

# Identifying the Climate Signals of Late 20<sup>th</sup> and Early 21<sup>st</sup> Century Volcanic Eruptions



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# Structure



- Introduction
- Statistical issues
- Previous volcanic signal detection results
- New results
- Conclusions







# **The Persistently Variable “Background” Stratospheric Aerosol Layer and Global Climate Change**

S. Solomon,<sup>1,2\*</sup> J. S. Daniel,<sup>1</sup> R. R. Neely III,<sup>1,2,5,6</sup> J.-P. Vernier,<sup>3,4</sup> E. G. Dutton,<sup>5</sup> L. W. Thomason<sup>3</sup>

Recent measurements demonstrate that the “background” stratospheric aerosol layer is persistently variable rather than constant, even in the absence of major volcanic eruptions. Several independent data sets show that stratospheric aerosols have increased in abundance since 2000. Near-global satellite aerosol data imply a negative radiative forcing due to stratospheric aerosol changes over this period of about  $-0.1$  watt per square meter, reducing the recent global warming that would otherwise have occurred. Observations from earlier periods are limited but suggest an additional negative radiative forcing of about  $-0.1$  watt per square meter from 1960 to 1990. Climate model projections neglecting these changes would continue to overestimate the radiative forcing and global warming in coming decades if these aerosols remain present at current values or increase.

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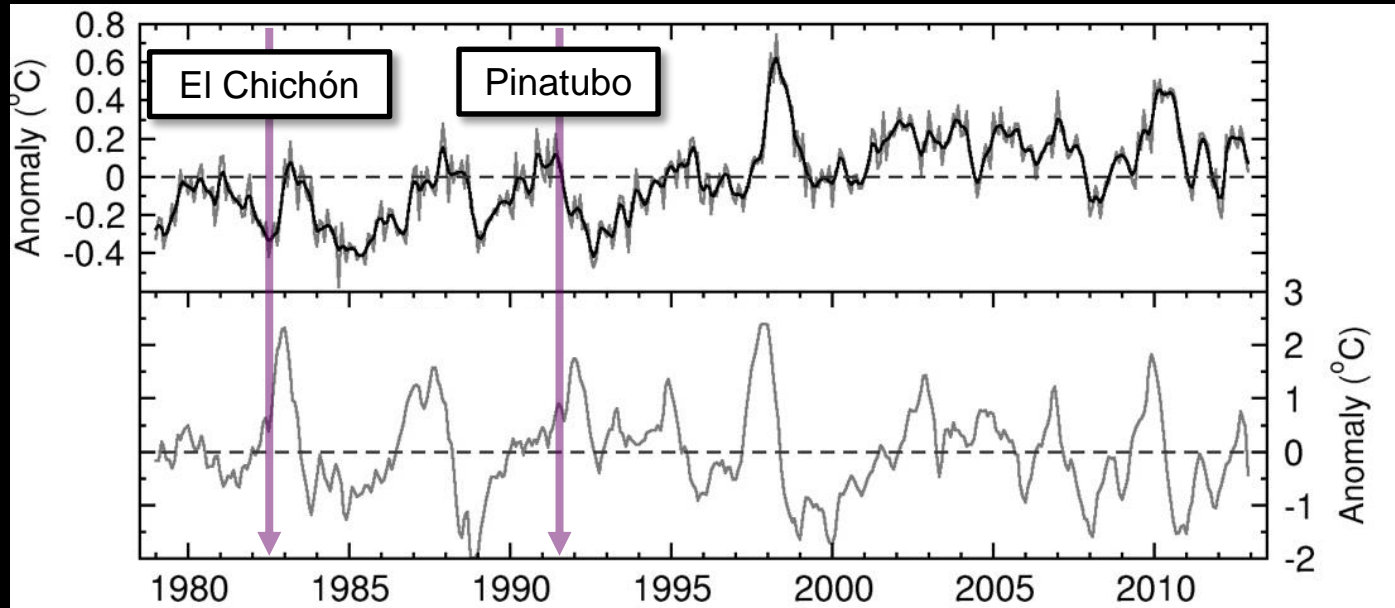


1. Removal of ENSO variability from climate variables
2. Dealing with volcanic forcing/climate relationships in volcanically active and volcanically quiescent periods (nonstationarity)
3. Interaction between volcanic eruptions and modes of internal variability
4. Assessing the statistical significance of relationships between volcanic forcing and climate

# Issue 1: Removal of ENSO variability from climate variables



- Predictor variables used to estimate the ENSO and volcano temperature signals are correlated



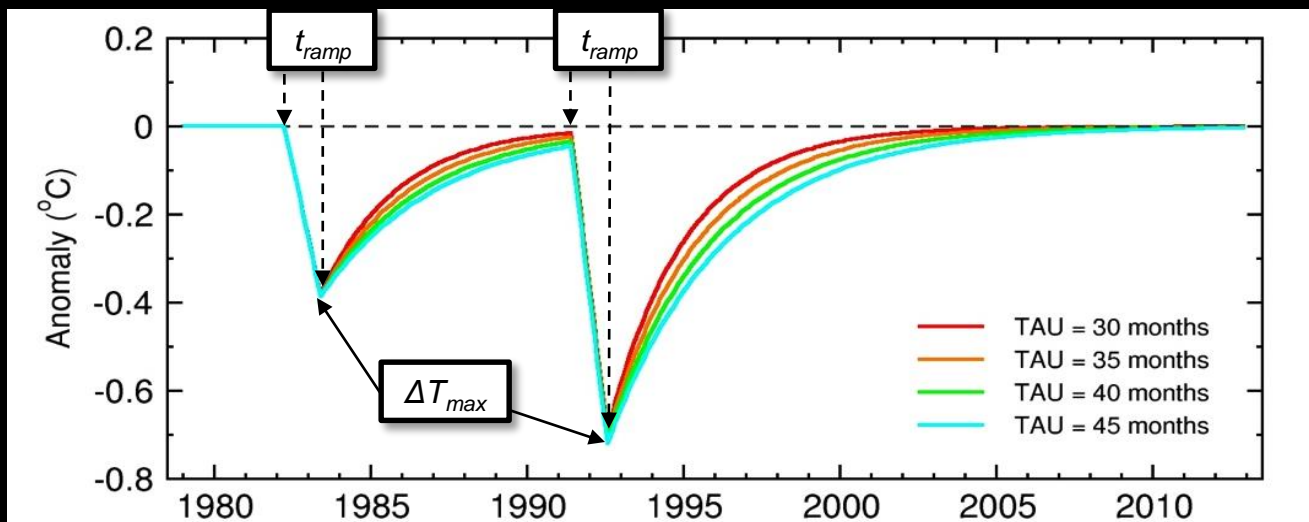
Lower tropospheric  
temperature (RSS)

Niño 3.4 SSTs  
(NOAA)

# How do we estimate volcano signals in our iterative method?



- We use three parameters to characterize the tropospheric temperature response to volcanic forcing:
  - ➔  $\Delta T_{max}$  The maximum volcanically-induced cooling
  - ➔  $t_{ramp}$  The time (in months) from the start of the eruption to  $\Delta T_{max}$
  - ➔ TAU Exponential decay time (in months) for the volcanic cooling signal
- $\Delta T_{max}$  and  $t_{ramp}$  are estimated directly from tropospheric temperature data





# Removing ENSO and volcano signals from tropospheric temperature: An example



Tropospheric  
temperature (RSS)

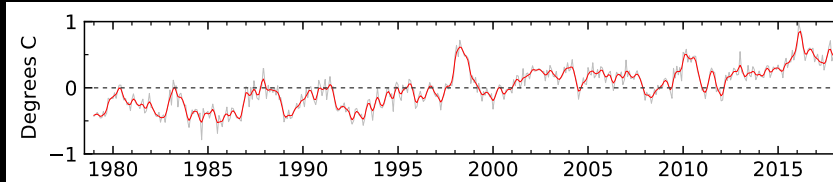
Niño 3.4 SSTs  
(HadCRUT)

ENSO signal

Raw data minus  
ENSO signal

Estimated volcano  
signal

Residuals (raw data  
minus ENSO and  
volcano signals)



Subtract volcano  
signal from raw  
data; re-estimate  
ENSO signal; then  
iterate

Santer et al., JGR (2001)

# Statistical issues

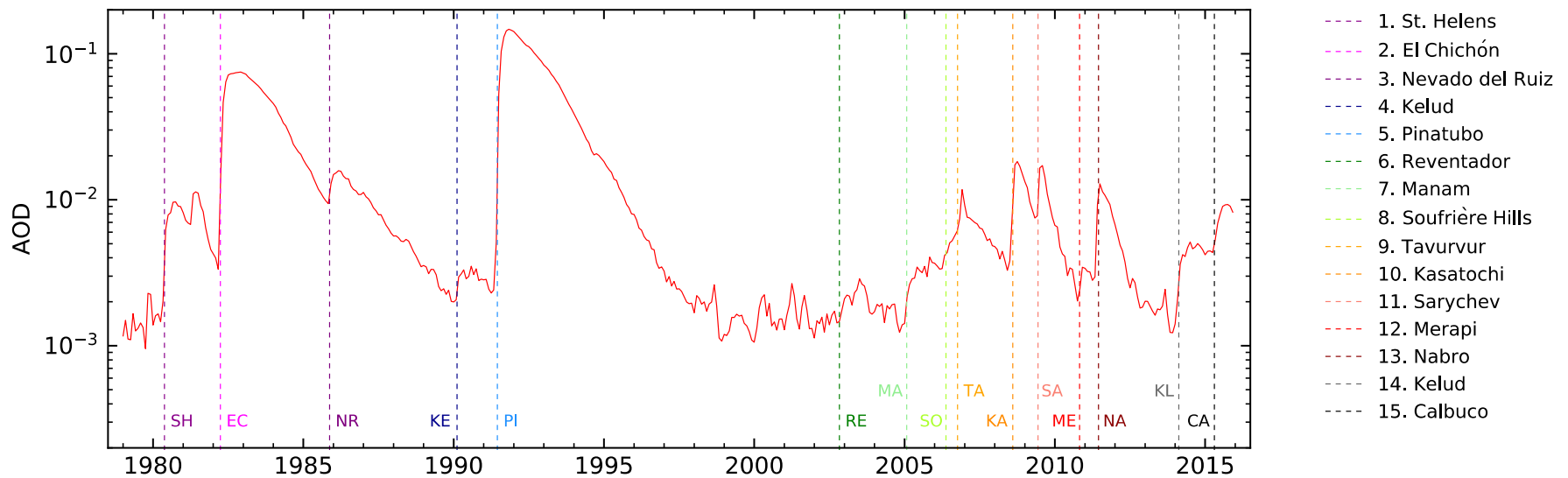


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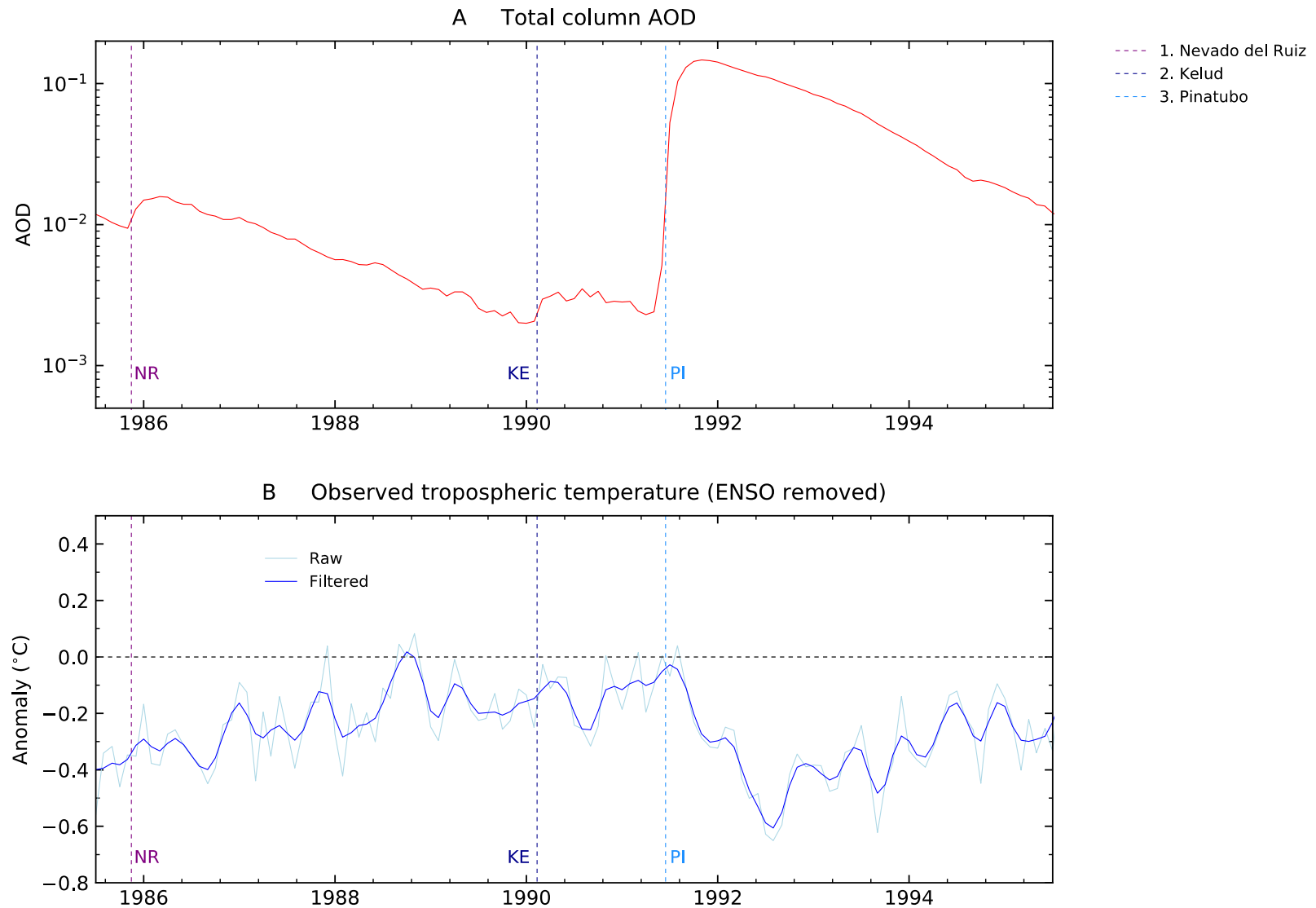
## Issue 2: Dealing with changes over time in volcanic activity



