



# Identifying the Causal Network of Sea Level Variability Domains in the Southeast Pacific:

## An application of satellite altimetry

End of internship presentation by Eike Schütt  
15.06.2021

# STRUCTURE

Introduction

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Datasets

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deltaMaps – method and results

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PCMCI – method and results

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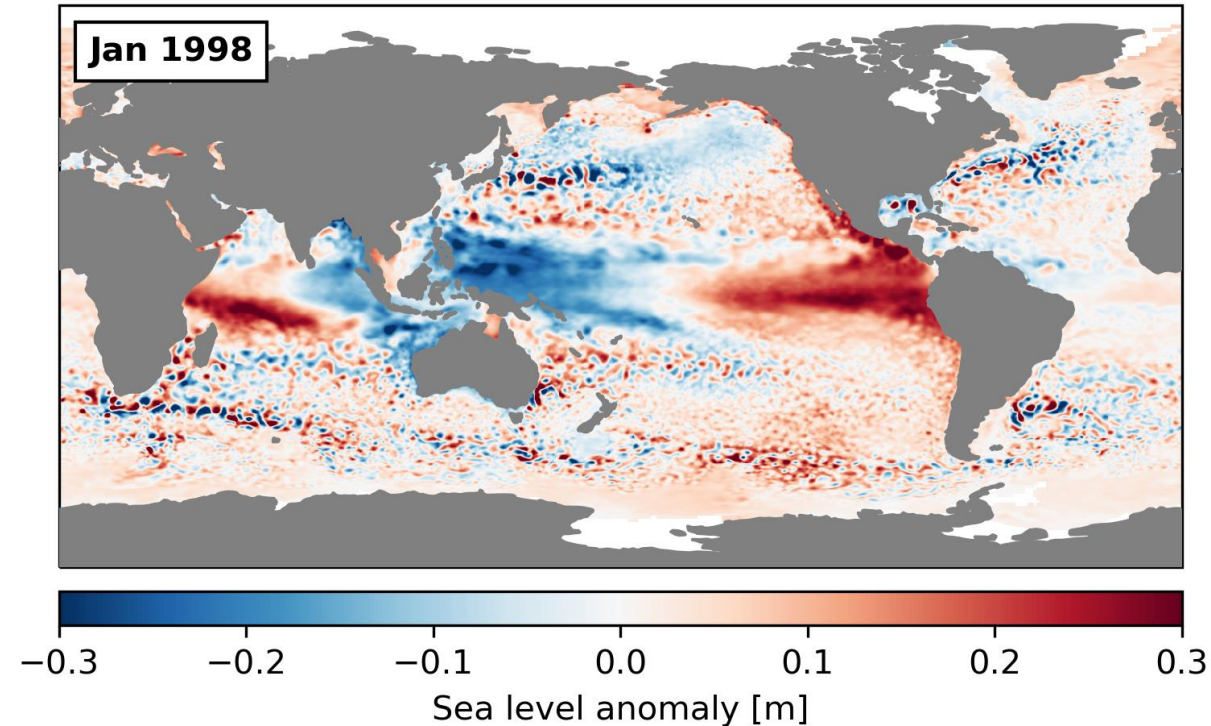
Causal SLV network in the SE Pacific

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Conclusion

# Introduction

- To improve SLR projections, sea level variability (SLV) must be better understood
- Many processes contribute to SLV
- Goals:
  - Identify SLV Domains
  - Infer the network between the Domains
  - Interpret SLV network in the Southeast Pacific (SEP)





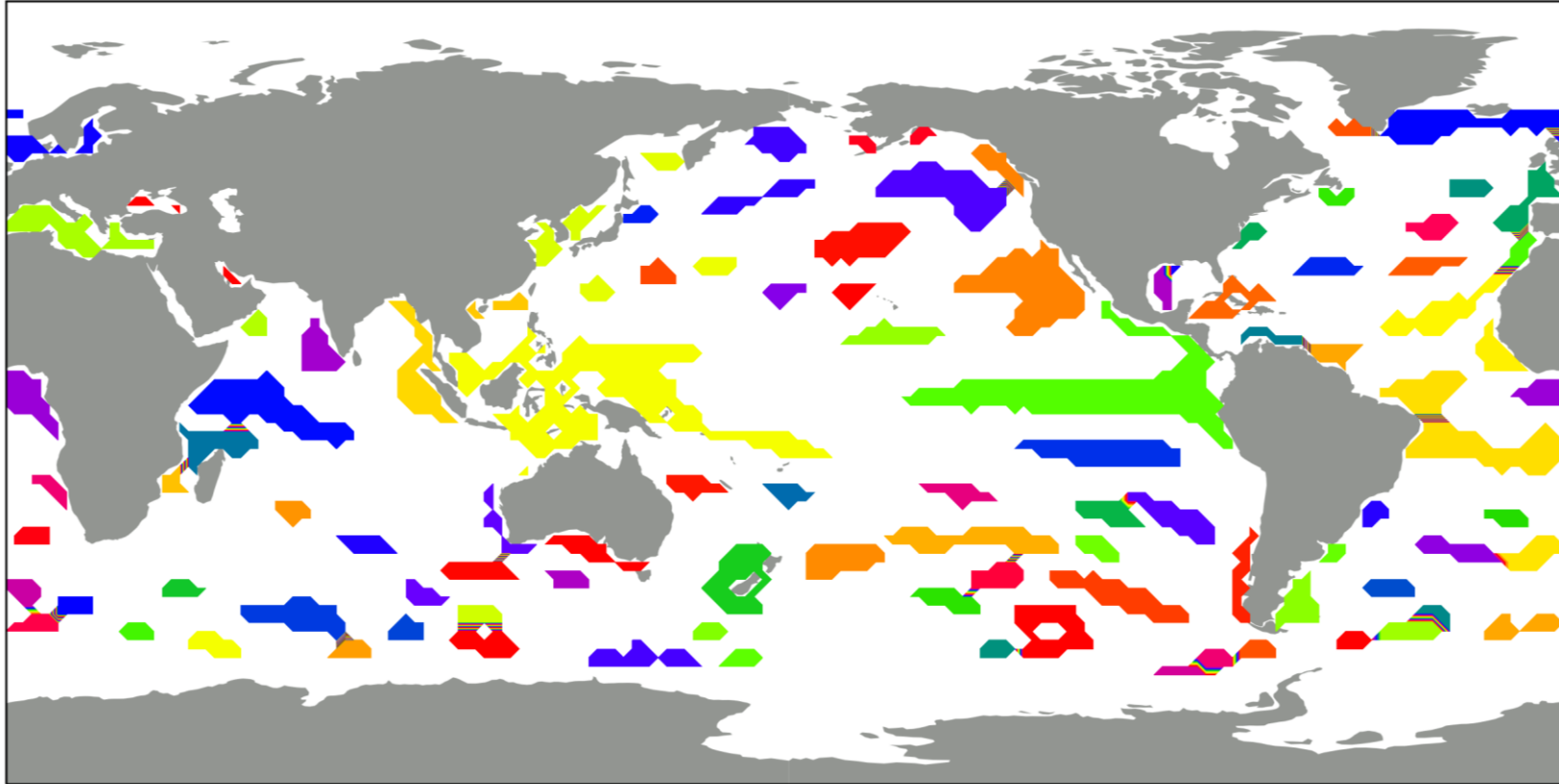
# Datasets

- Monthly SLA satellite altimetry data from AVISO (Jan 1993-Feb 2020)
  - Resampled to 2° and smoothed
  - Removed seasonality and linear trend
  - Removed regions higher than 66°S/N
- Current velocities from GLORYS12V1 reanalysis
- Wind and sea level pressure from ERA5 reanalysis
- Niño3.4 SST index from NOAA

