

# **Estimating multi-decadal trends in ENSO: A case study using Darwin SLP**

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# Motivation

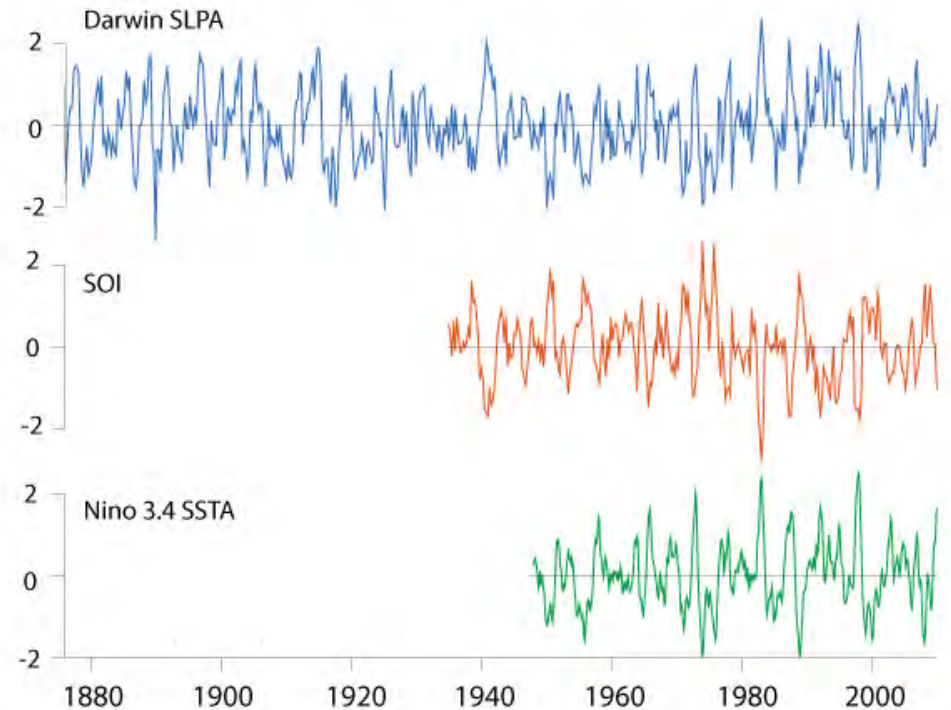
- Revisit the issue of whether or not there is evidence of long-term change in the El Niño-Southern Oscillation (ENSO): **Are multi-decadal and longer-term perspectives consistent?**
- Use a high quality, long-term (136yr) record of marine climate to examine issues faced in trend studies.

# Outline

- Background/Motivation
- Results
  - Sliding-window examination of trends in Darwin SLPA and their **statistical significance**
  - Relationship between trends over full-record (136 years) and shorter decadal/multi-decadal segments
  - Difficulties in using statistical tests on “red” time series
- Summary/Conclusions

# ENSO and Darwin

- Darwin SLPA is a good proxy for ENSO state  
Darwin SLPA is highly correlated with other ENSO records at interannual and longer timescales ( $r=0.9$  and  $0.8$ , for SOI and Nino 3.4, when smoothed with a 13-month Parzen filter)
- Previous studies suggested evidence of climate change in Darwin record (e.g. Trenberth & Hoar, 1996, c.f. Harrison and Larkin, 1998).
- IPCC model projections of future ENSO trends differ (Vecchi et al., 2008)
- Nicholls (2008) found a 50yr (1958-2007) trend in SOI when considering just some seasons, but not others.



