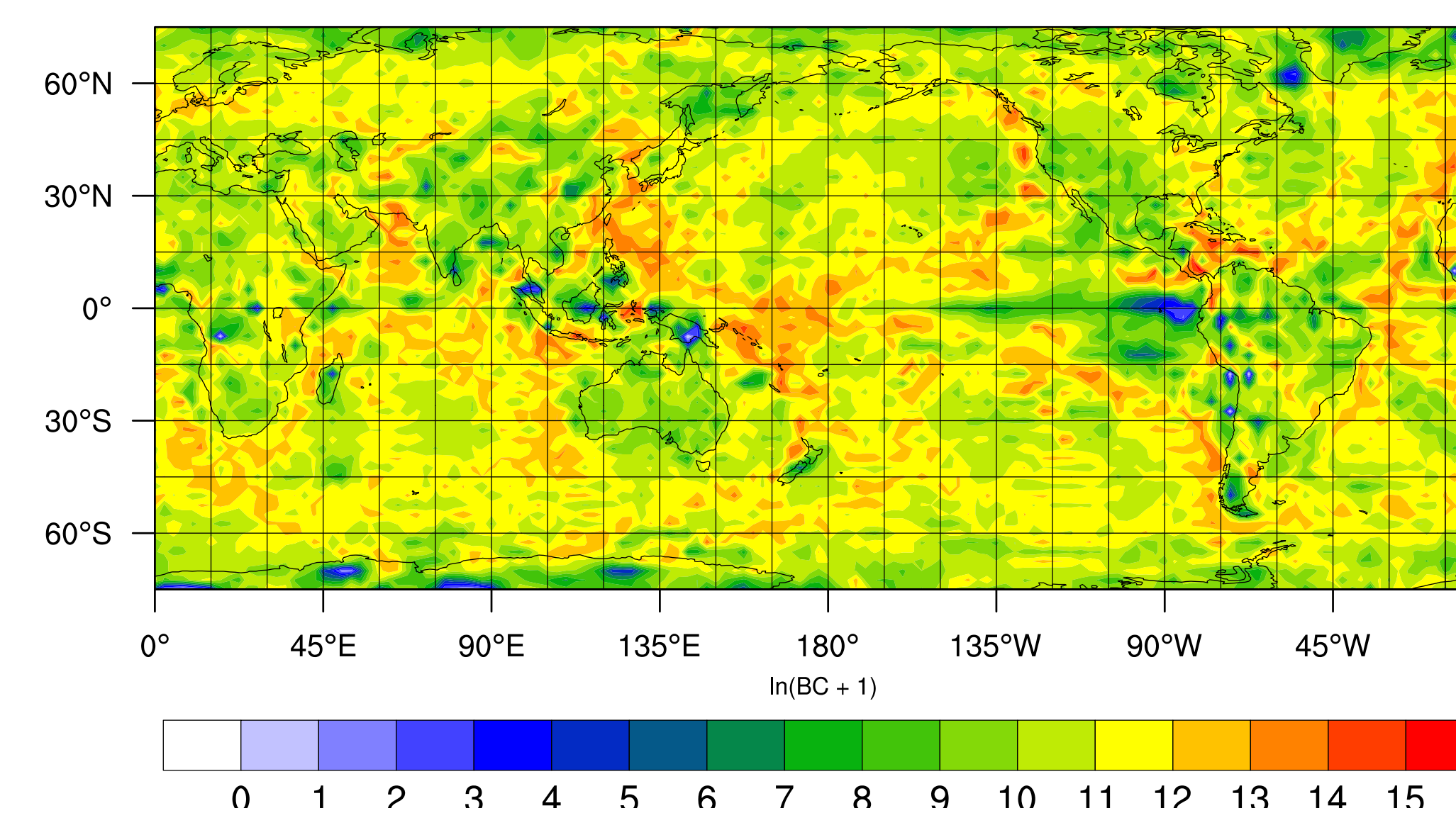


FIGURE 2: Betweenness Centrality for SAT network, 1975-2008, NCEP/NCAR reanalysis,  $\rho = 0.005$