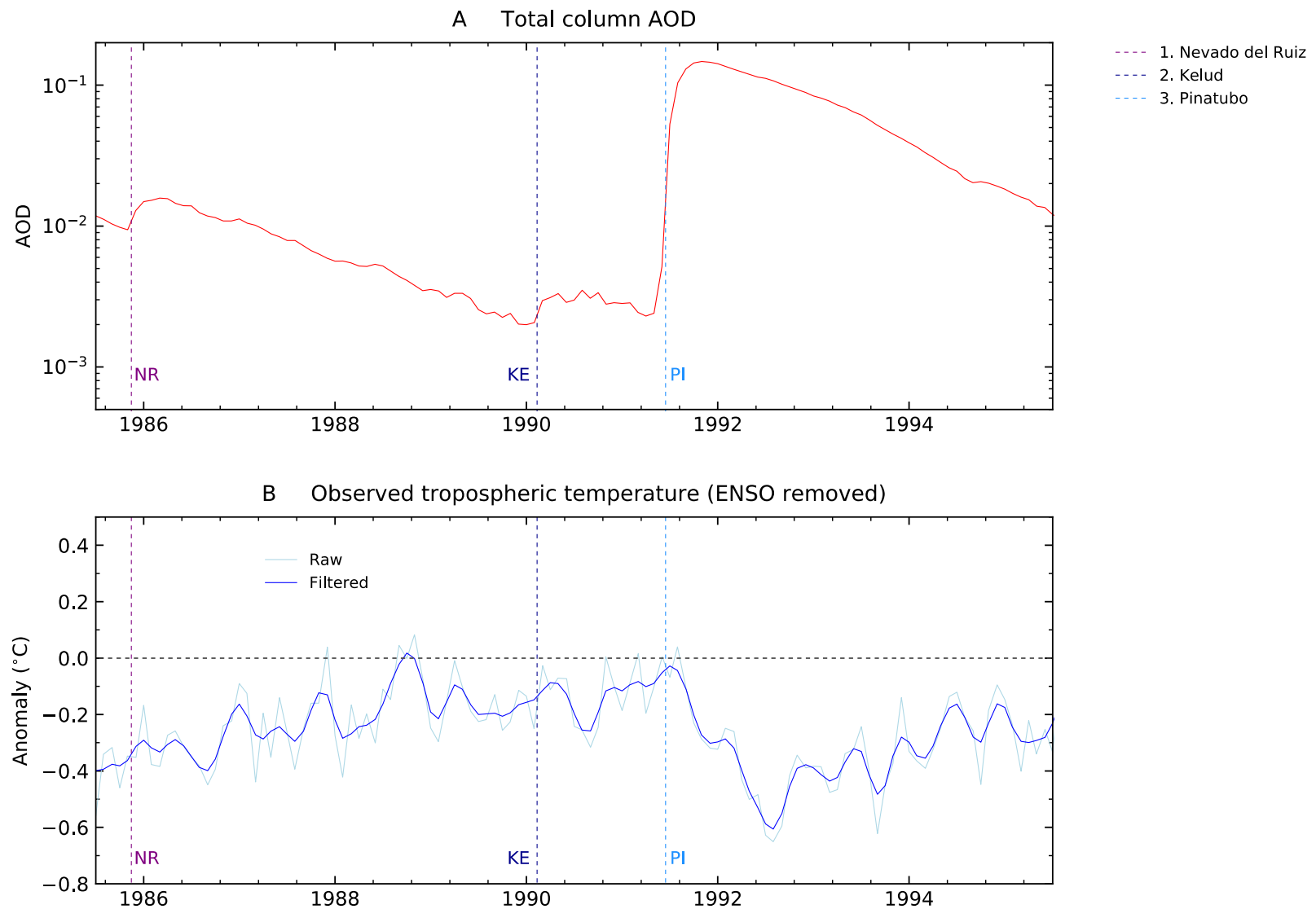
A Total column AOD



# Explaining the “moving window” correlation analysis

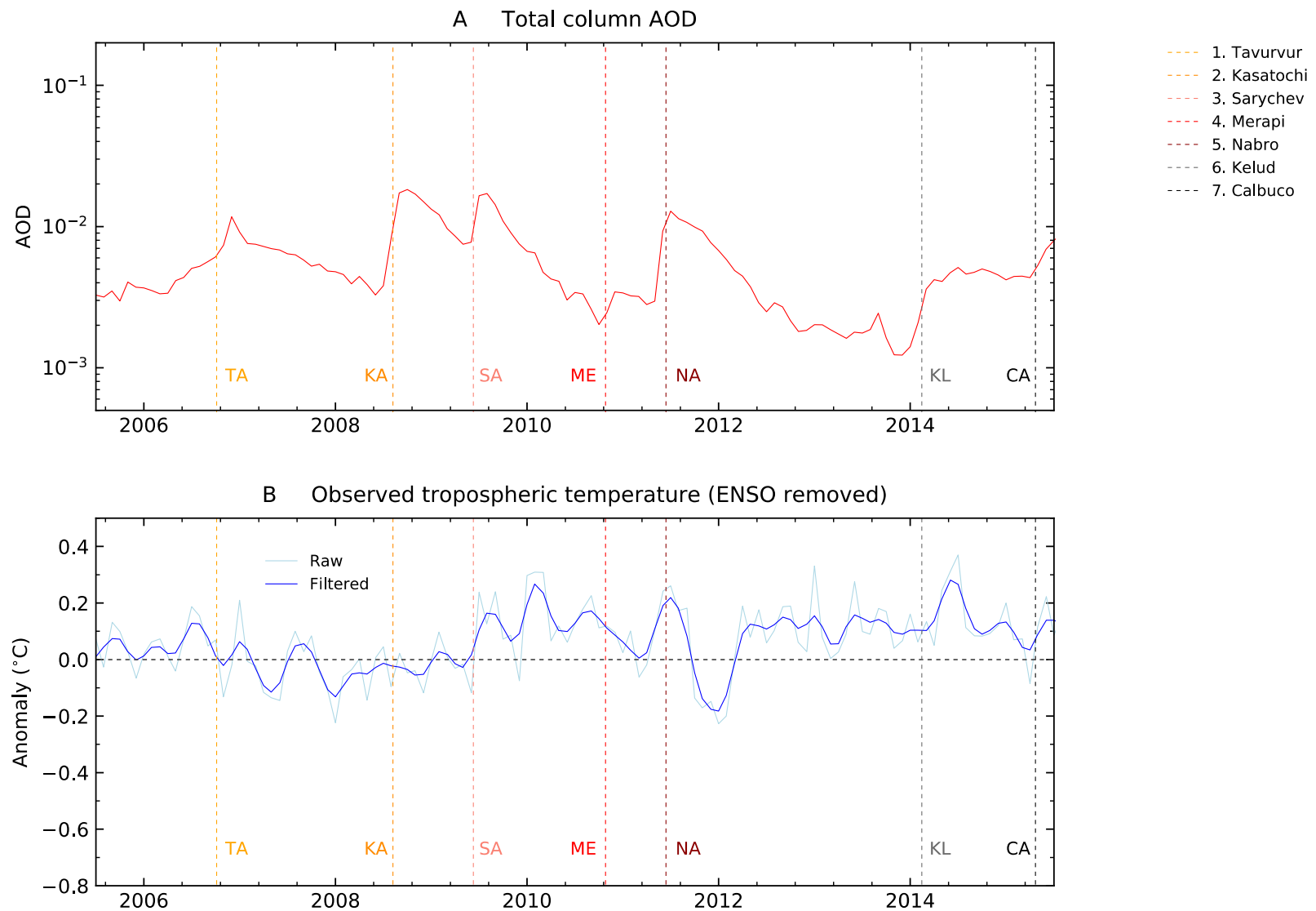


# Explaining the “moving window” correlation analysis





# Explaining the “moving window” correlation analysis



# Statistical issues



1. Removal of ENSO variability from climate variables
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## Issue 4: Assessing the statistical significance of volcanic climate signals



1. Calculate  $r_i\{\text{SAOD}, X\}$ , the correlation between the  $i^{\text{th}}$  60-month segment of observed SAOD and  $X$  (observed climate data)
2. Use an AR-1 statistical model to generate  $k$  different realizations of synthetic observational climate time series,  $X_k(t)^*$  ( $k = 1, 2, \dots 10,000$ )
3. Calculate  $r_{i,k}\{\text{SAOD}, X^*\}$ , the correlation between observed SAOD and  $X_k(t)^*$ . Repeat for each 60-month window and each  $X_k(t)^*$  realization.
4. Compare the actual correlation,  $r_i\{\text{SAOD}, X\}$ , with the null distribution of  $r_{i,k}\{\text{SAOD}, X^*\}$  values
5. Determine the probability that the actual correlation between aerosol optical depth and the climate variable of interest could be due to chance.

# Structure



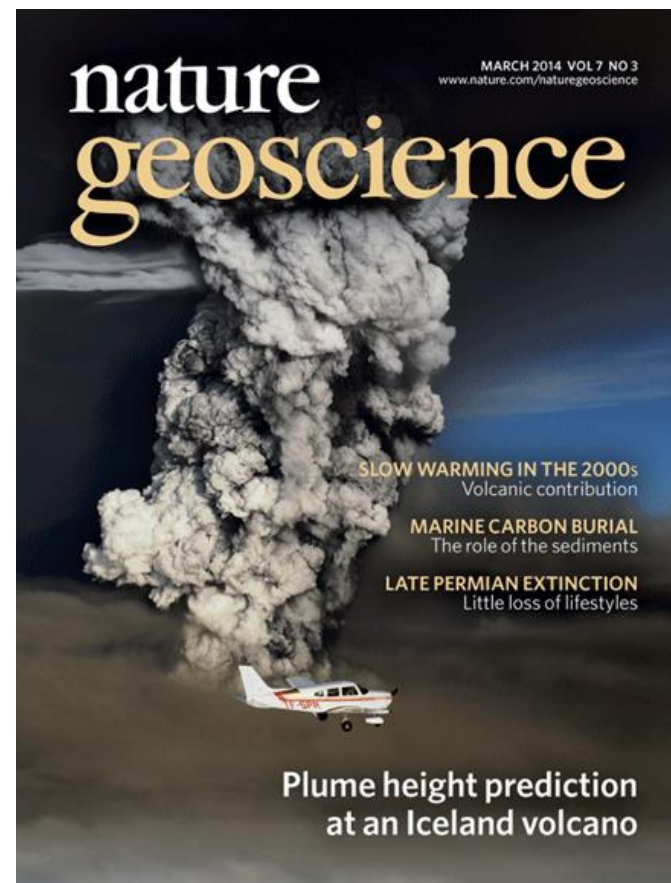
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# Volcanic contribution to decadal changes in tropospheric temperature