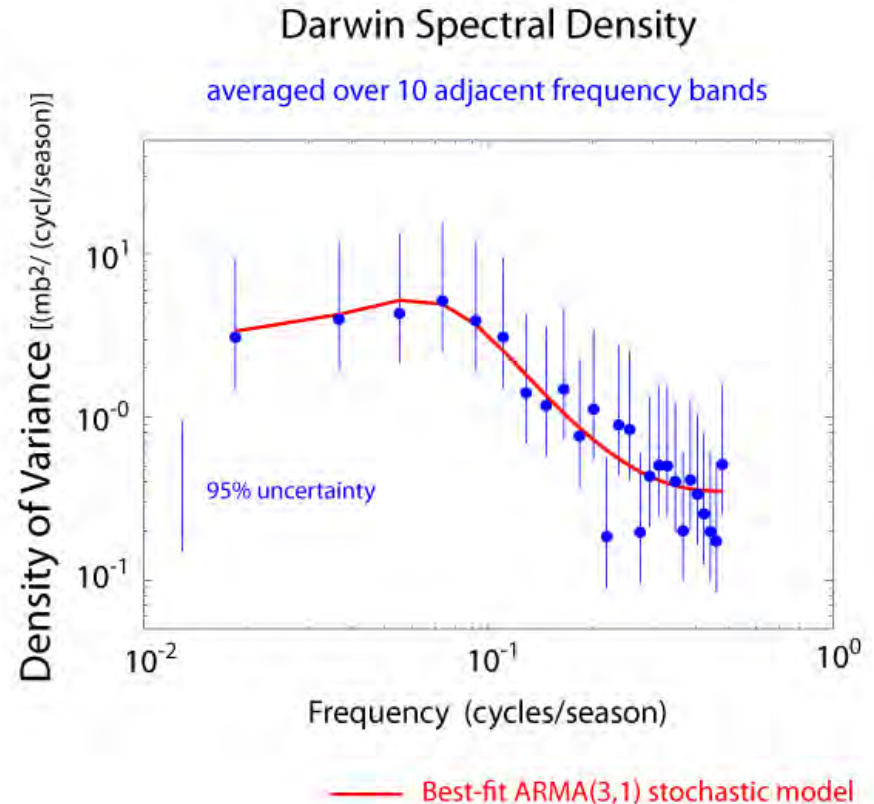
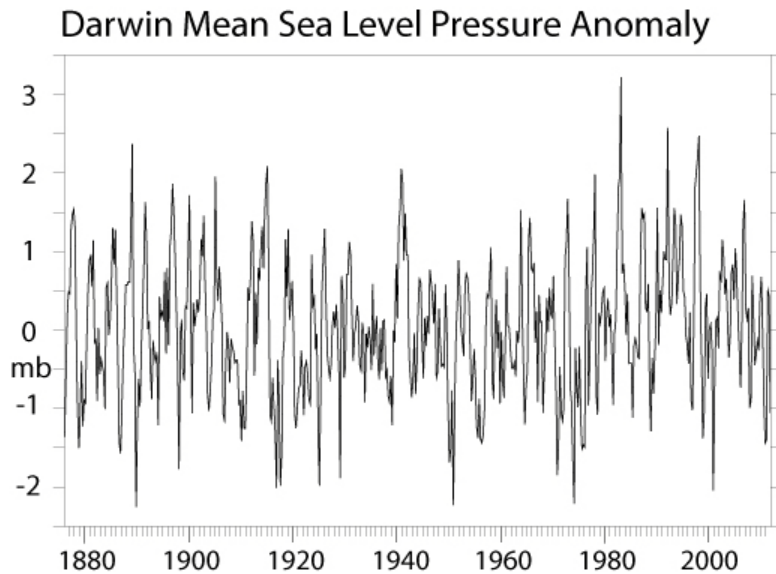
# Determining very long-term change with the available historical records

- Climate variability has been well sampled only recently
- Interest in determining which aspects of climate are undergoing long term change plus limits imposed by the historical availability of climate-quality records mean we often look for trends in climate variables over the full-length of the available historical records, yet are ultimately interested in trends over longer periods
- What are the risks of extrapolating trends in this situation?