# deltaMaps - Method

- Novel clustering algorithm by Fountalis et al. (2018) and Falasca et al. (2019)
- Python version on GitHub
- Identifies regions in which the measured signal is relatively similar over time
- Many advantages over similar methods

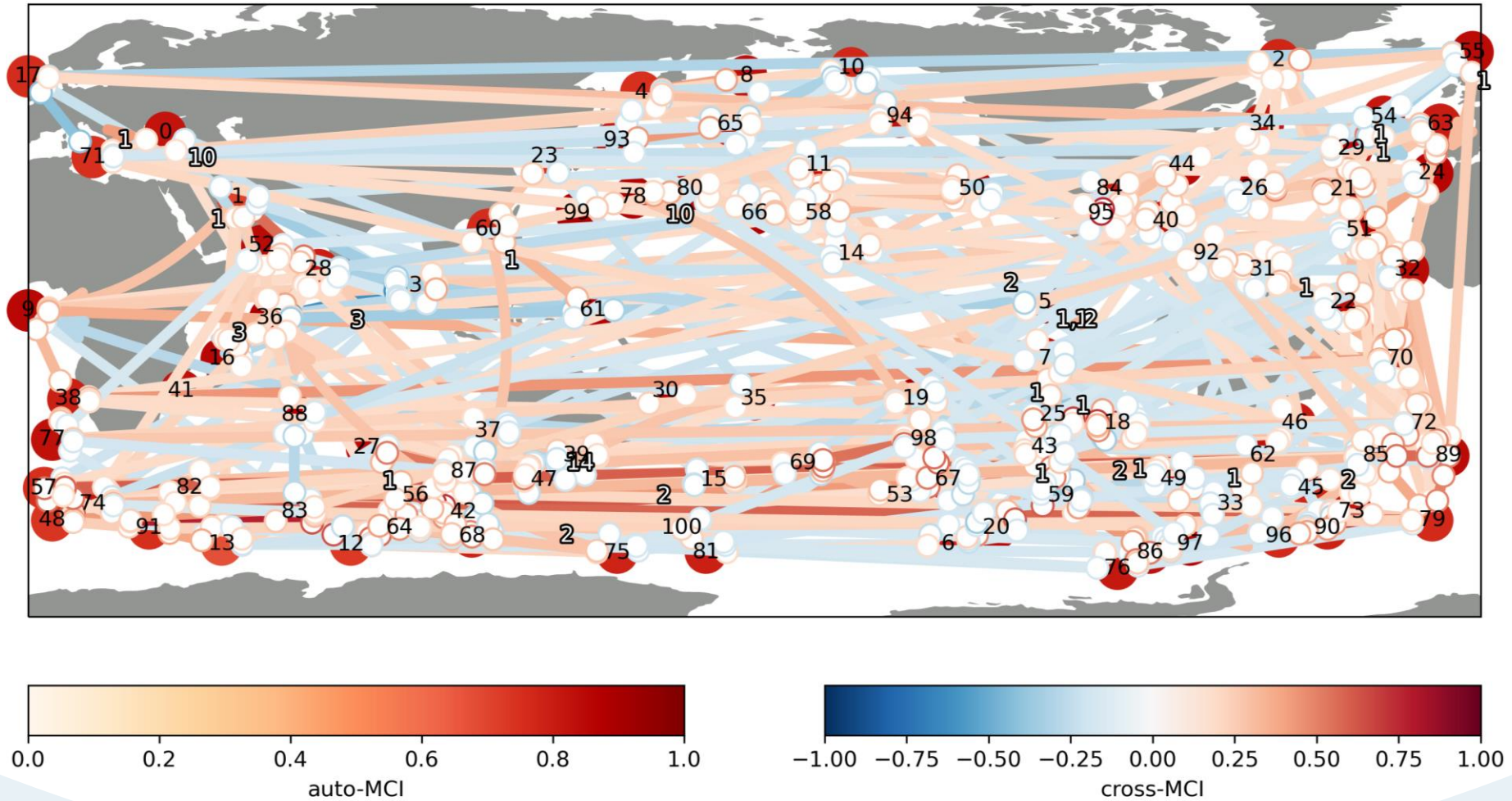
## deltaMaps – Results: Domains



# PCMCI - Method

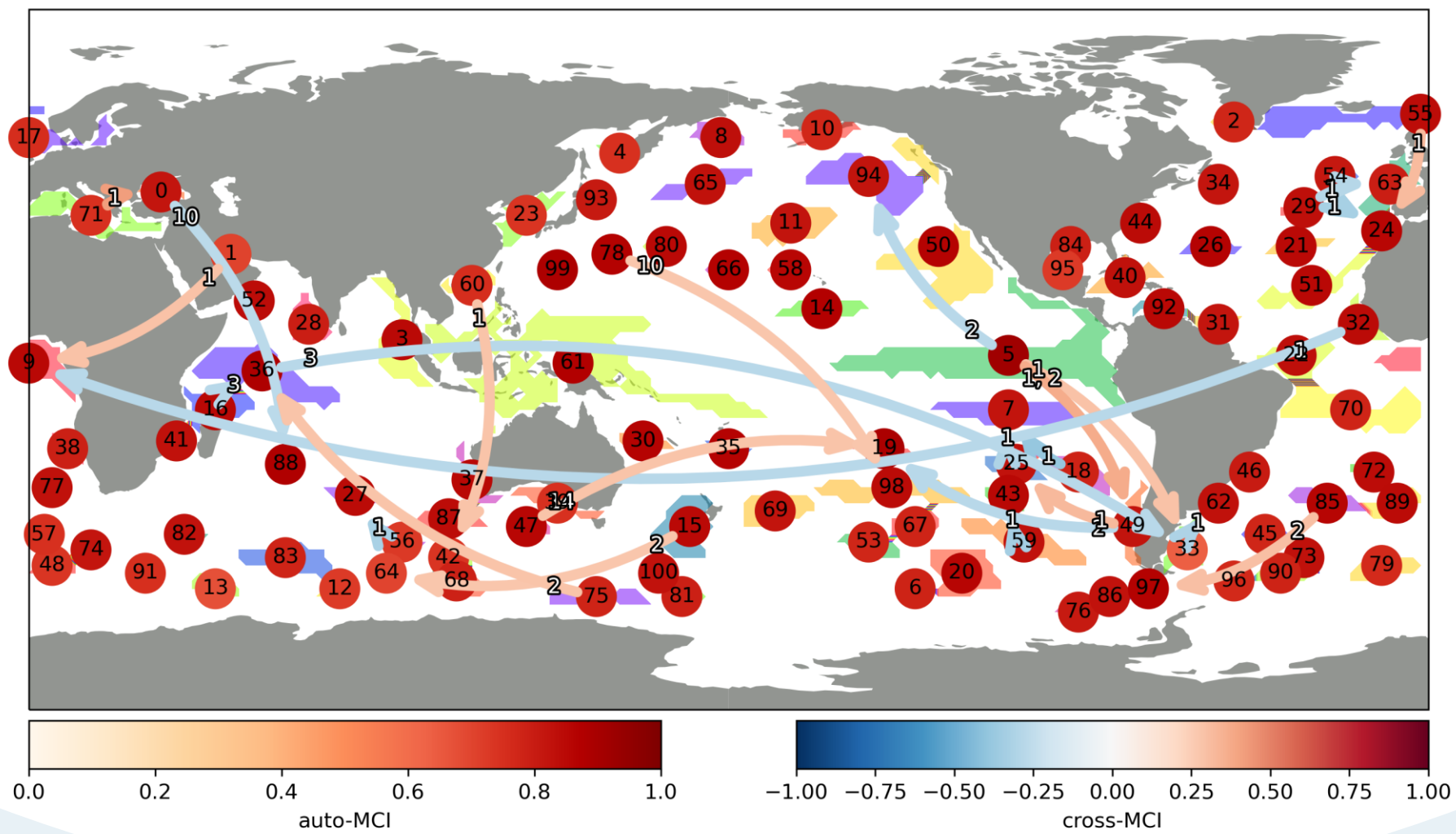
- Method to reconstruct causal graphs from high-dimensional time series data
- Developed by Runge et al. (2019); included in the tigramite-package (Python)
- based on the graphical causal model framework
- Consists of two main steps:
  - $PC_1$  algorithm
  - MCI-test
- High detection power even in large datasets
- Assumes causal sufficiency
- Applied PCMCI to the domain signals