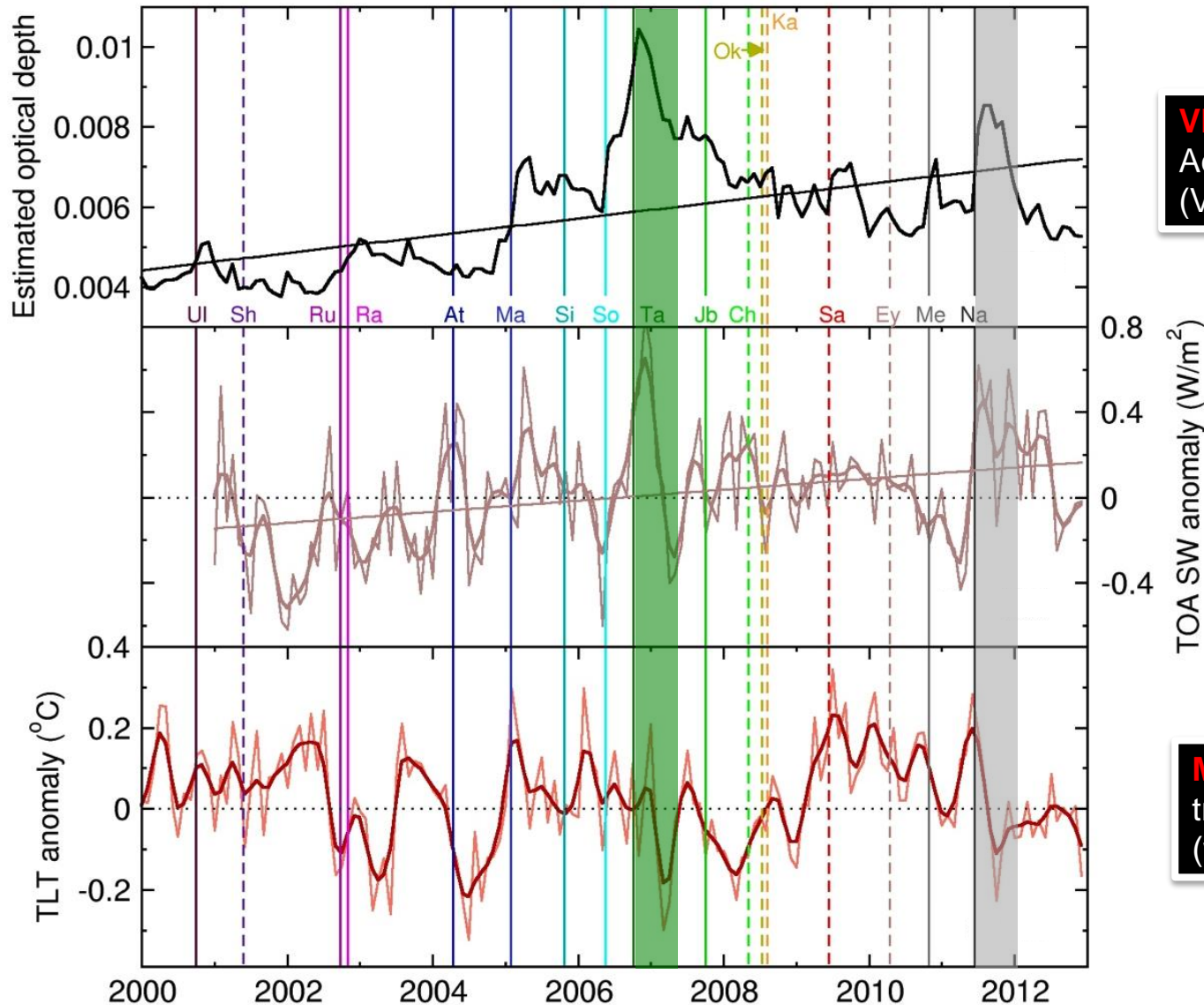
Benjamin D. Santer<sup>1\*</sup>, Céline Bonfils<sup>1</sup>, Jeffrey F. Painter<sup>1</sup>, Mark D. Zelinka<sup>1</sup>, Carl Mears<sup>2</sup>, Susan Solomon<sup>3</sup>, Gavin A. Schmidt<sup>4</sup>, John C. Fyfe<sup>5</sup>, Jason N. S. Cole<sup>5</sup>, Larissa Nazarenko<sup>4</sup>, Karl E. Taylor<sup>1</sup> and Frank J. Wentz<sup>2</sup>

Despite continued growth in atmospheric levels of greenhouse gases, global mean surface and tropospheric temperatures have shown slower warming since 1998 than previously<sup>1–5</sup>. Possible explanations for the slow-down include internal climate variability<sup>3,4,6,7</sup>, external cooling influences<sup>1,2,4,8–11</sup> and observational errors<sup>12,13</sup>. Several recent modelling studies have examined the contribution of early twenty-first-century volcanic eruptions<sup>1,2,4,8</sup> to the muted surface warming. Here we present a detailed analysis of the impact of recent volcanic forcing on tropospheric temperature, based on observations as well as climate model simulations. We identify statistically significant correlations between observations of stratospheric aerosol optical depth and satellite-based estimates of both tropospheric temperature and short-wave fluxes at the top of the atmosphere. We show that climate model simulations without the effects of early twenty-first-century volcanic eruptions overestimate the tropospheric warming observed since 1998. In two simulations with more realistic volcanic influences following the 1991 Pinatubo eruption, differences between simulated and observed tropospheric temperature trends over the period 1998 to 2012 are up to 15% smaller, with large uncertainties in the magnitude of the effect. To reduce these uncertainties, better observations of eruption-specific properties of volcanic aerosols are needed, as well as improved representation of these eruption-specific properties in climate model simulations.





# Early 21<sup>st</sup> century volcanic eruptions have signatures across the electromagnetic spectrum



**VISIBLE:** Stratospheric  
Aerosol Optical Depth  
(Vernier *et al.*, 2011)

**SHORT-WAVE:**  
CERES net clear-  
sky SW radiation

**MICROWAVE:** MSU lower  
tropospheric temperature  
(with ENSO removed)

# Follow-up paper (Santer et al., 2015): Volcanic signals are also detectable in the hydrological cycle



## Observed multivariable signals of late 20th and early 21st century volcanic activity

Benjamin D. Santer<sup>1</sup>, Susan Solomon<sup>2</sup>, Céline Bonfils<sup>1</sup>, Mark D. Zelinka<sup>1</sup>, Jeffrey F. Painter<sup>1</sup>, Francisco Beltran<sup>1</sup>, John C. Fyfe<sup>3</sup>, Gardar Johannesson<sup>1</sup>, Carl Mears<sup>4</sup>, David A. Ridley<sup>2</sup>, Jean-Paul Vernier<sup>5</sup>, and Frank J. Wentz<sup>4</sup>

<sup>1</sup>Program for Climate Model Diagnosis and Intercomparison, Lawrence Livermore National Laboratory, Livermore, California, USA, <sup>2</sup>Earth, Atmospheric, and Planetary Sciences, Massachusetts Institute of Technology, Cambridge, Massachusetts, USA, <sup>3</sup>Canadian Centre for Climate Modelling and Analysis, Environment Canada, Victoria, British Columbia, Canada, <sup>4</sup>Remote Sensing Systems, Santa Rosa, California, USA, <sup>5</sup>NASA Langley Research Center, Hampton, Virginia, USA

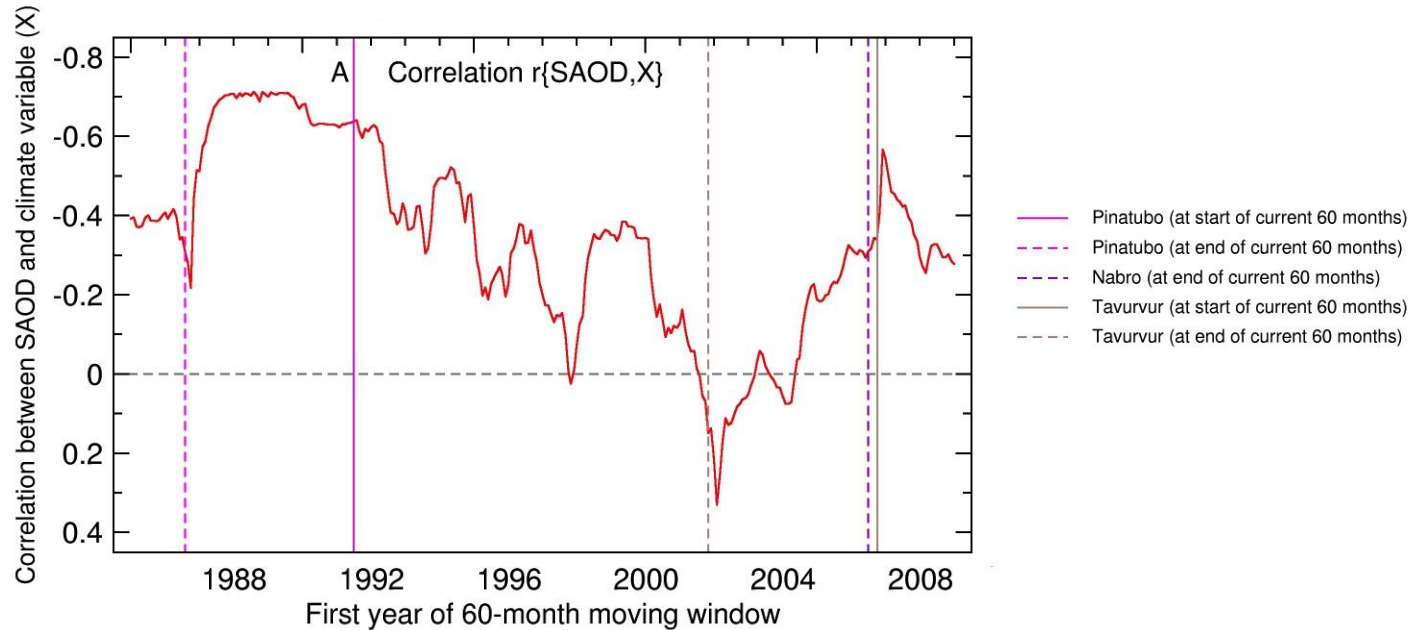
**Abstract** The relatively muted warming of the surface and lower troposphere since 1998 has attracted considerable attention. One contributory factor to this “warming hiatus” is an increase in volcanically induced cooling over the early 21st century. Here we identify the signals of late 20th and early 21st century volcanic activity in multiple observed climate variables. Volcanic signals are statistically discernible in spatial averages of tropical and near-global SST, tropospheric temperature, net clear-sky short-wave radiation, and atmospheric water vapor. Signals of late 20th and early 21st century volcanic eruptions are also detectable in near-global averages of rainfall. In tropical average rainfall, however, only a Pinatubo-caused drying signal is identifiable. Successful volcanic signal detection is critically dependent on removal of variability induced by the El Niño–Southern Oscillation.



# Do volcanic climate eruptions produce significant climate signals?



Tropics (20°N-20°S)

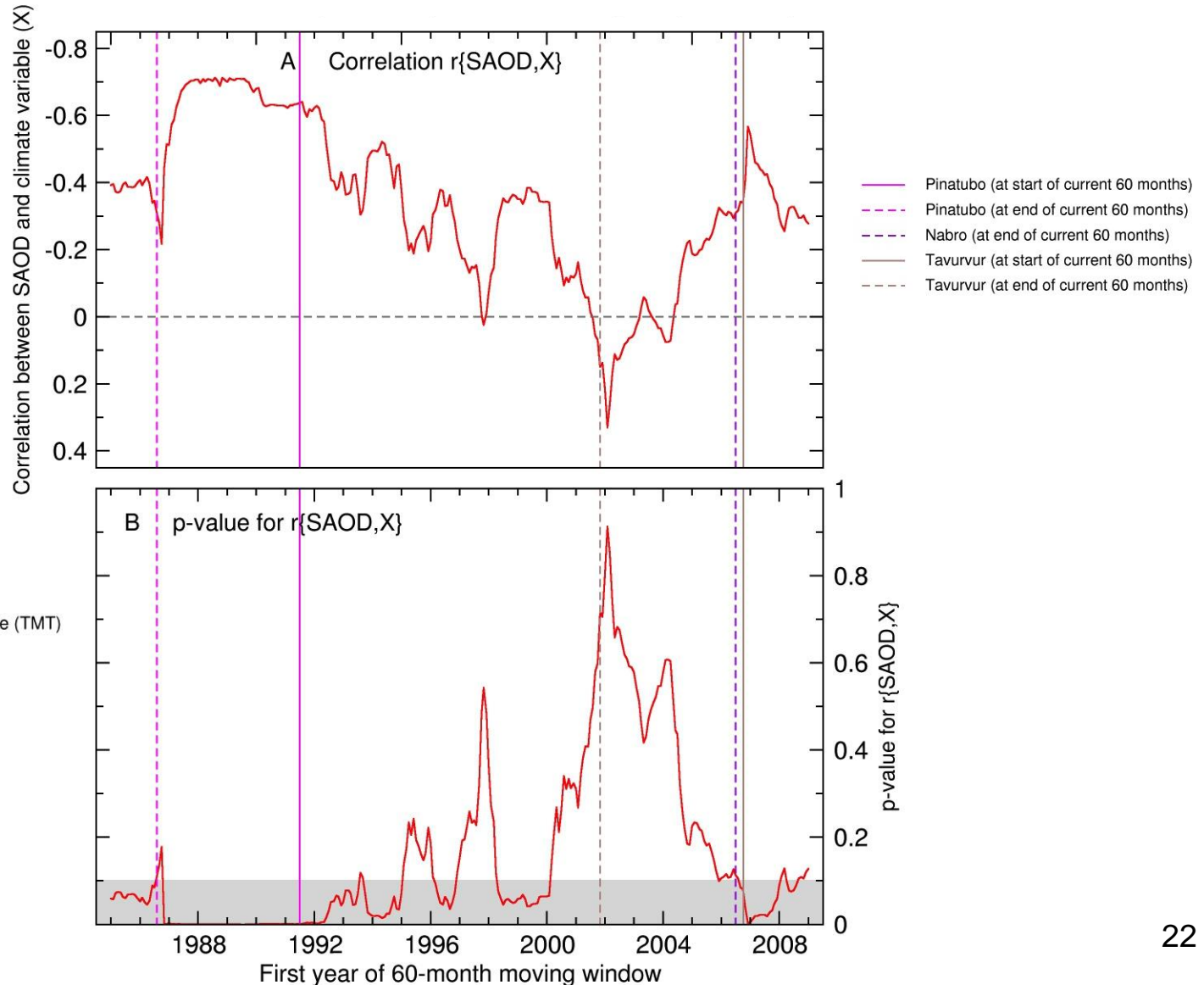


Mid- to upper tropospheric temperature (TMT)