# The role of tests for trend statistical significance

- We often look to tests for trend statistical significance to guide our interpretation of a given trend.  
“significant” = indicative of change in underlying processes
- But, reliably determining trend statistical significance can be discouragingly difficult for many geophysical time series, which have spectra that characteristically are “red”.
- As the “redness” of a process increases, so does the range of trends seen in finite segments, even when there is no very long term trend.

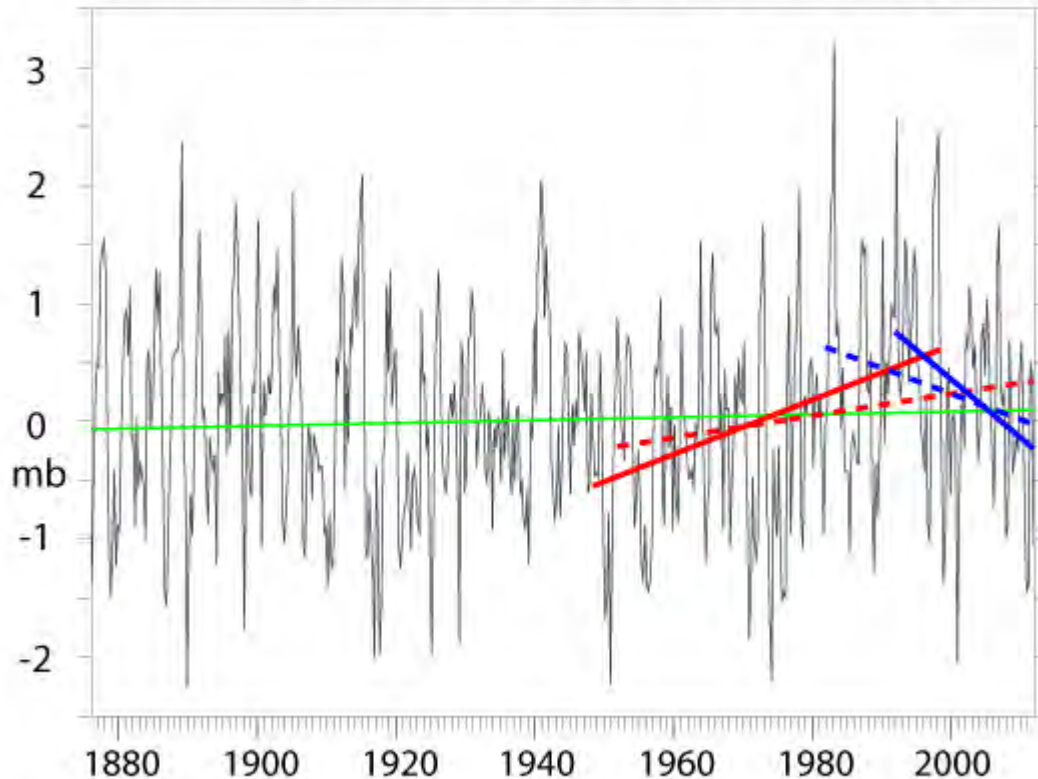
# Darwin SLP Anomaly



- Like many geophysical records, Darwin's spectrum is "red", or contains more variance at lower than higher frequency.
- The reliability of tests for trend statistical significance depends on their ability to accurately estimate the amounts of stationary (no-trend) low frequency variability present