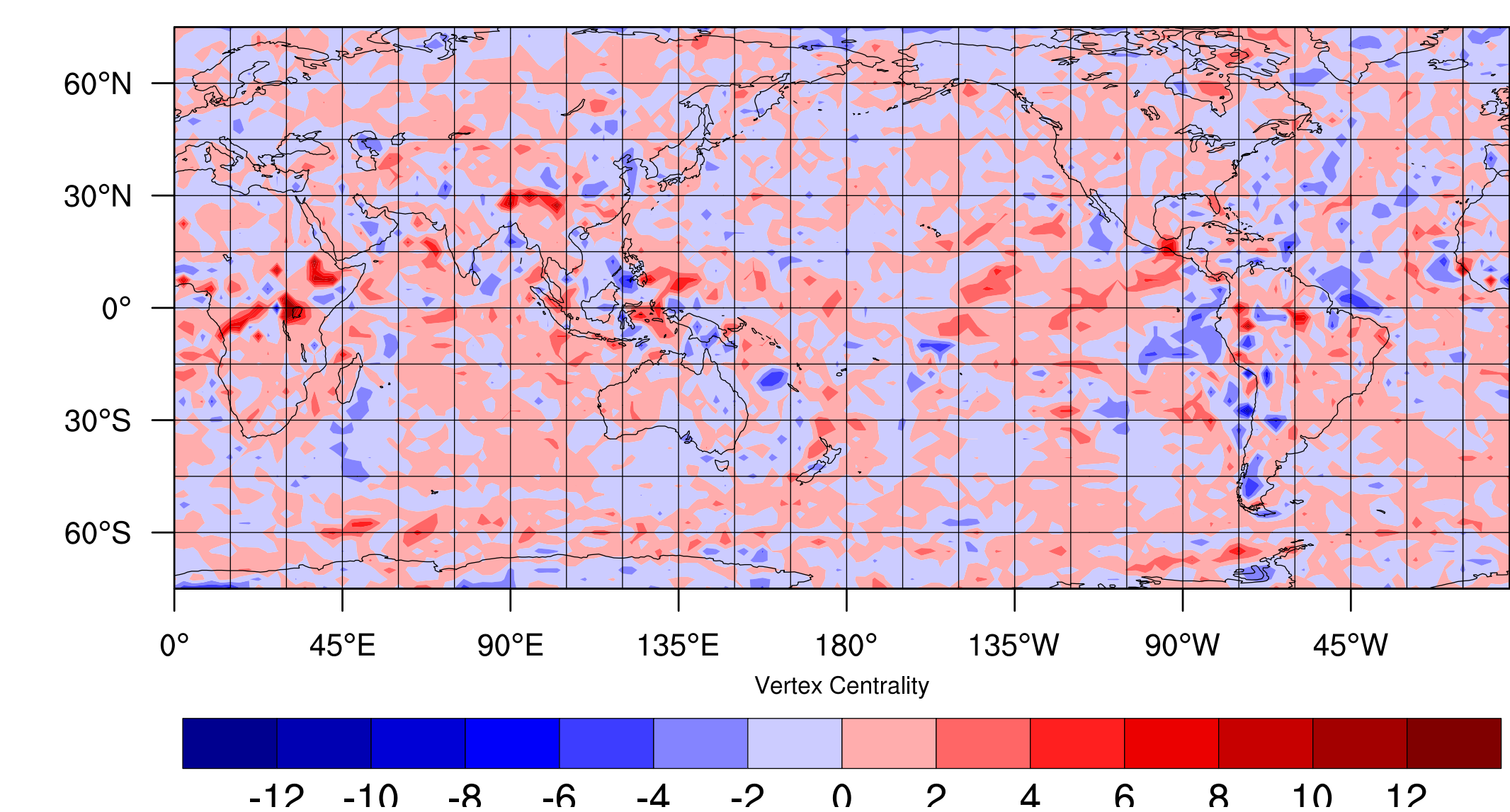


FIGURE 3: Trend Difference in Betweenness Centrality

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