# Do volcanic eruptions produce significant climate signals?



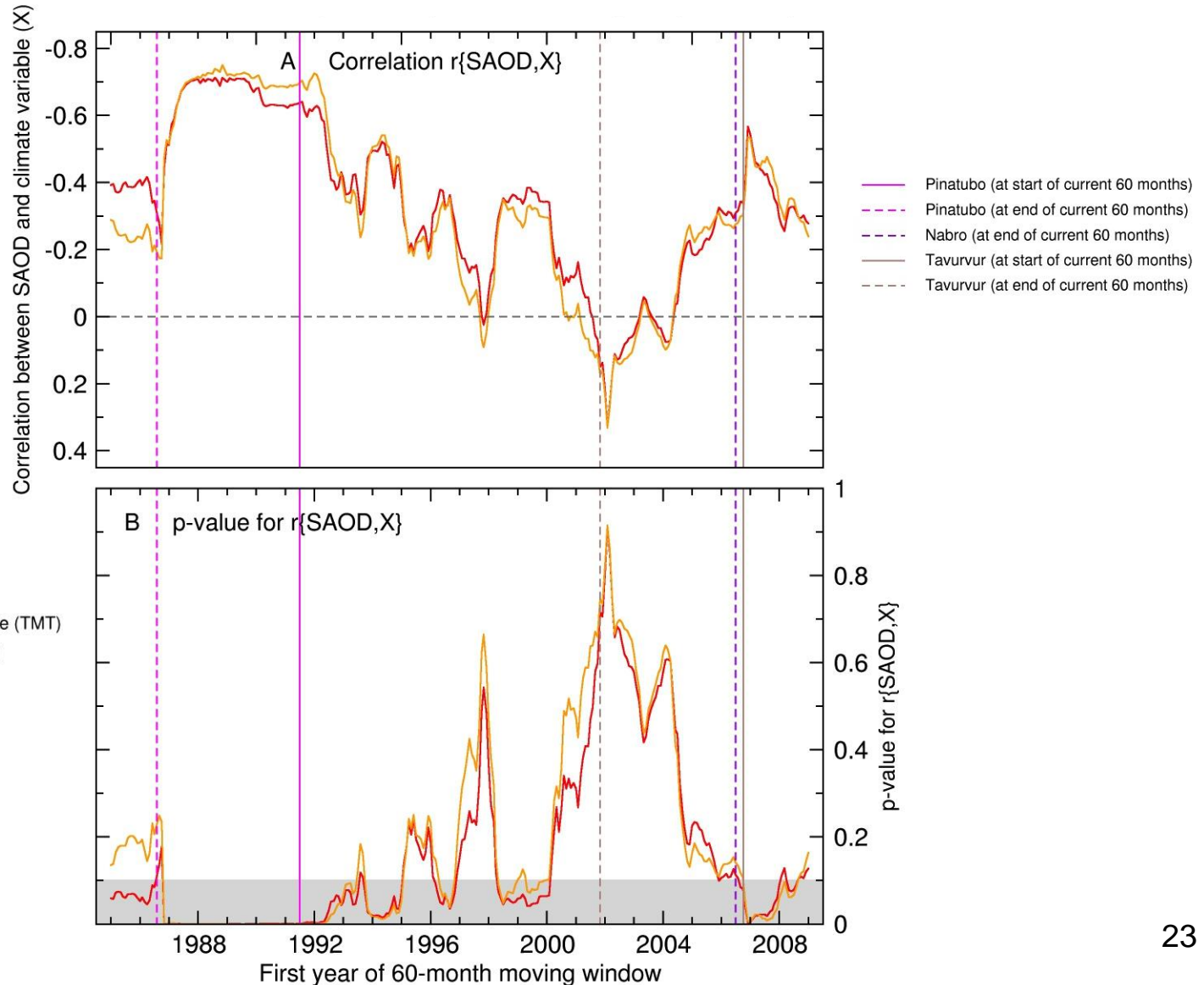
Tropics (20°N-20°S)



# Do volcanic eruptions produce significant climate signals?



Tropics (20°N-20°S)

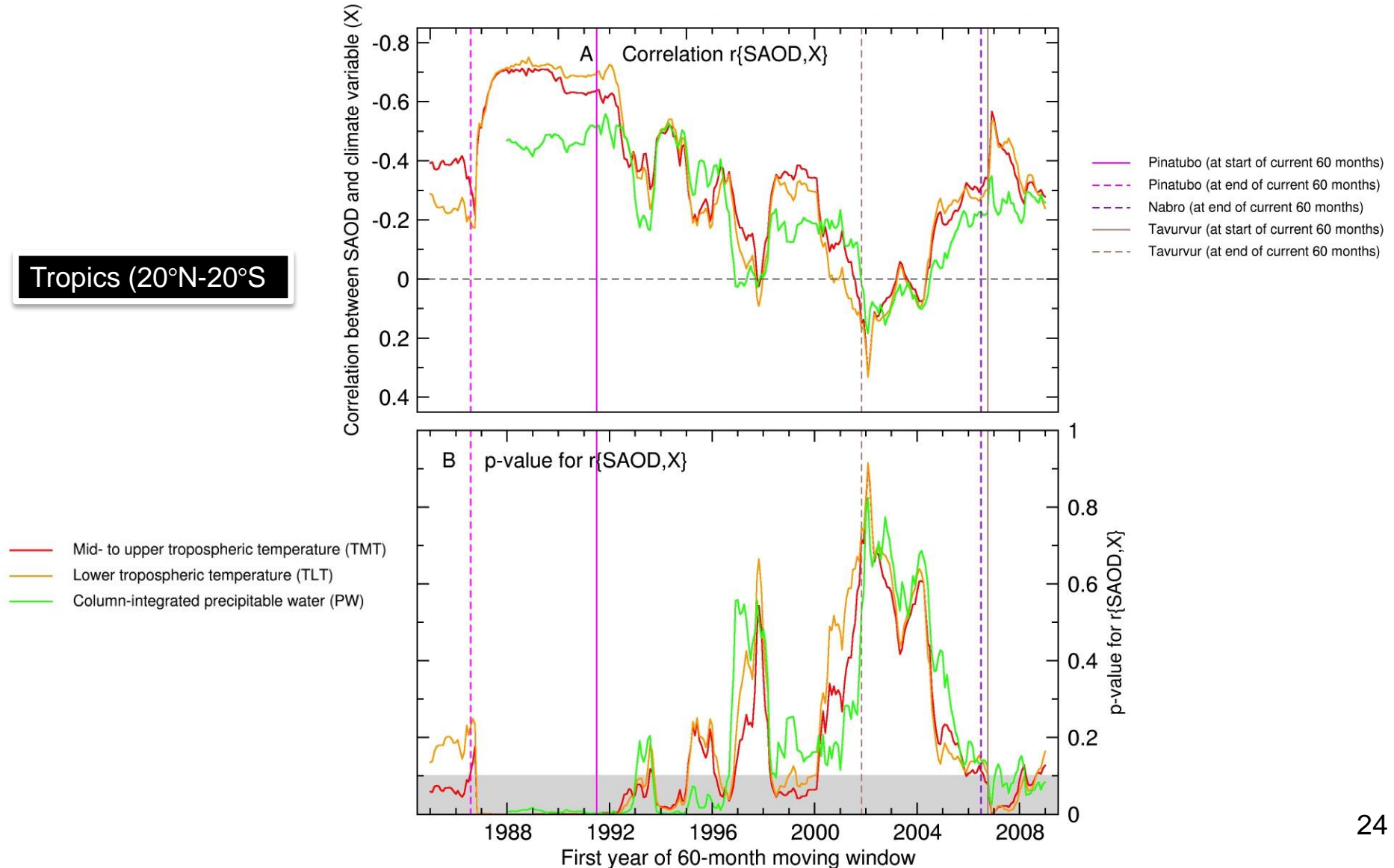




# Do volcanic eruptions produce significant climate signals?



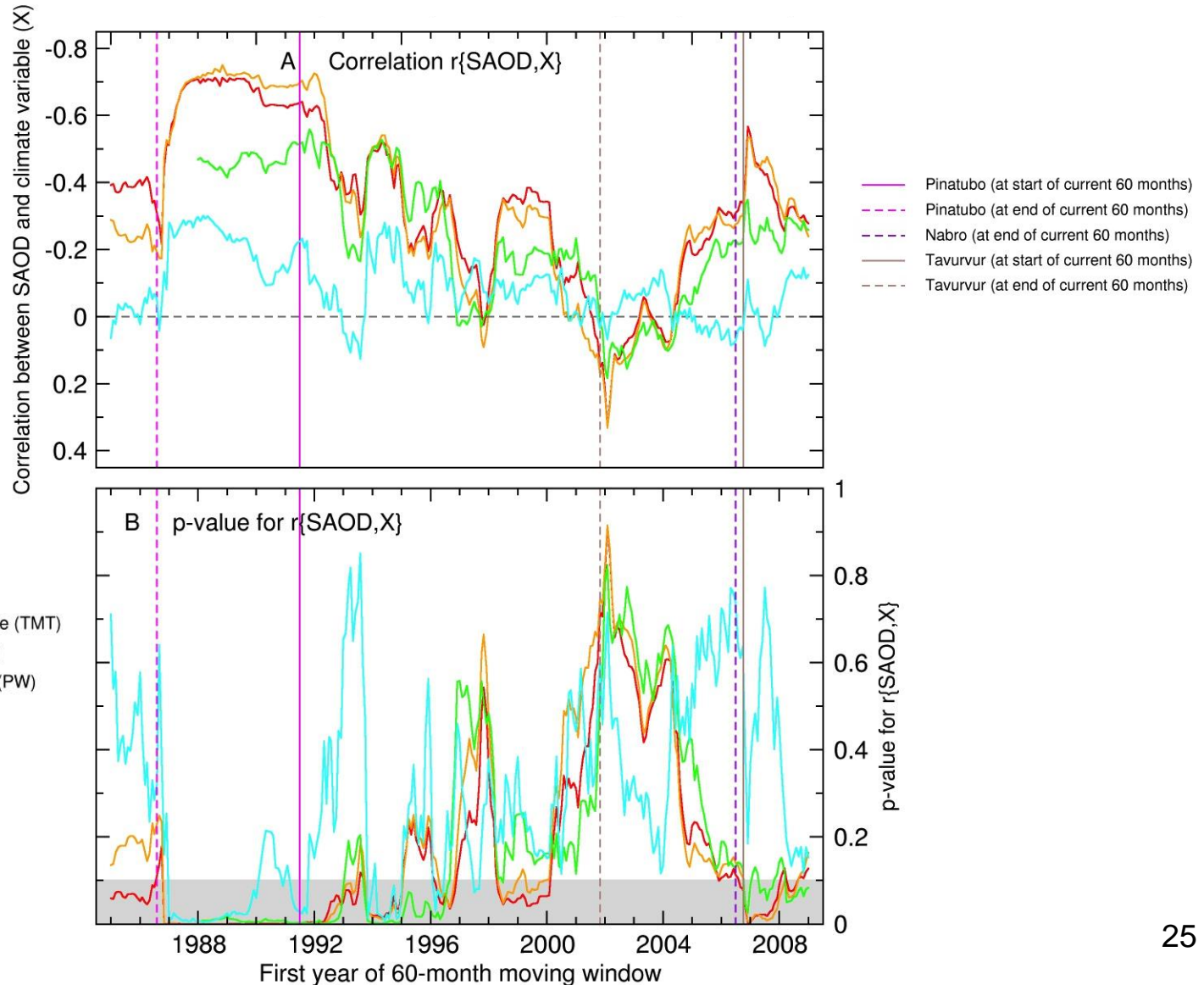
Tropics (20°N-20°S)



# Do volcanic eruptions produce significant climate signals?



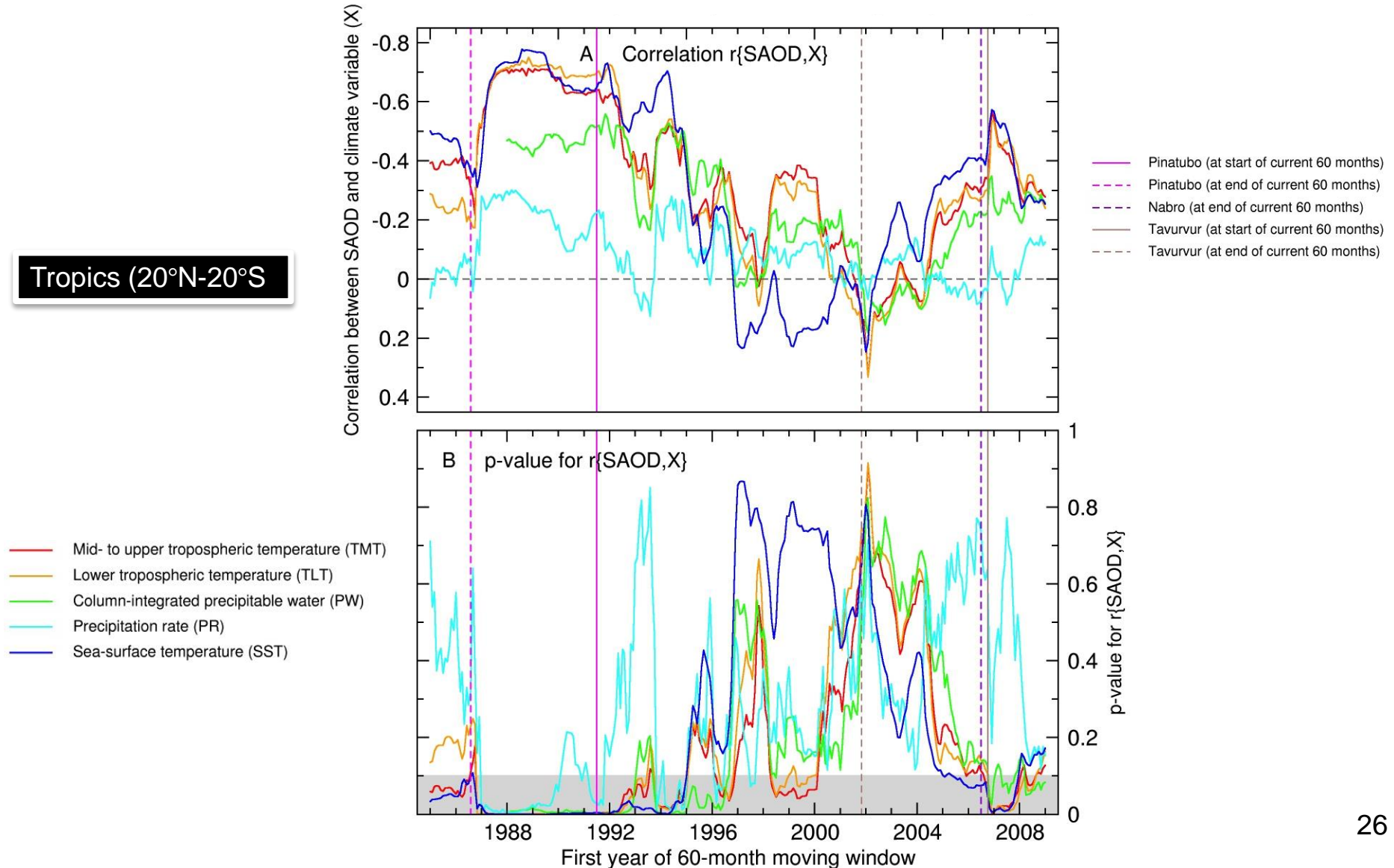
Tropics (20°N-20°S)