# Multi-decadal trends: the importance of start/end points

Darwin Mean Sea Level Pressure Anomaly

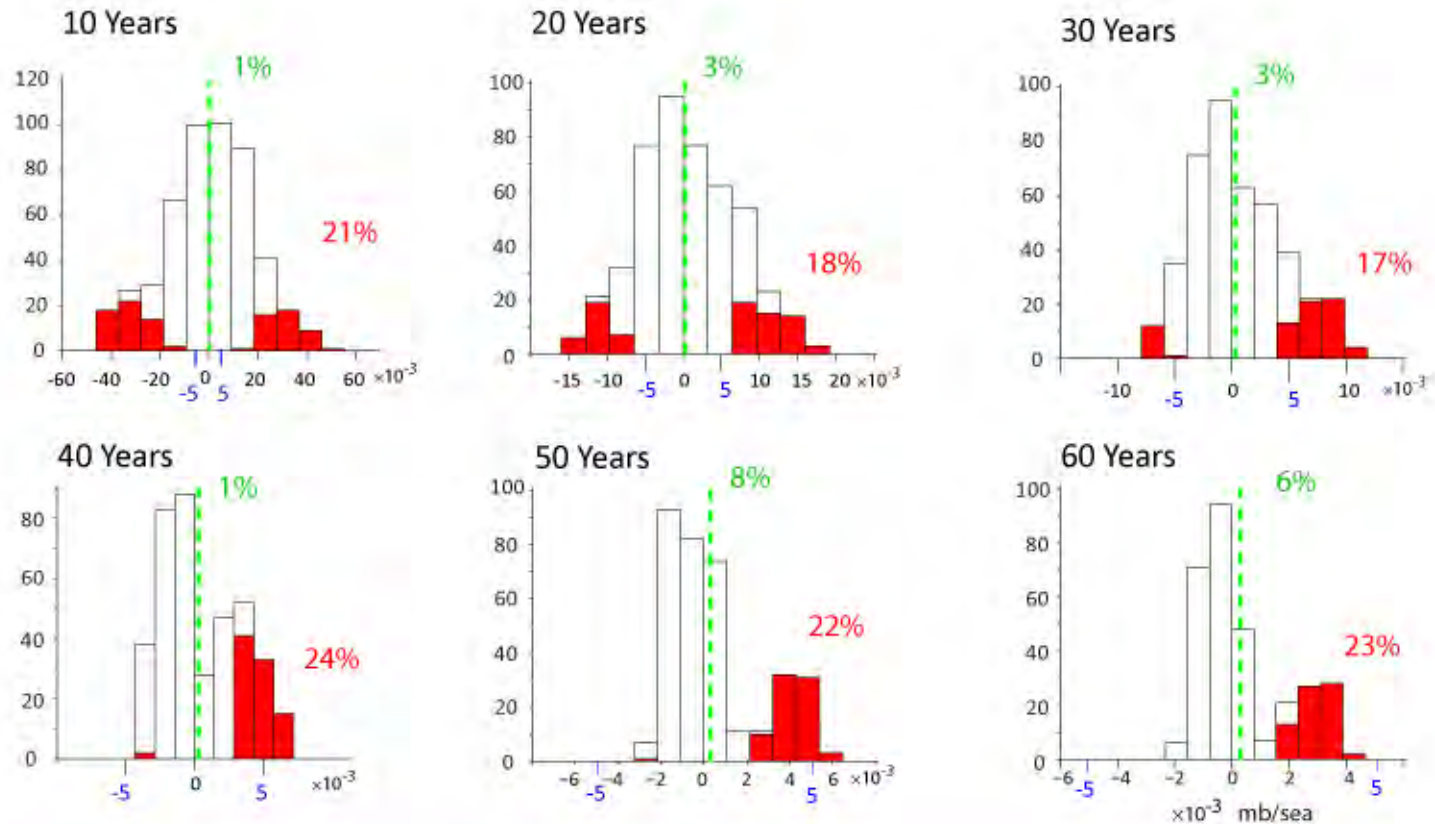


Trends over different recent multi-decadal periods and the record-length (136 year) trend have different character

- Last 20 years : significant/negative (99%)
- - - Last 30 years : nearly significant/negative (86%)
- - - Last 60 years : significant/positive (95%)
- 1949-1998 : significant/positive (>99.9%)
- 1876-2011 : not significant (<66%)



# Distribution of sliding-window multi-decadal trends in Darwin



Red numbers : % of segments that yield statistically significant trends

Green numbers: % of segments that are within a factor of 2 of the 136yr trend (shown by green dashed line,  $=3 \times 10^{-4}$  mb/sea)

Multi-decadal trends do not provide a reliable estimate of the longer term (136 yr) behavior in this case.