# PCMCI - Results

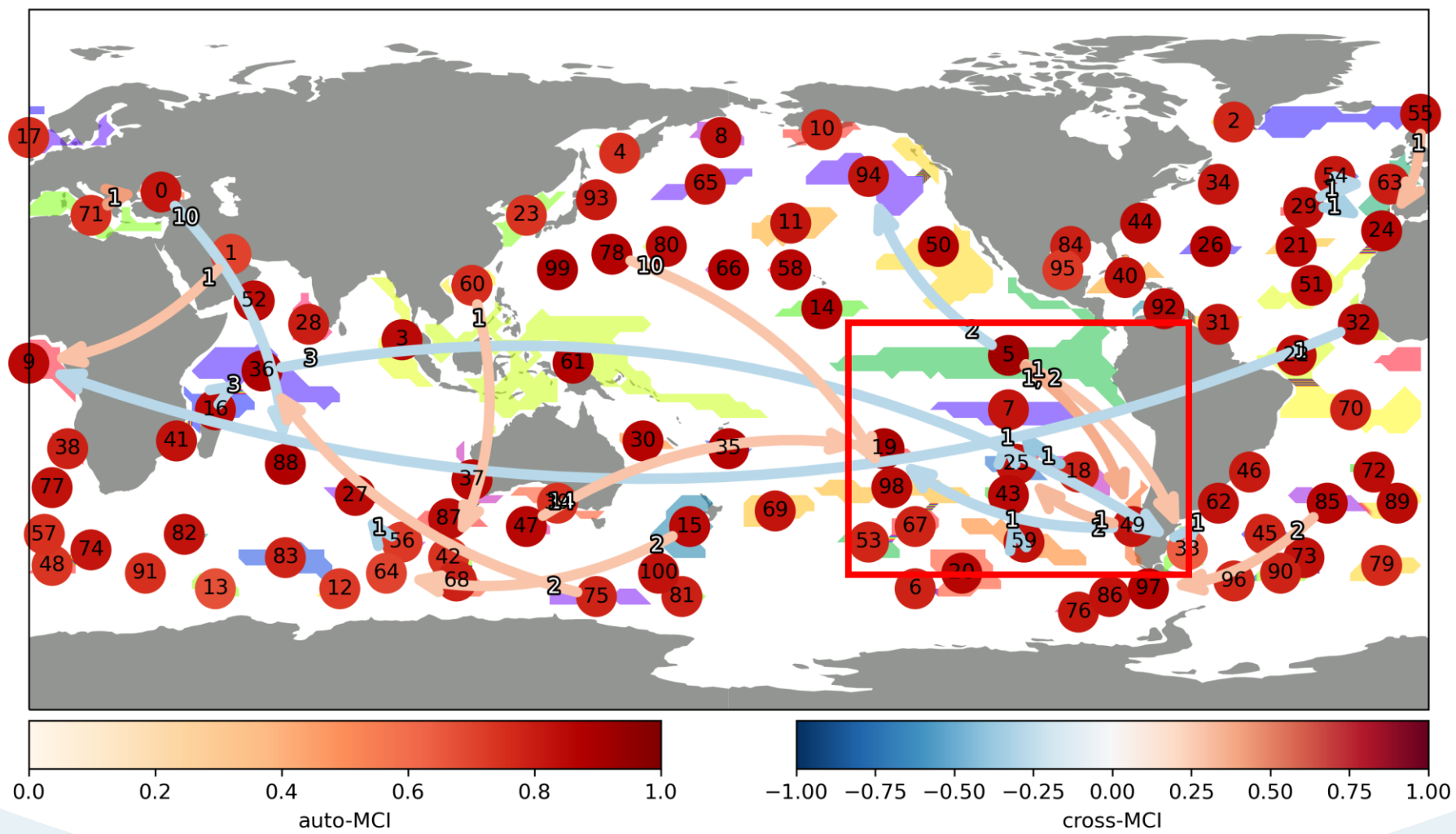




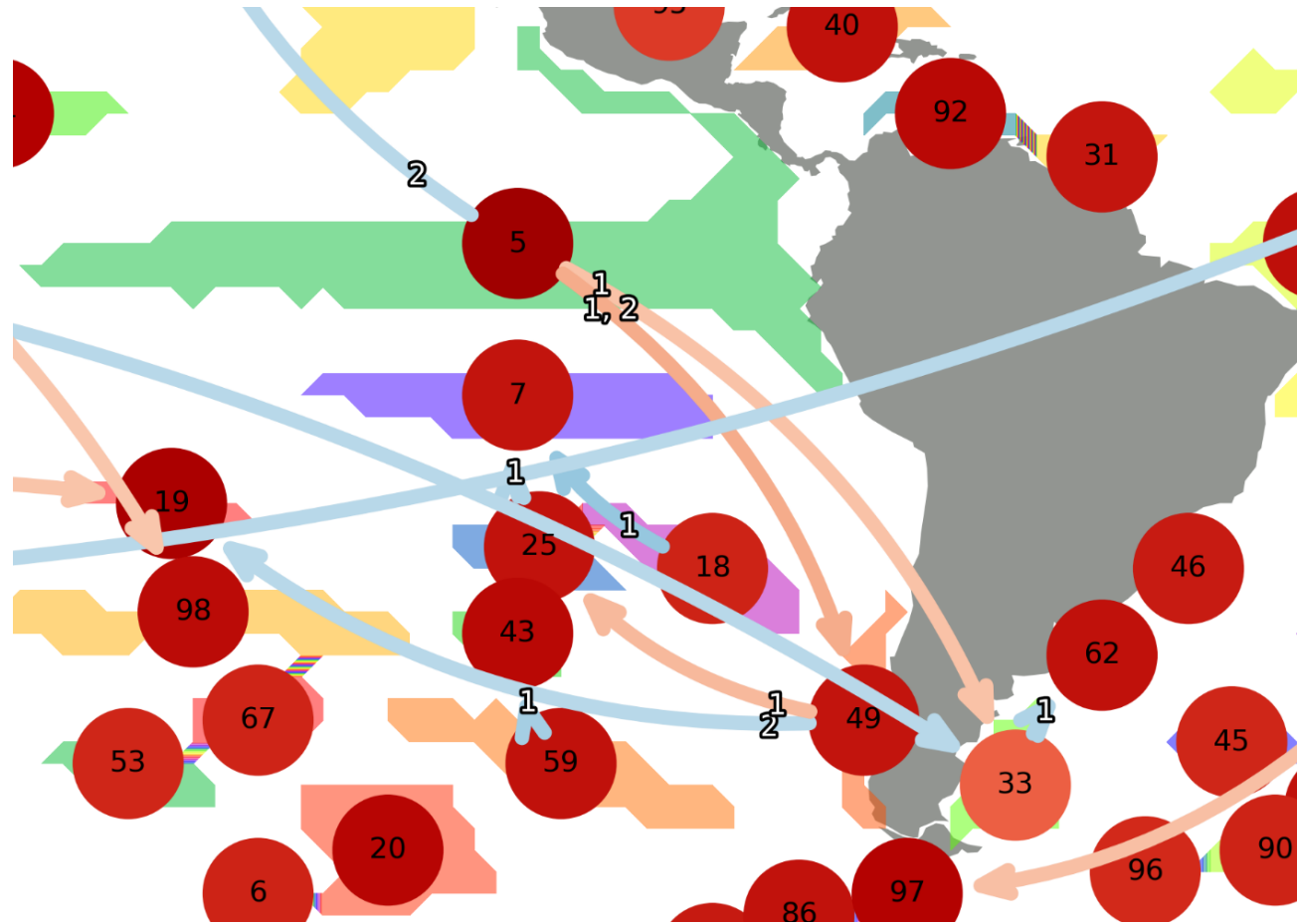
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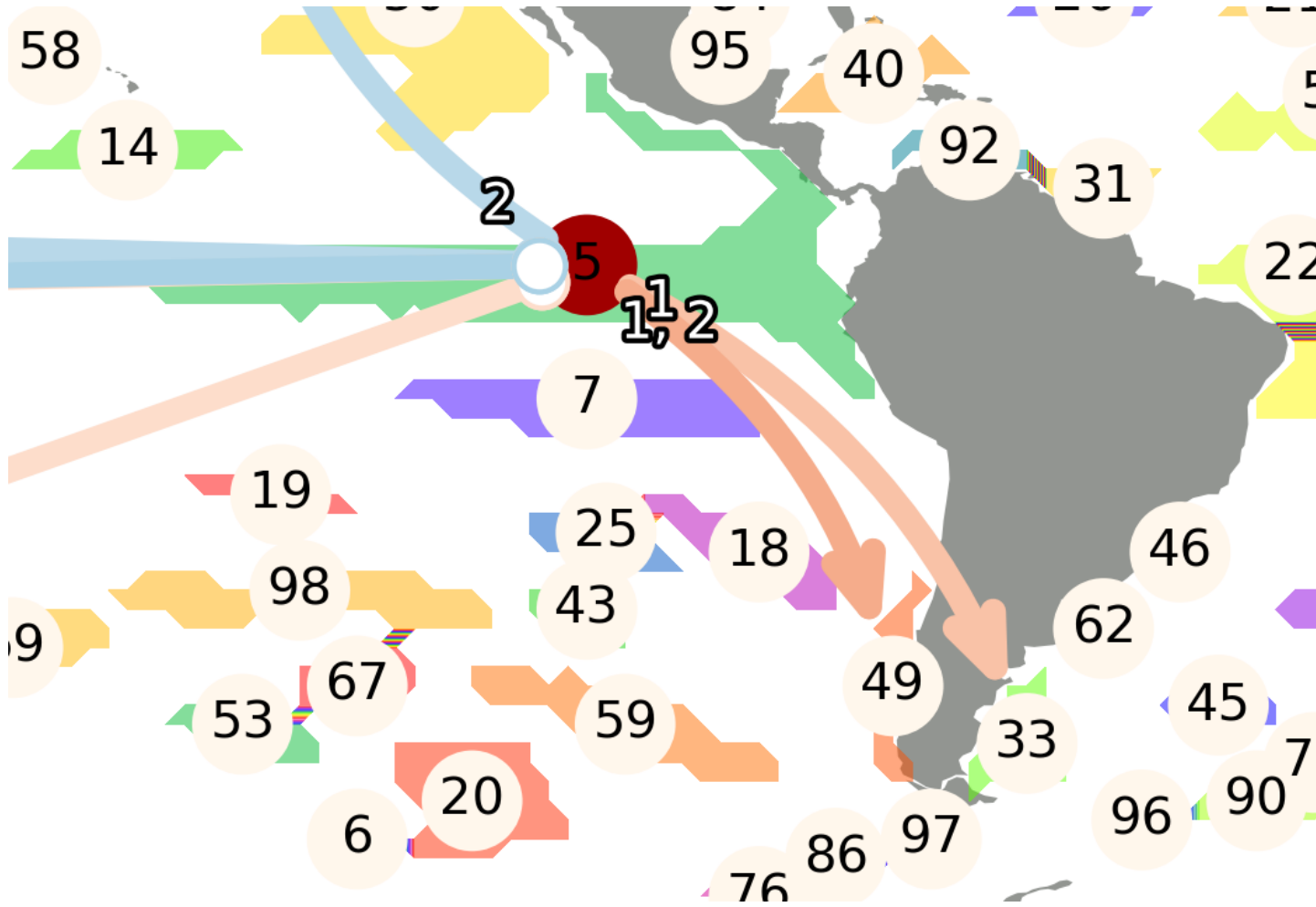
# PCMCI - Results



# Causal SLV network in the SE