# Do volcanic eruptions produce significant climate signals?



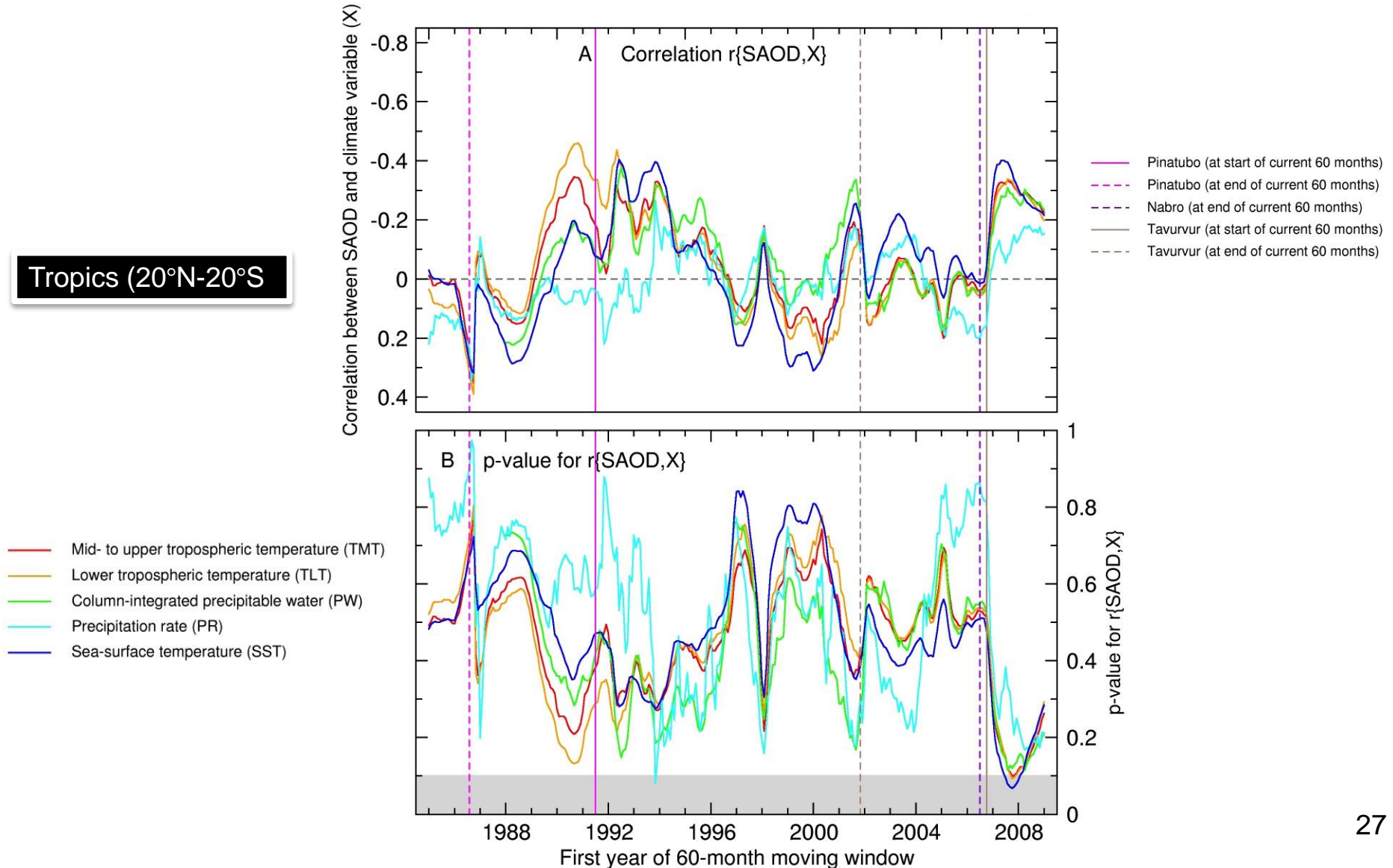
Tropics (20°N-20°S)



# Removing ENSO effects is key to the identification of volcanic climate signals

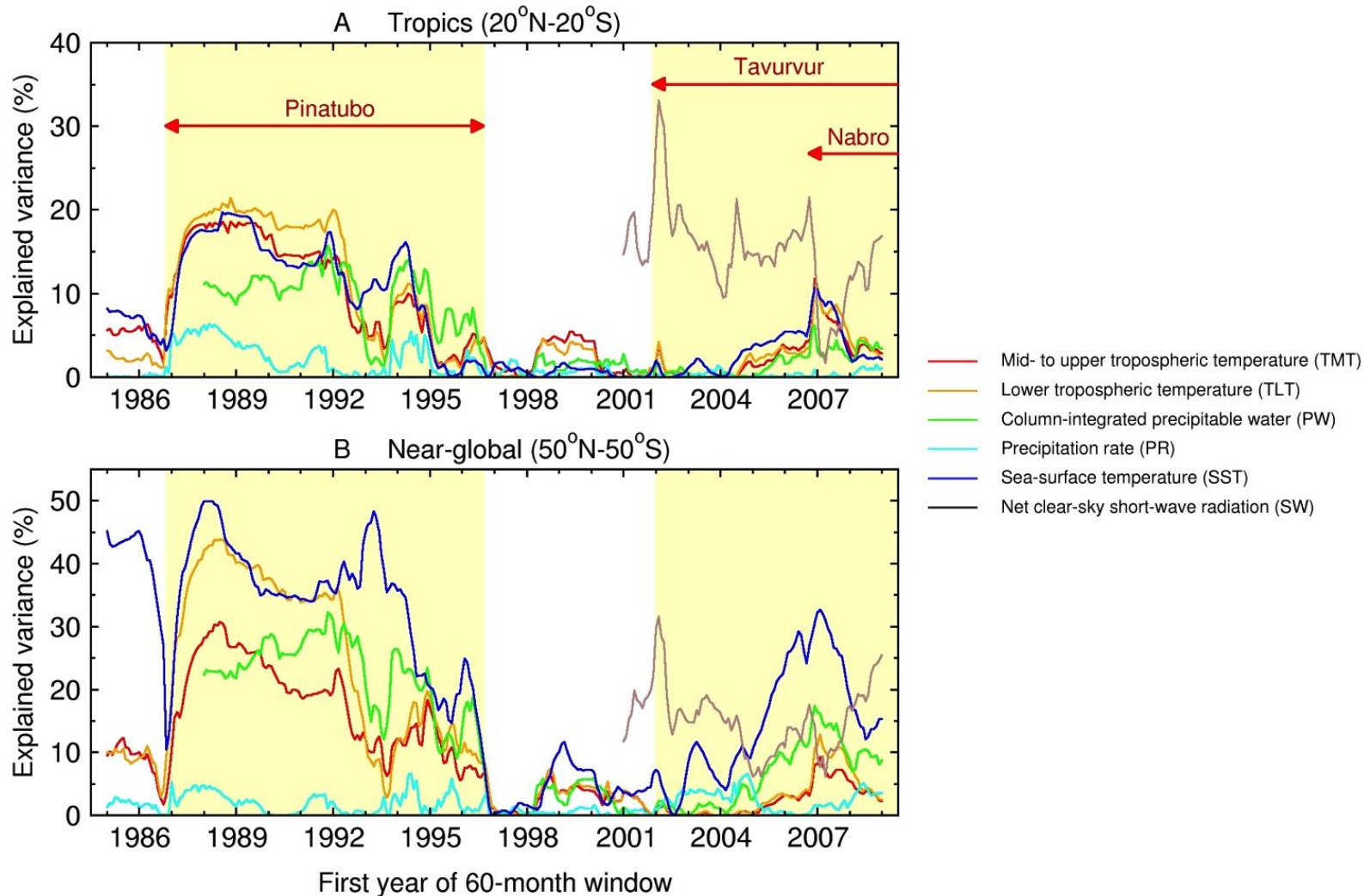


Tropics (20°N-20°S)





# How much of the temporal variance of temperature, moisture, and SW radiation is explained by SAOD?





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## Global volcanic aerosol properties derived from emissions, 1990–2014, using CESM1(WACCM)

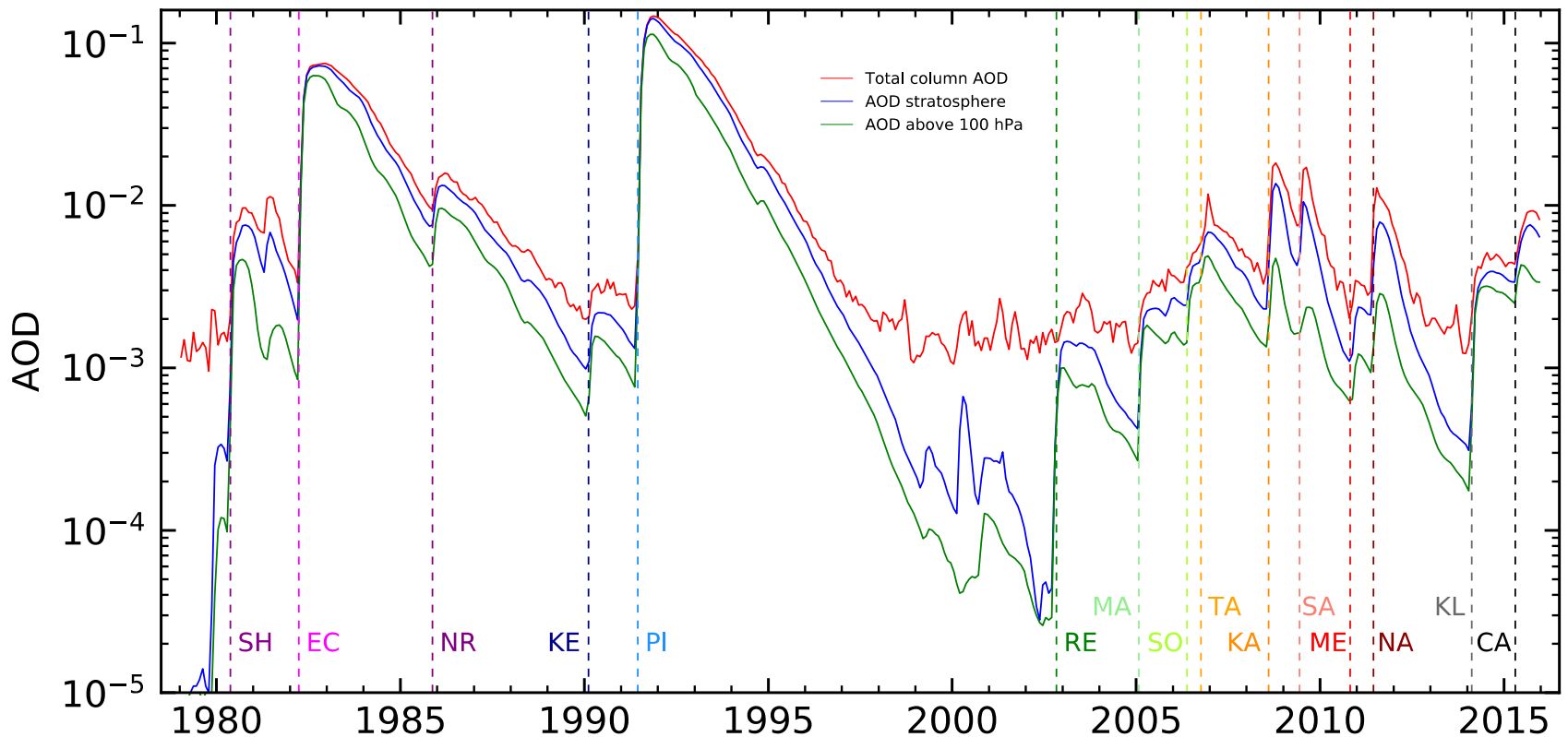
Michael J. Mills<sup>1</sup>, Anja Schmidt<sup>2</sup>, Richard Easter<sup>3</sup>, Susan Solomon<sup>4</sup>, Douglas E. Kinnison<sup>1</sup>, Steven J. Ghan<sup>3</sup>, Ryan R. Neely III<sup>2,5</sup>, Daniel R. Marsh<sup>1</sup>, Andrew Conley<sup>1</sup>, Charles G. Bardeen<sup>1</sup>, and Andrew Gettelman<sup>1</sup>

<sup>1</sup>Atmospheric Chemistry Observations and Modeling Laboratory, National Center for Atmospheric Research, Boulder, Colorado, USA, <sup>2</sup>School of Earth and Environment, University of Leeds, Leeds, UK, <sup>3</sup>Atmospheric Sciences and Global Change Division, Pacific Northwest National Laboratory, Richland, Washington, USA, <sup>4</sup>Department of Earth, Atmospheric, and Planetary Sciences, Massachusetts Institute of Technology, Cambridge, Massachusetts, USA, <sup>5</sup>National Centre for Atmospheric Science, University of Leeds, Leeds, UK

**Abstract** Accurate representation of global stratospheric aerosols from volcanic and nonvolcanic sulfur emissions is key to understanding the cooling effects and ozone losses that may be linked to volcanic activity. Attribution of climate variability to volcanic activity is of particular interest in relation to the post-2000 slowing in the rate of global average temperature increases. We have compiled a database of volcanic SO<sub>2</sub> emissions and plume altitudes for eruptions from 1990 to 2014 and developed a new prognostic capability for simulating stratospheric sulfate aerosols in the Community Earth System Model. We used these combined with other nonvolcanic emissions of sulfur sources to reconstruct global aerosol properties from 1990 to 2014. Our calculations show remarkable agreement with ground-based lidar observations of stratospheric aerosol optical depth (SAOD) and with in situ measurements of stratospheric aerosol surface area density (SAD). These properties are key parameters in calculating the radiative and chemical effects of stratospheric aerosols. Our SAOD calculations represent a clear improvement over available satellite-based analyses, which generally ignore aerosol extinction below 15 km, a region that can contain the vast majority of stratospheric aerosol extinction at middle and high latitudes. Our SAD calculations greatly improve on that provided for the Chemistry-Climate Model Initiative, which misses about 60% of the SAD measured in situ on average during both volcanically active and volcanically quiescent periods.