# Test for trend statistical significance

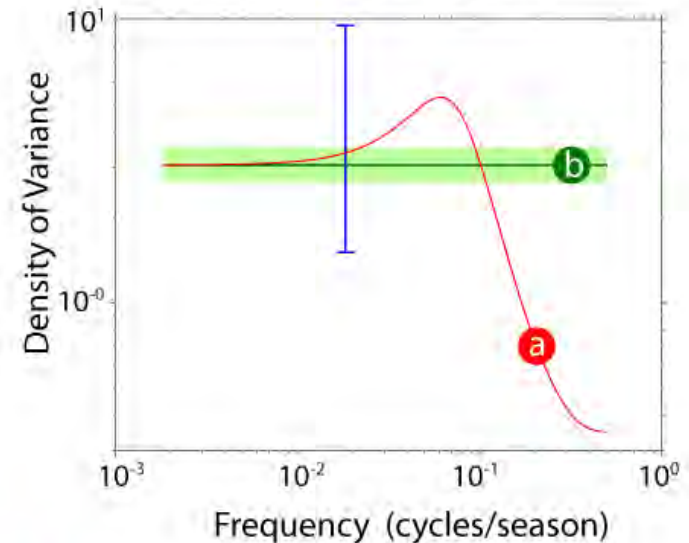
Test procedure:

- 1) Select record (or segment)
- 2) Determine trend (least squares fit)
- 3) Remove trend
- 4) Estimate amounts of non-secular variability present
- 5) Randomly generate many synthetic series based on results from step 4 to determine likelihood that the trend seen (step 2) is an artifact of this type (non-trend) of behavior.

We have confirmed that in the scenario that Darwin is well-represented by the stochastic model shown above (curve a), the version of the bootstrap test used here performs well when 100 years (400 seasons) of “data” are provided

## Simulation Spectral Density

Bootstrap-test @ 100 years



- a** ARMA(3,1) stochastic model fit to actual 136yr Darwin record
- b** Mean bootstrap test-estimate
- test 5th to 95th percentile
- I 95% uncertainty on spectrum (shown for lowest resolved frequency when averaging over 10 adjacent frequency bands)

# Summary

- All tests considered find that the 136 year trend in Darwin is not statistically significant
- There is a rich variety of behavior seen at multi-decadal time scales, with relatively equal numbers of positive and negative trends
- Despite this, a disproportionately large number of multi-decadal sliding-window segments yield statistically significant trends based on tests that showed good performance in a best-fit scenario

# Conclusions

- We suggest that the best answer is that the null hypothesis that there is no very long-term trend in Darwin (ENSO) is true
- Focusing just on a particular multi-decadal segment could easily lead to a different story
- For Darwin, multi-decadal records are too short to be useful for inferring longer term trends. We suggest this is a feature of “red” time series
- Caution is needed when using statistical tests to judge the “significance” or likely persistence of a record-length trends
- Understanding the physical processes responsible for the observed multi-decadal variability and possible longer term change is key.