Pacific



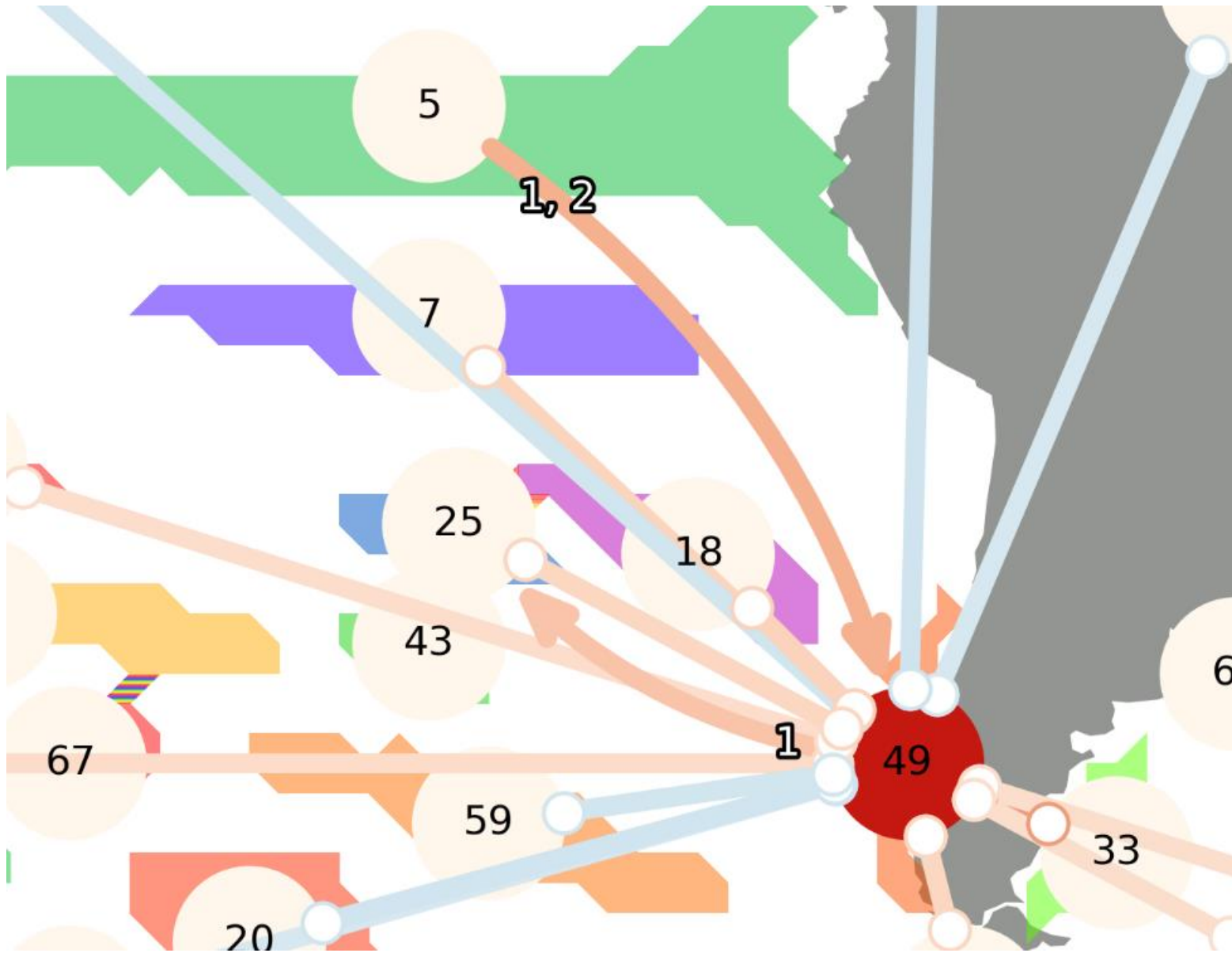
## SLV in Domain 5



- Domain 5 SLA is significantly correlated to ENSO strength ( $R > 0.9$ ) at small lags
- SLA leads SST anomalies by a few weeks
- Main source of SLV in this domain is ENSO