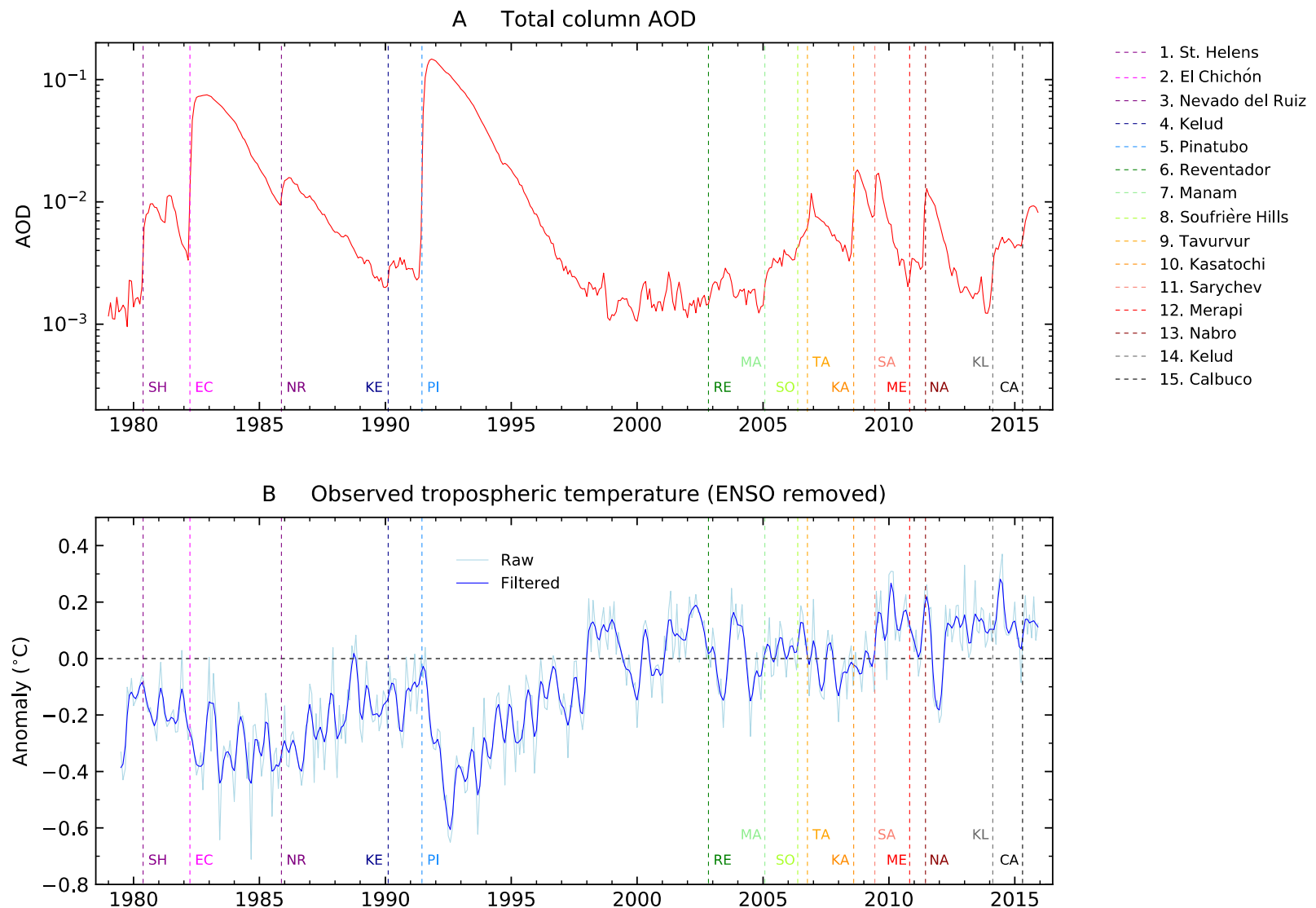


# AOD in the Mills et al. simulations

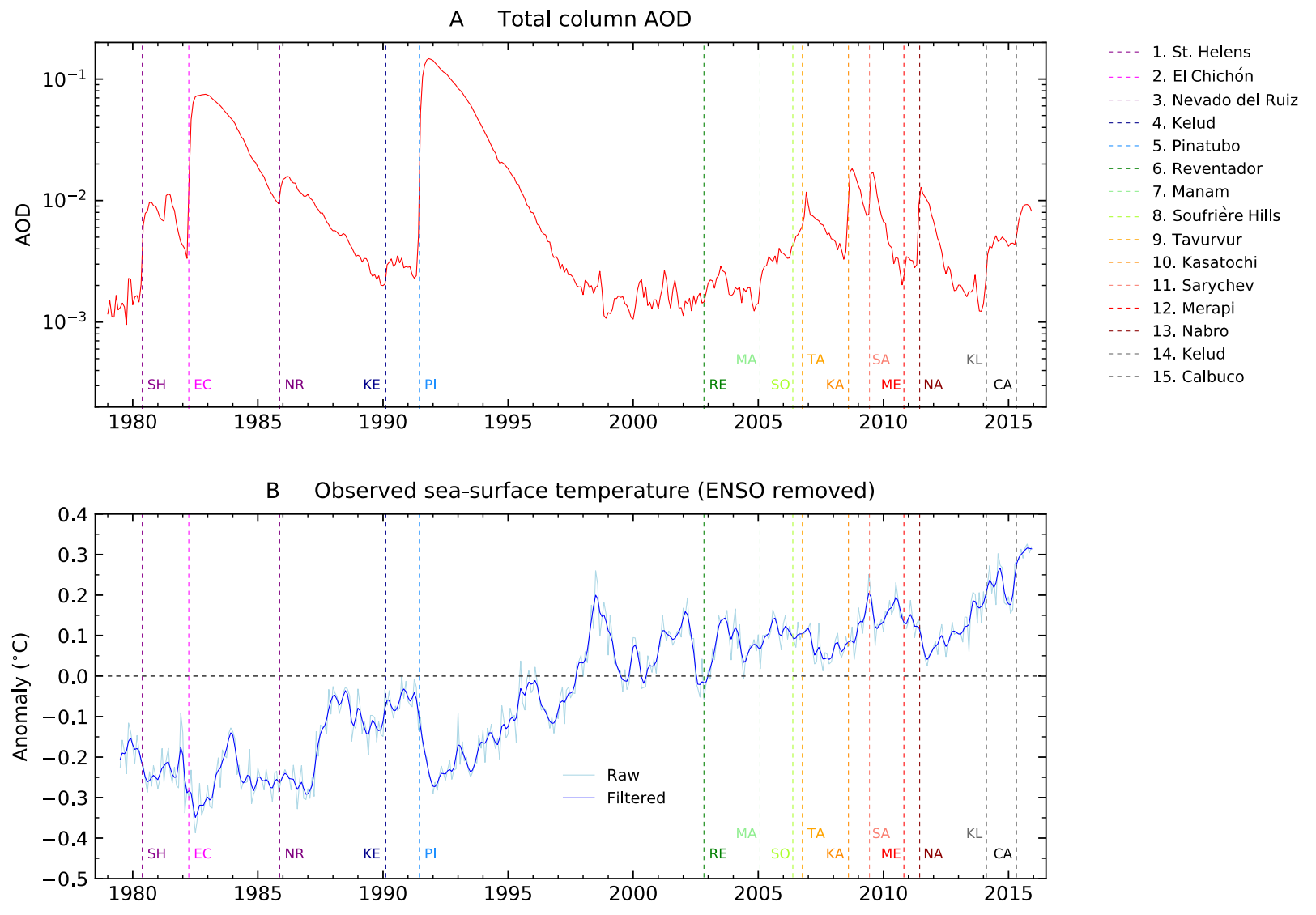


- |                    |               |                    |               |             |
|--------------------|---------------|--------------------|---------------|-------------|
| 1. St. Helens      | 4. Kelud      | 7. Manam           | 10. Kasatochi | 13. Nabro   |
| 2. El Chichón      | 5. Pinatubo   | 8. Soufrière Hills | 11. Sarychev  | 14. Kelud   |
| 3. Nevado del Ruiz | 6. Reventador | 9. Tavurvur        | 12. Merapi    | 15. Calbuco |

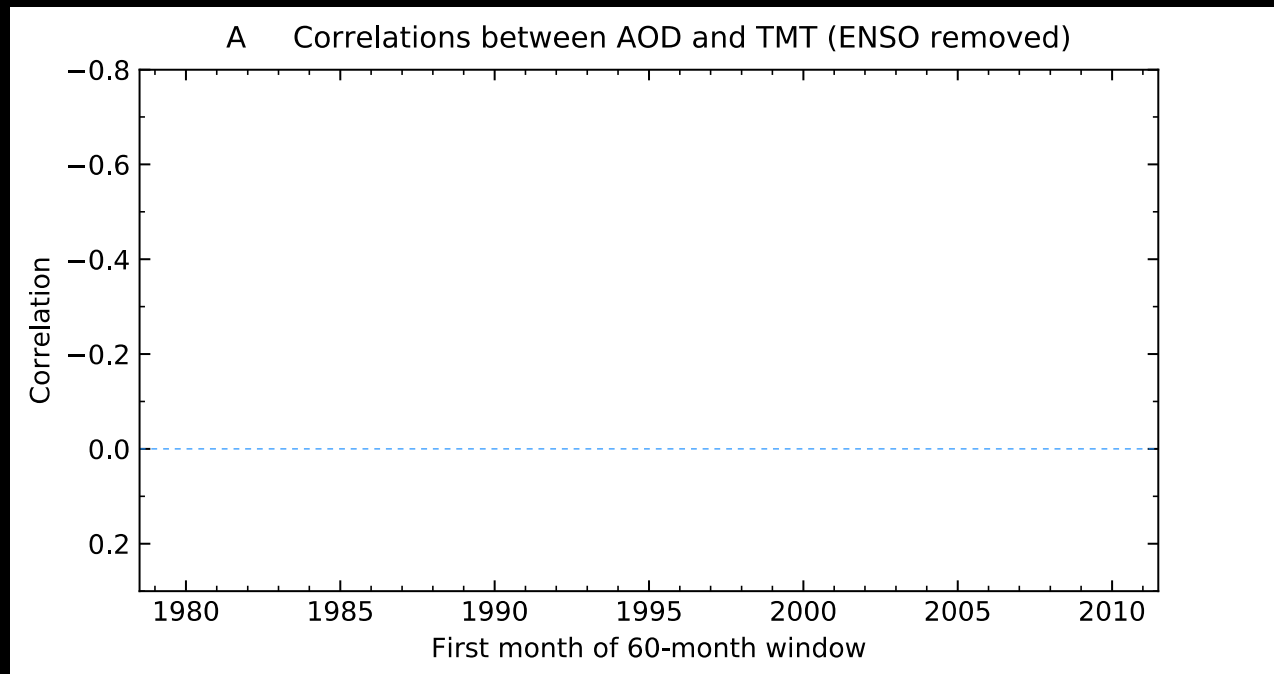
# Changes in global-mean aerosol optical depth (WACCM) and tropospheric temperature (OBS)