# Test for trend statistical significance

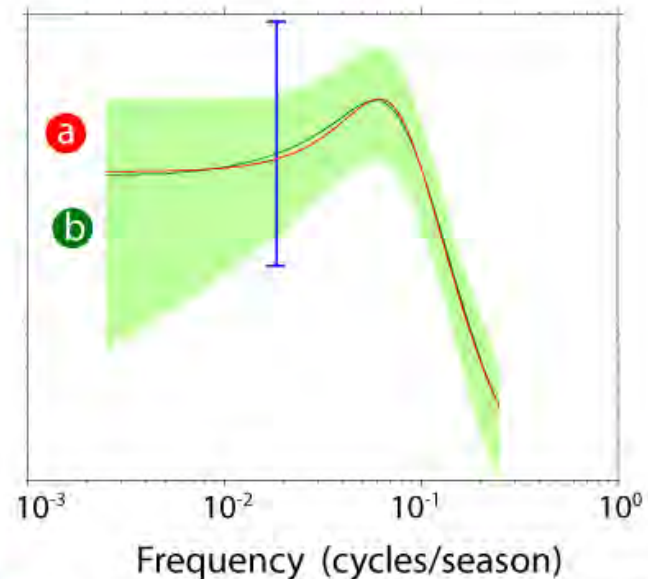
ARMA-simulation = parameters from actual 136yr Darwin record

ARMA-test = parameters from simulated (or sliding-window) segment

An ARMA-based test can also be used (c.f. Trenberth and Hoar 1996). In this case a larger range of test-estimated low frequency behavior is seen in the simulation experiment and results are less stable than in the bootstrap-case.

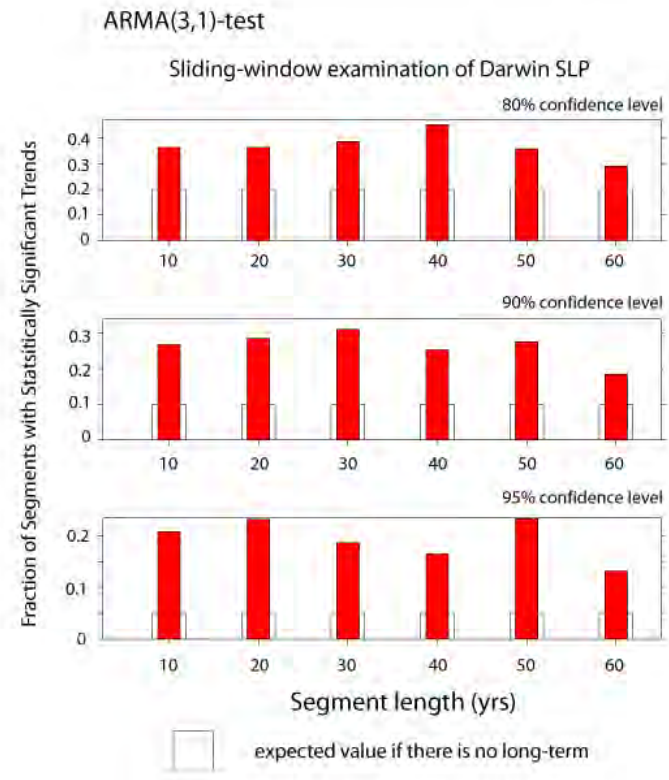
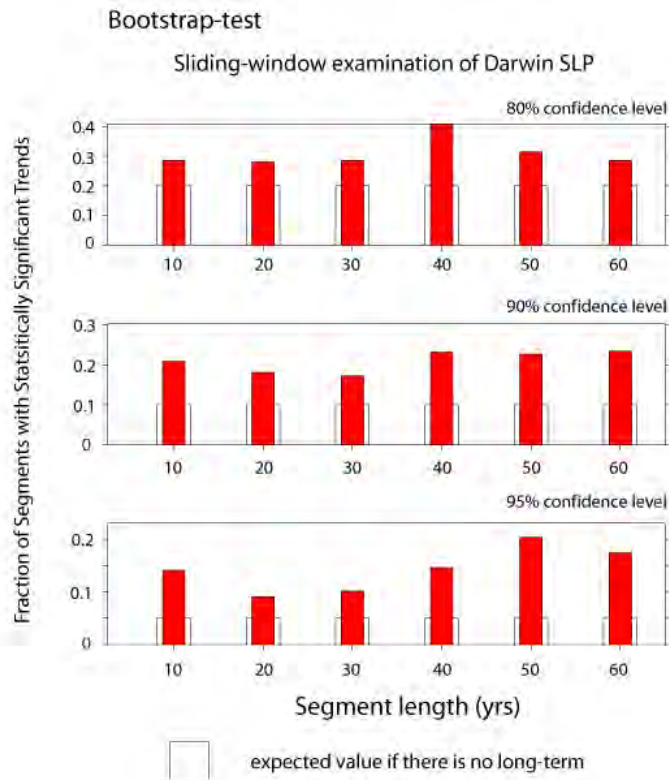
## Simulation Spectral Density