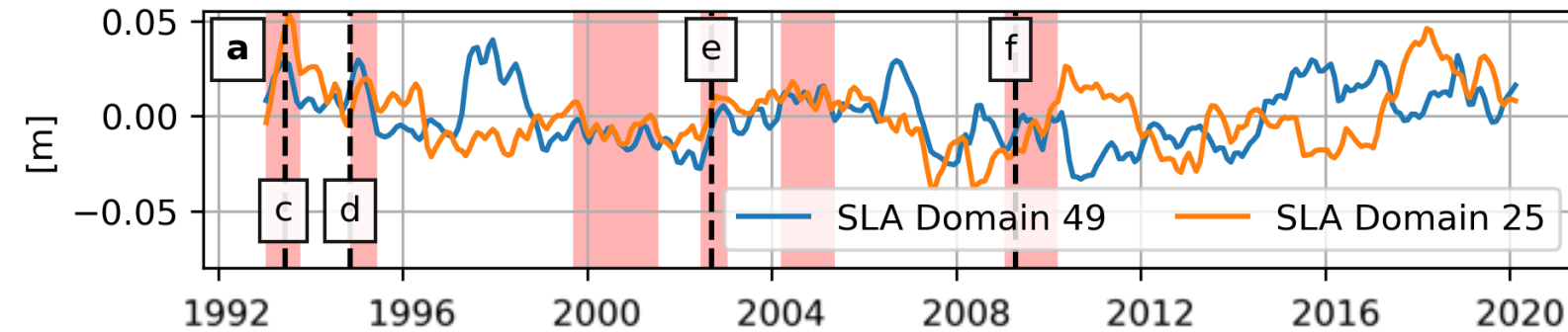




# Edge 49-25

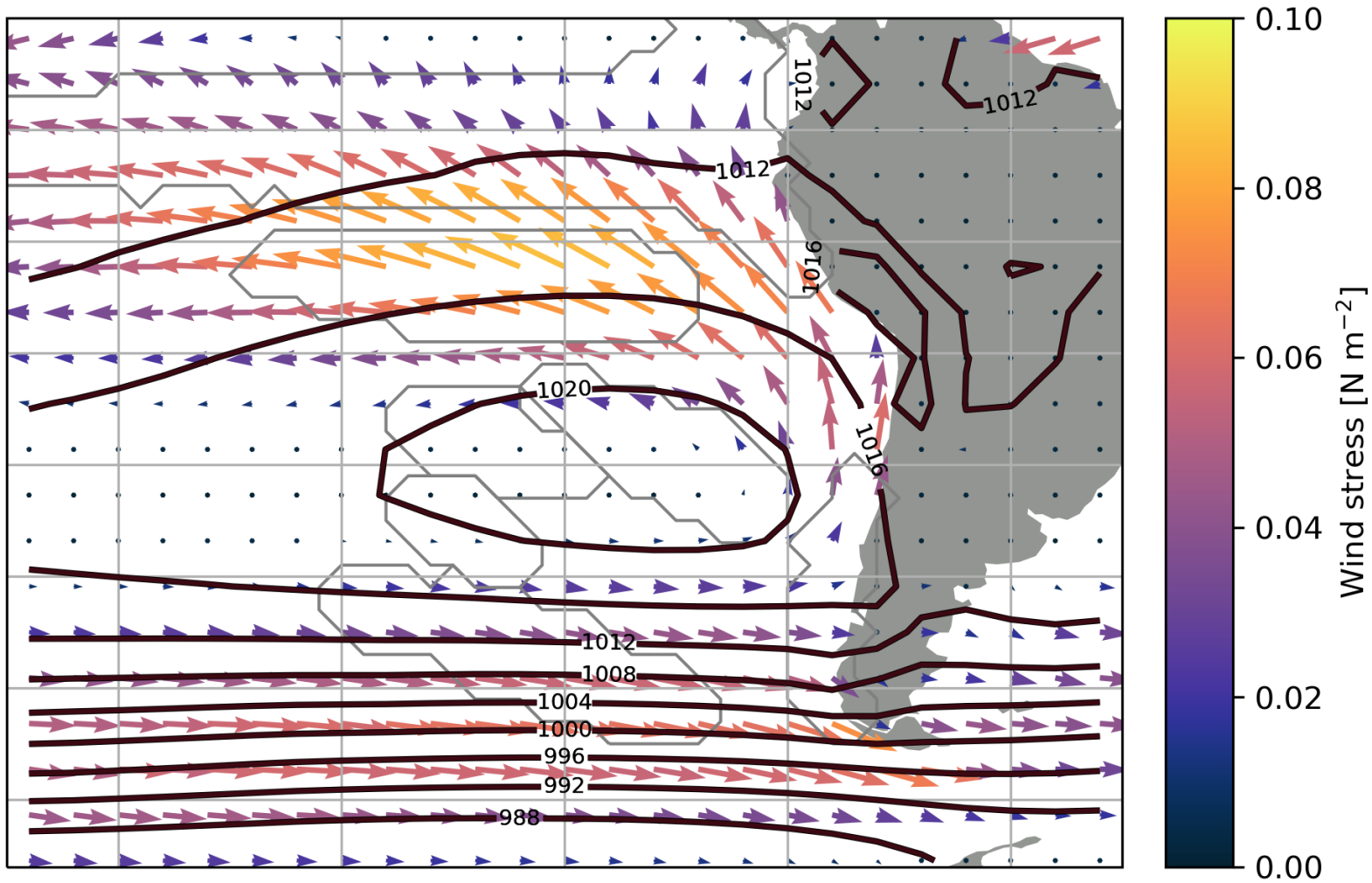
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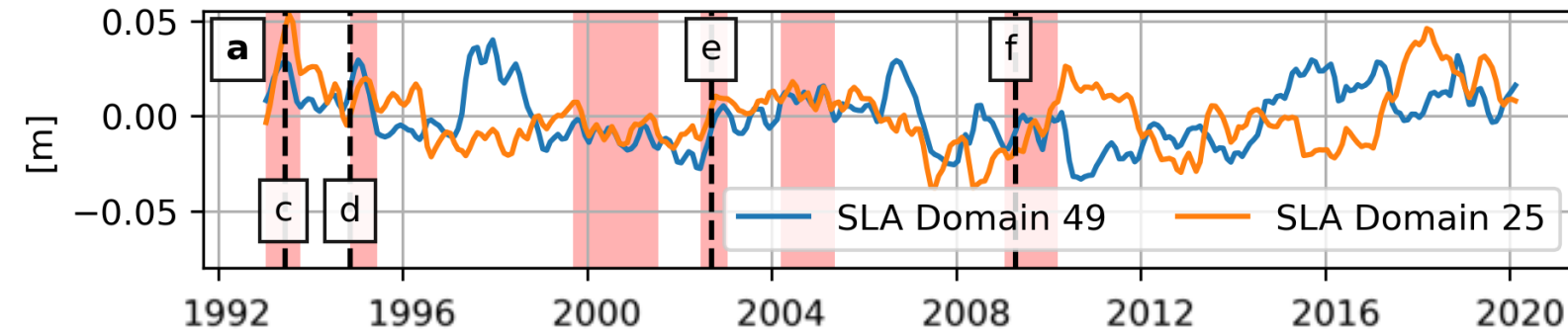
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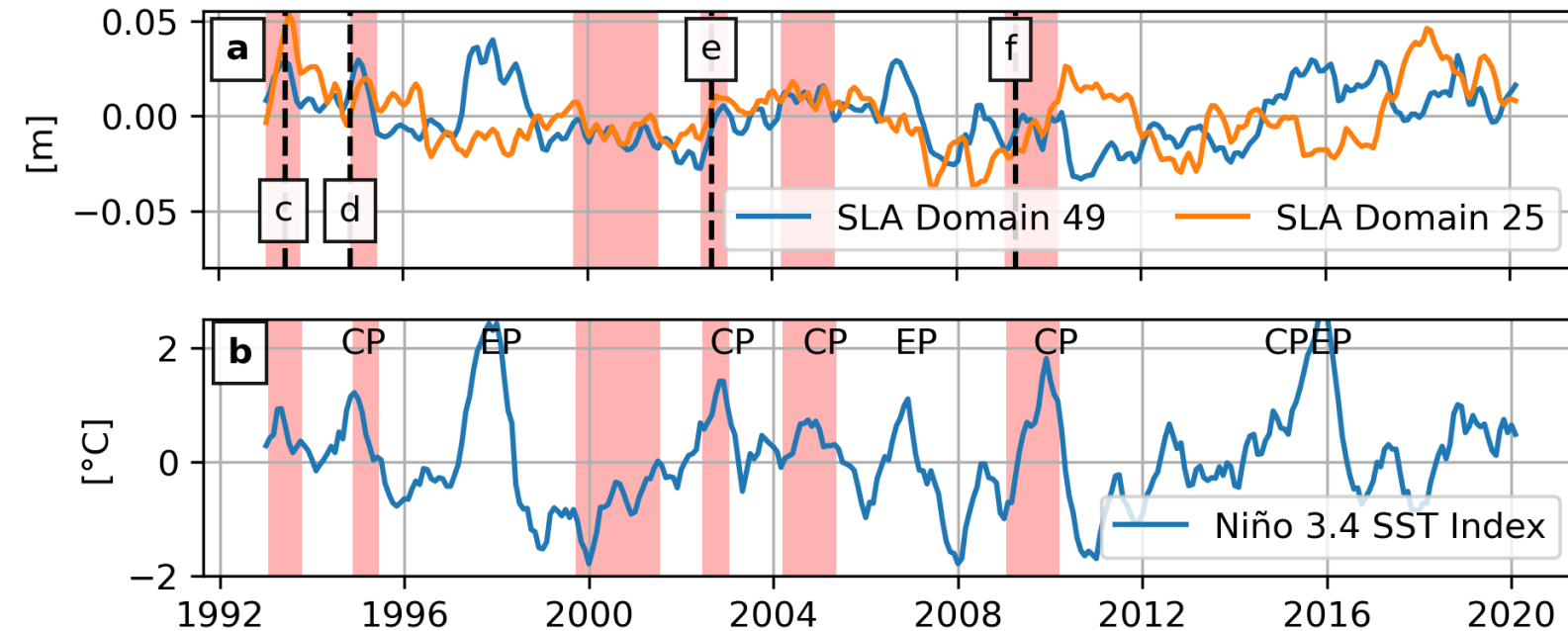