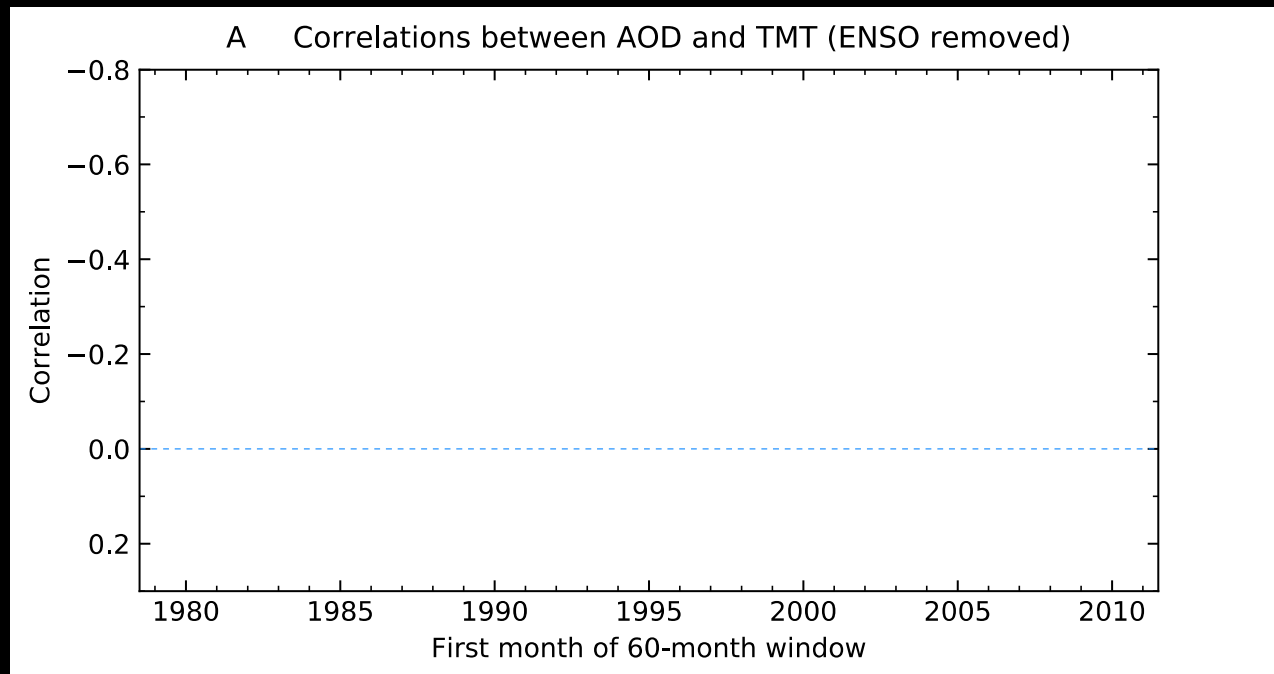
# Changes in global-mean aerosol optical depth (WACCM) and sea-surface temperature 50°N-50°S (OBS)



# Volcanic signal detection: AOD and “ENSO removed” tropospheric temperature

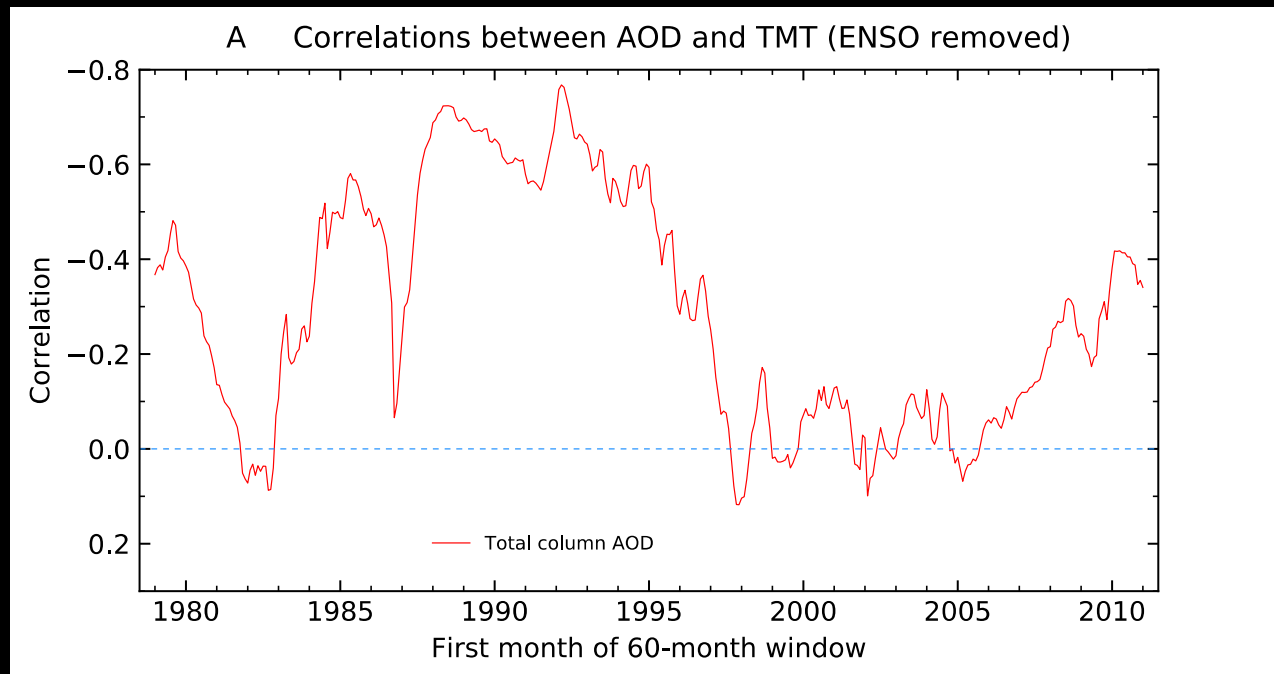


# Volcanic signal detection: AOD and “ENSO removed” tropospheric temperature

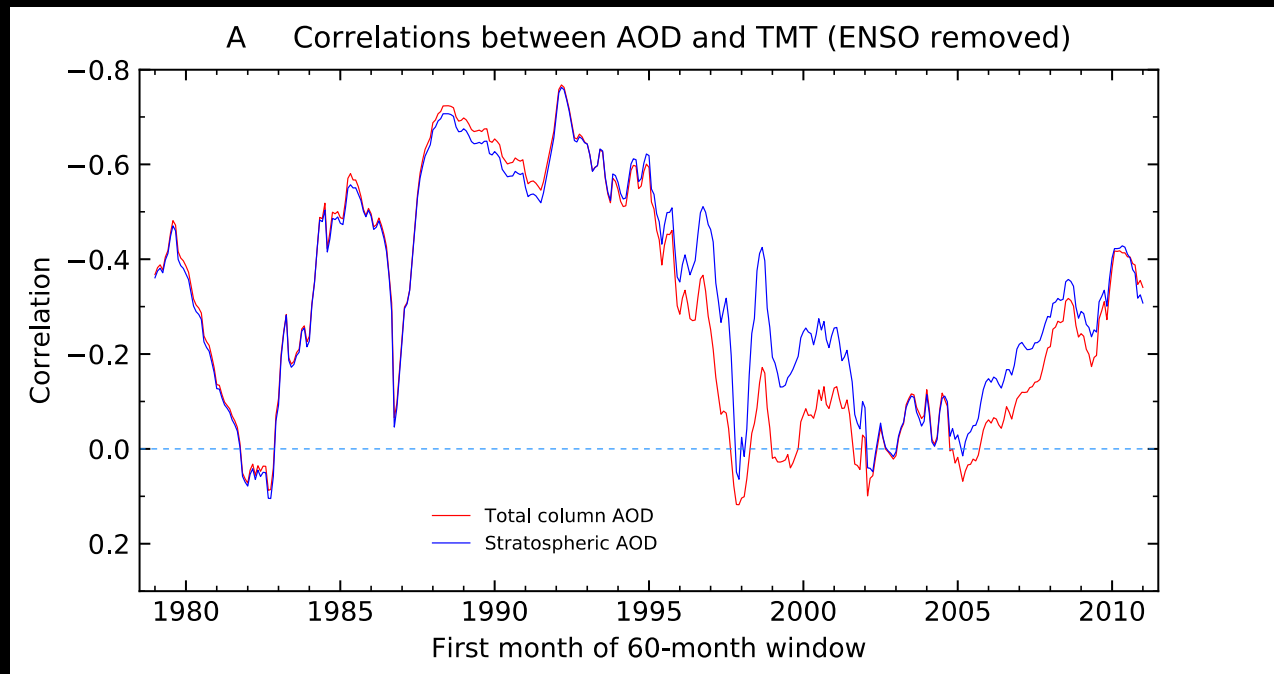




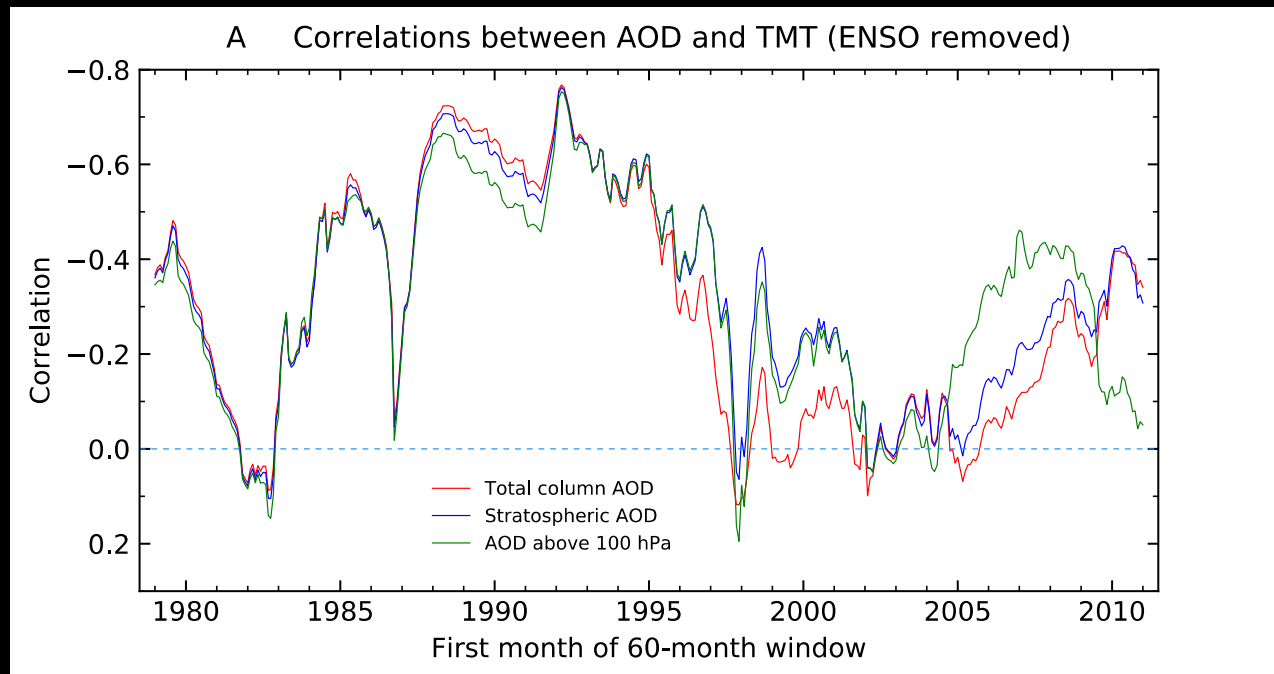
# Volcanic signal detection: AOD and “ENSO removed” tropospheric temperature



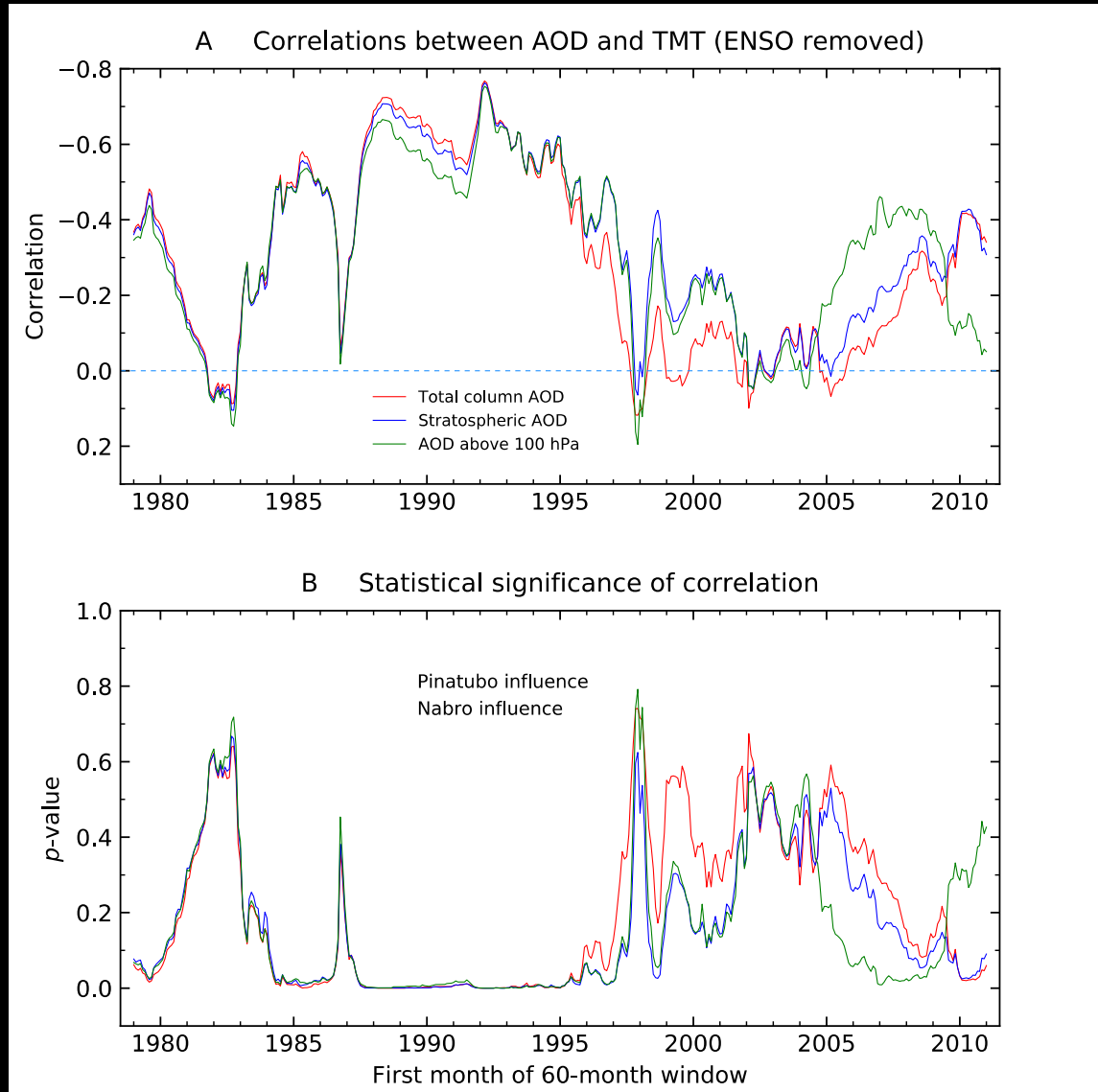
# Volcanic signal detection: AOD and “ENSO removed” tropospheric temperature