ARMA(3,1)-test @ 100 years



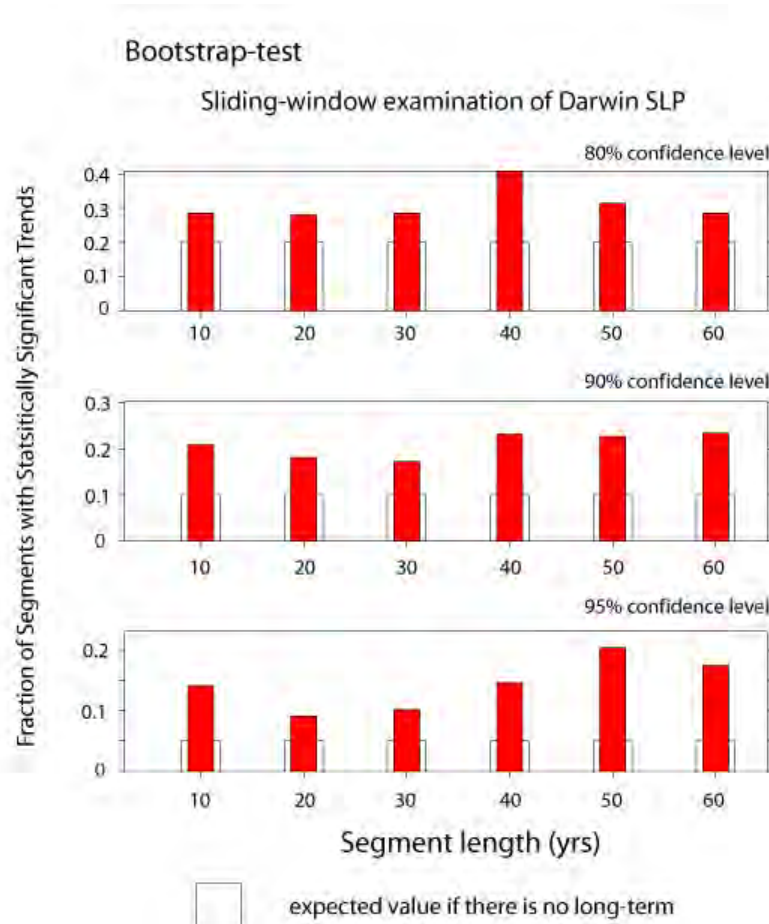
- a** ARMA(3,1) stochastic model fit to actual 136yr Darwin record
- b** Mean ARMA(3,1) test-estimate
- test 5th to 95th percentile
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# Statistically significant multi-decadal trends in Darwin



More sliding-window segments (by a factor of 2 to 5) reach trend statistical significance than are consistent with the null hypothesis that there is no very long-term trend in Darwin, being true.