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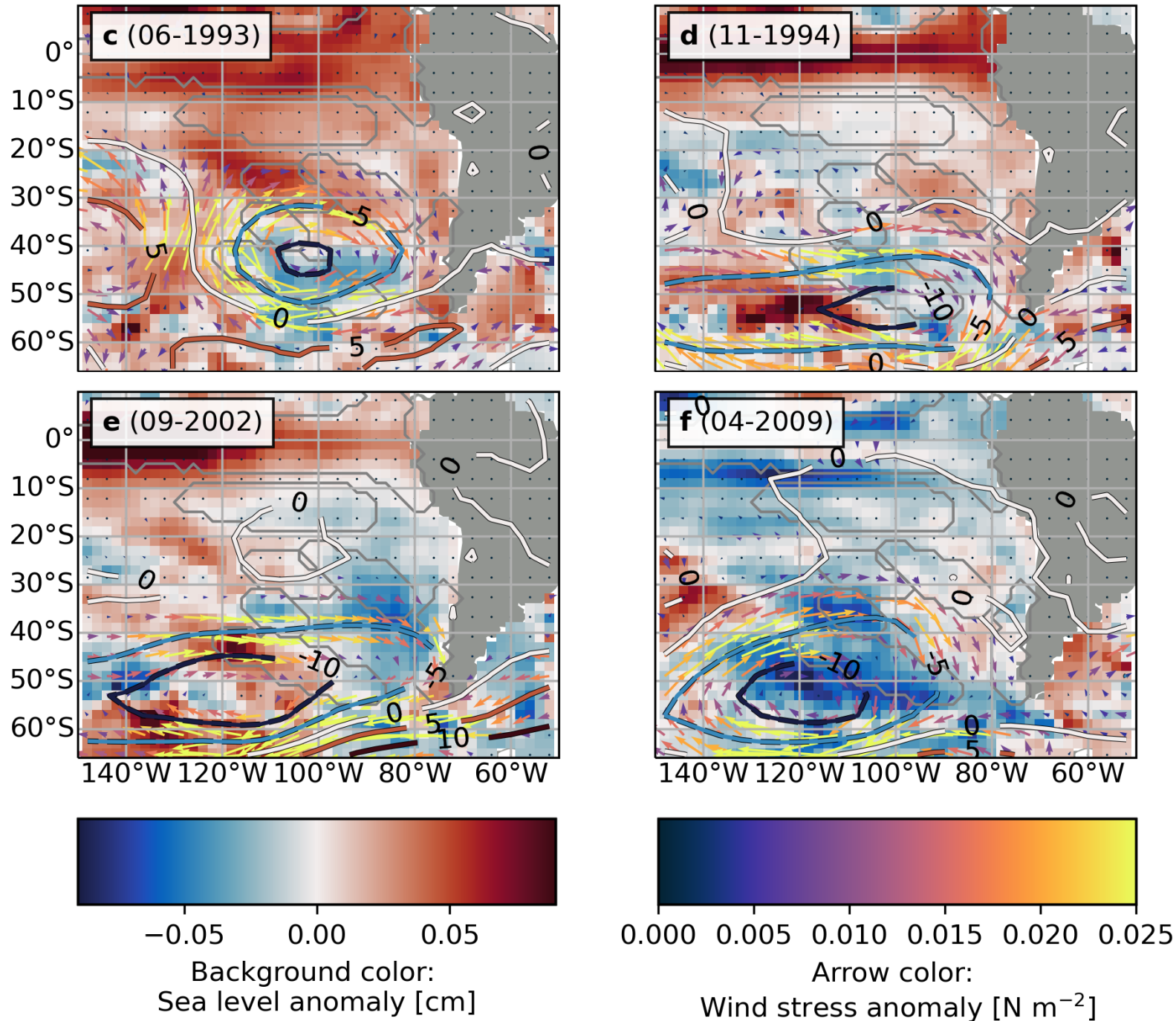
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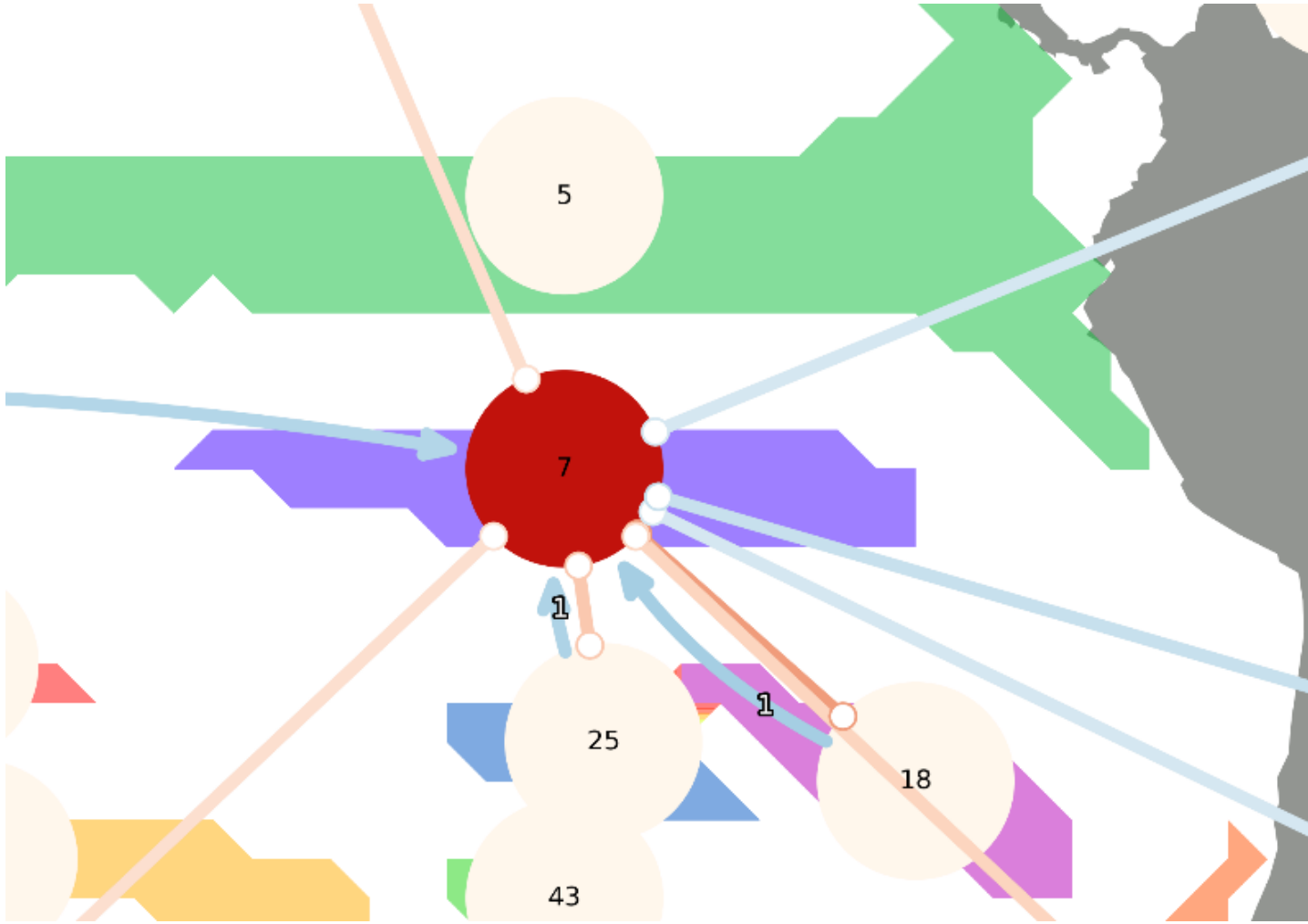
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- Wilson et al. (2014) suggested that CP “flavor” triggers negative SLPa in southern SEP