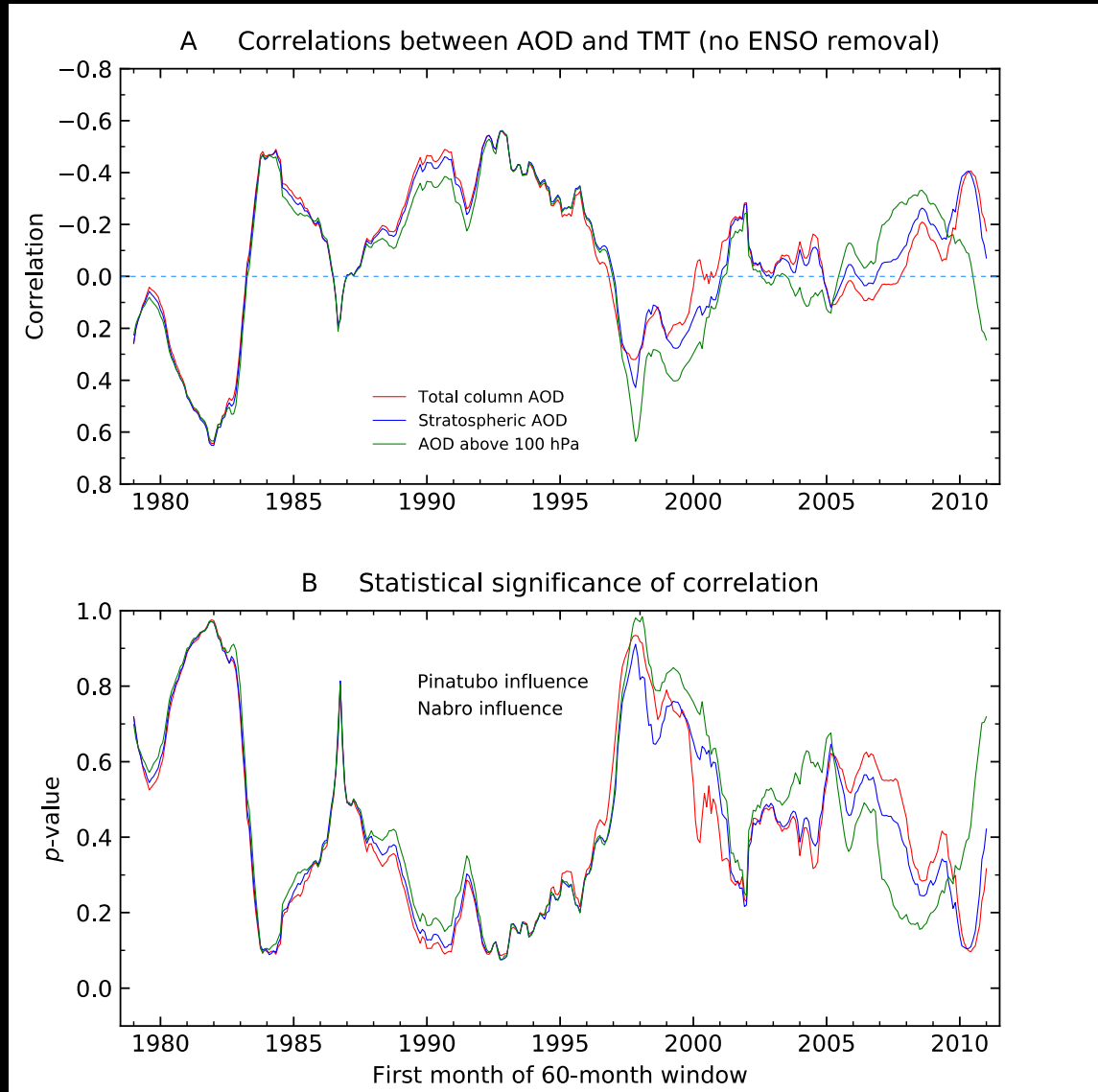
# Volcanic signal detection: AOD and “ENSO removed” tropospheric temperature



# Volcanic signal detection: AOD and “ENSO removed” tropospheric temperature



# Volcanic signal detection: AOD and tropospheric “raw” temperature





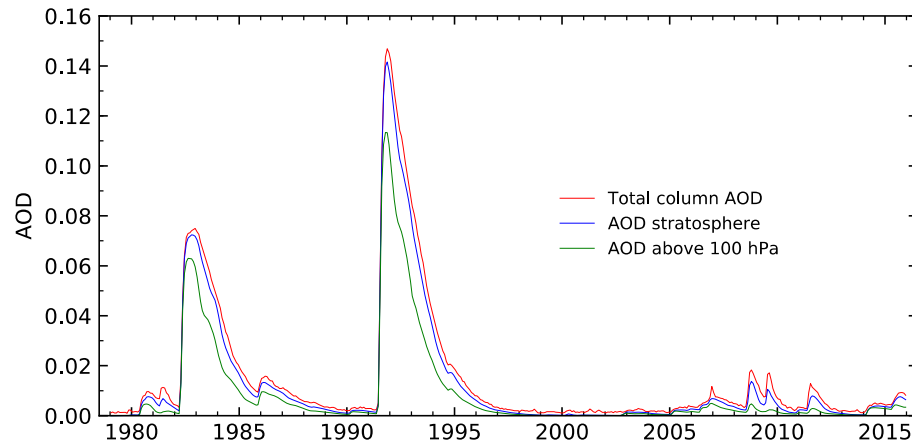
# Conclusions

- Multivariate climate signals of late 20<sup>th</sup> and early 21<sup>st</sup> century volcanic activity are statistically identifiable in observations:
  - ➔ SST and tropospheric temperature
  - ➔ Column-integrated water vapor
  - ➔ Rainfall
  - ➔ Net clear-sky short-wave radiation at top of the atmosphere
- Signals are identifiable for El Chichón, Pinatubo, and for the post-2005 period
- Systematic errors in volcanic (and other) external forcings affect interpretation of differences between modeled and observed climate changes
- In the SO<sub>2</sub>-forced CESM1-WACCM simulations, model-generated volcanic aerosol optical depth can be used to identify significant signals in observed climate data
- Such simulations provide a useful test-bed for quantification of contributions from stratospheric and tropospheric volcanic aerosol to observed volcanic climate signals

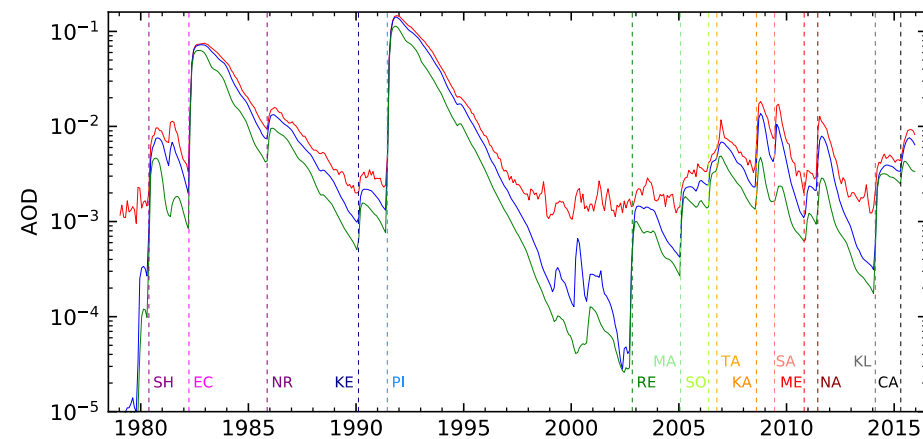
# Two science questions

1. Why can we identify the observed climate signals of “small” volcanic eruptions in the post-2005 period?

A Linear AOD



B Logarithmic AOD

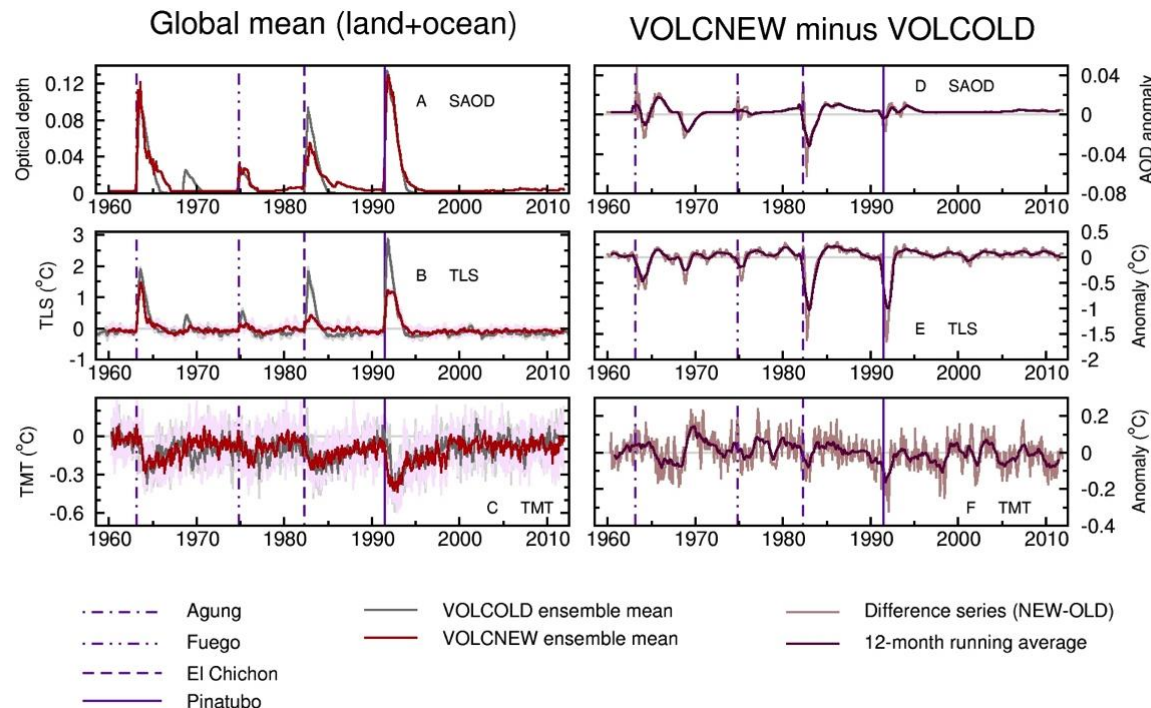


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# Two science questions

2. In the last four days, we have seen estimates of spatio-temporal changes in volcanic activity based on observations, reanalyses, and SO<sub>2</sub>-driven model simulations. How different are these estimates? How much of the temporal variance of observed “ENSO removed” climate variables do they explain?





# ● EXTRA SLIDES

# Schematic of iterative method for removing ENSO and volcano signals (Santer *et al.*, 2001)



$T_t$  Raw tropospheric temperature data

Select ENSO index,  $X_t$  (SOI, Niño 3.4, Niño 3)

- Estimate regression coefficient  $b$  for  $\{X_t, T_t\}$  (Iteration 1)
- Estimate regression coefficient  $b$  for  $\{X_t, T_t^*\}$  (Iterations > 1)
- Estimate lag  $j$  (in months) at which  $b = b_{max}$

Compute ENSO signal in  $T_t$  or  $T_t^*$

→  $E_t = a_j + b_j X_t$

Subtract ENSO signal  $E_t$  from raw temperature data

→  $Z_t = T_t - E_t$

For selected TAU, estimate volcano parameters from  $Z_t$

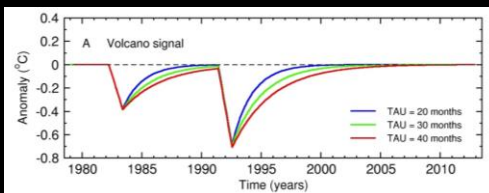
- $\Delta T_{max}$  Maximum volcano-induced cooling
- $t_{ramp}$  Time (in months) to maximum cooling

Estimate volcano signal  $V_t$  from  $Z_t$

Subtract  $V_t$  from original temperature data  $T_t$

→  $T_t^* = T_t - V_t$

Iterate until convergence



# Do volcanic eruptions produce significant climate signals?



Tropics (20°N-20°S)