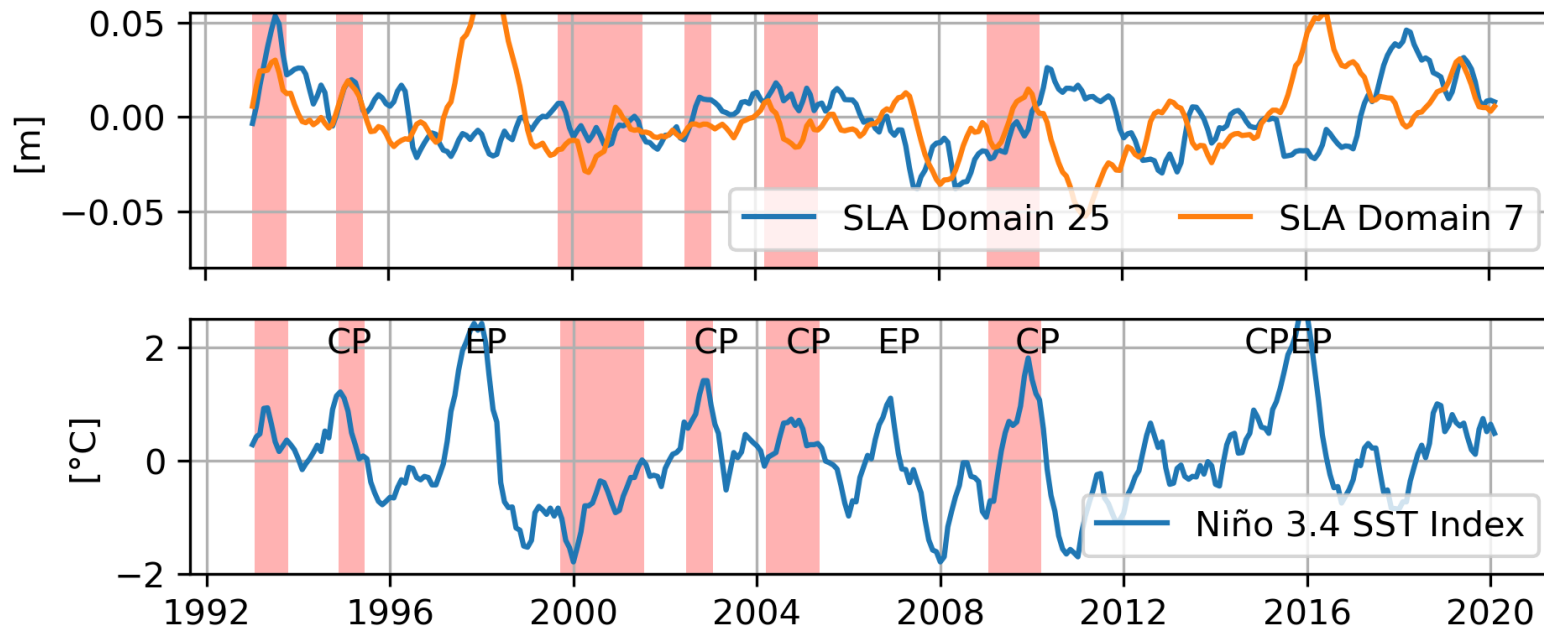
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- No direct (!) link to Domain 5 detected



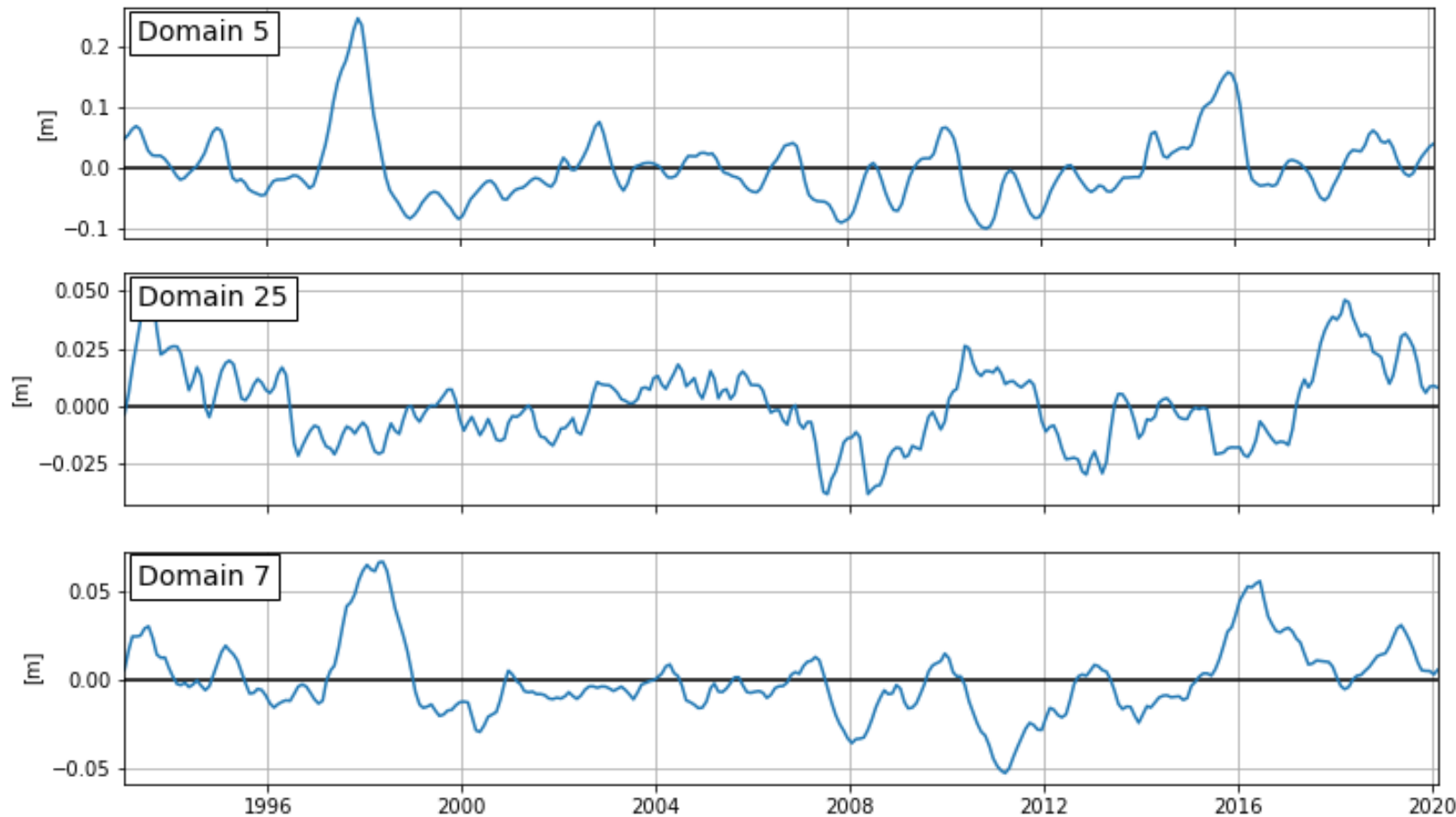


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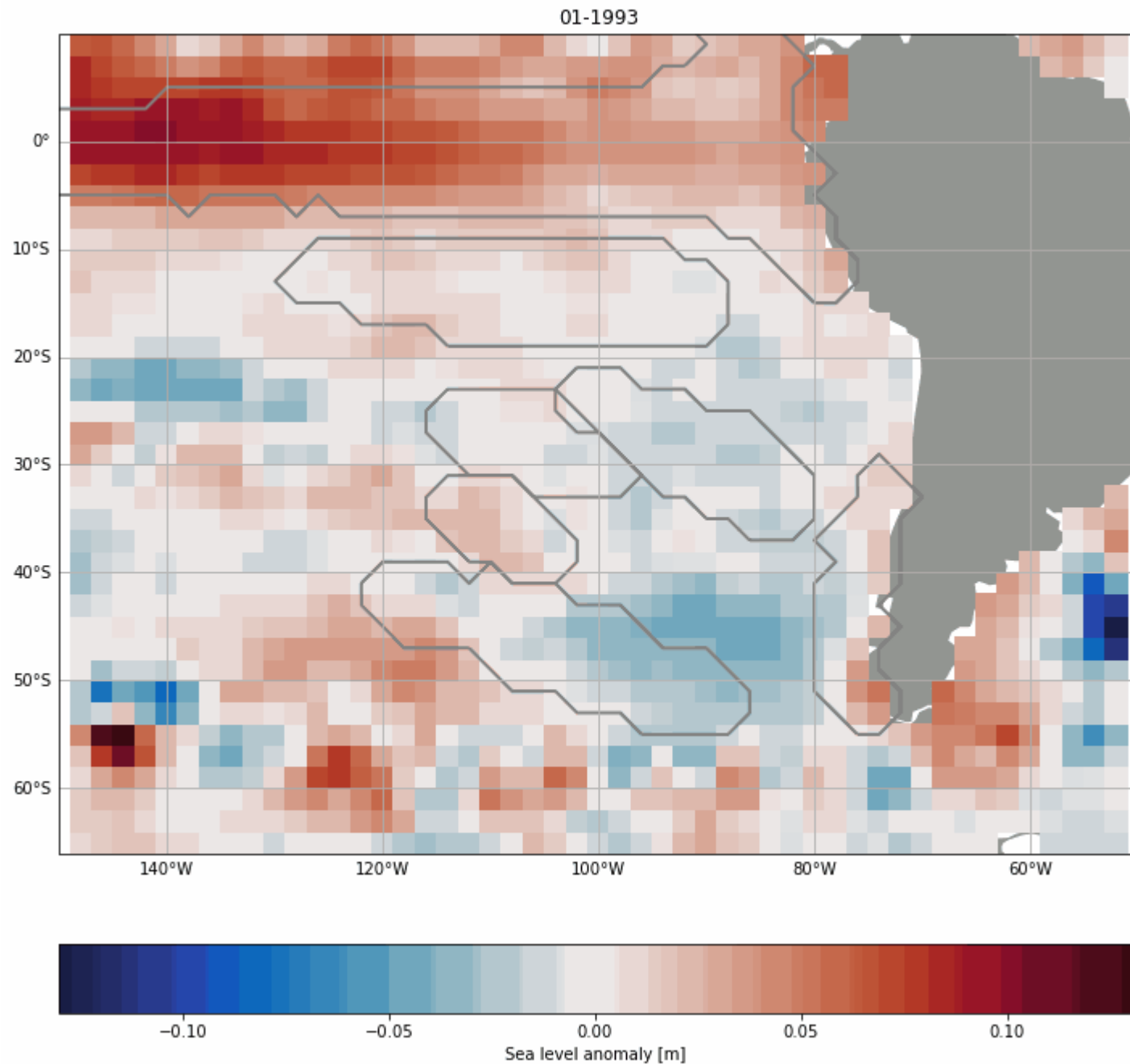
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Timeseries of SLA signals

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# Conclusion

- ENSO strongly influences SLV in the Southeast Pacific
- SLA signals are transported through oceanic and atmospheric teleconnections (e.g. Kelvin & Rossby waves, SLPa and Ekman transport)
- Monthly timesteps too large to resolve atmospheric processes
- Network not static? Flavour of ENSO appears to trigger shift in SLA patterns
- Violation against causal sufficiency assumption
- Modelling needed to reveal the underlying processes
- Report, figures and code available on GitHub!  
[github.com/eikeschuett/dMaps\\_SLV/](https://github.com/eikeschuett/dMaps_SLV/)



The background features a high-contrast image of ocean waves. The top half is covered by a semi-transparent blue overlay that is split vertically into two shades of blue. The bottom half shows the actual texture of the water, with dark, churning waves on the left and white, frothy surf on the right.

**THANK YOU**