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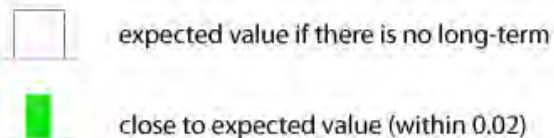
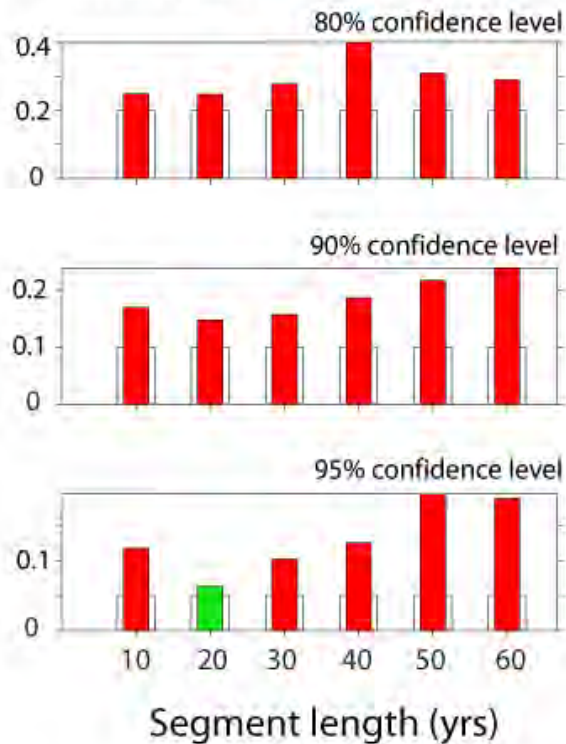


# Statistically significant multi-decadal trends in Darwin

## Sliding-window examination of Darwin SLP

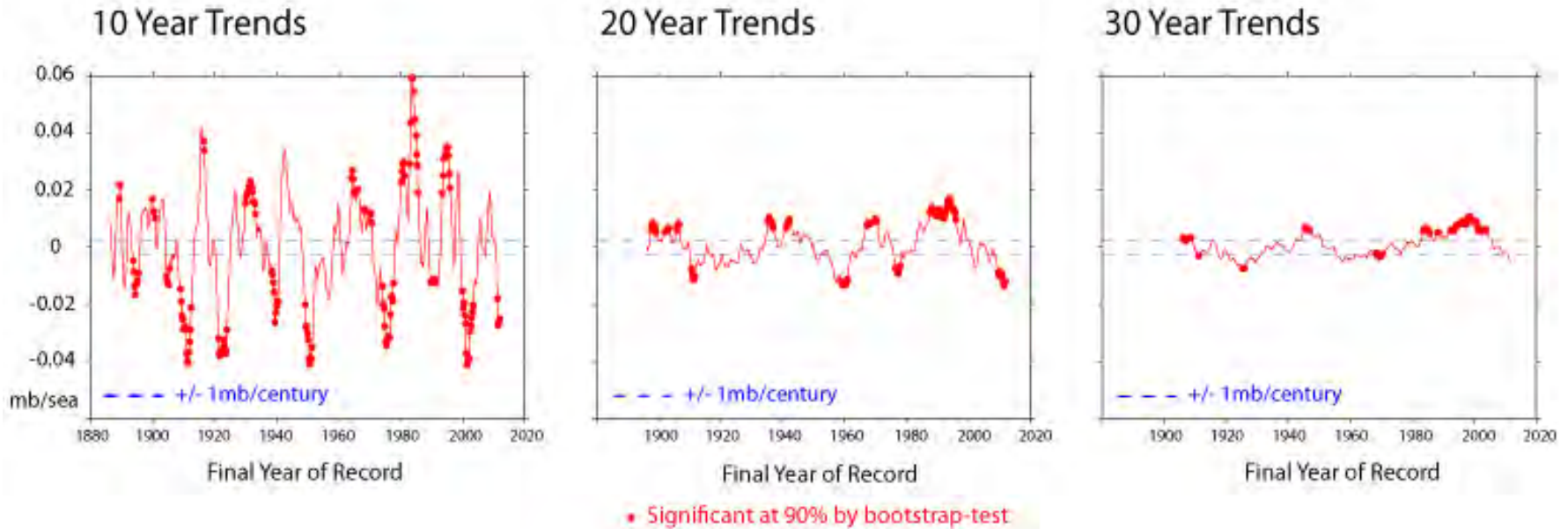
Test step 4 based on the full 136yr record

### Bootstrap-test



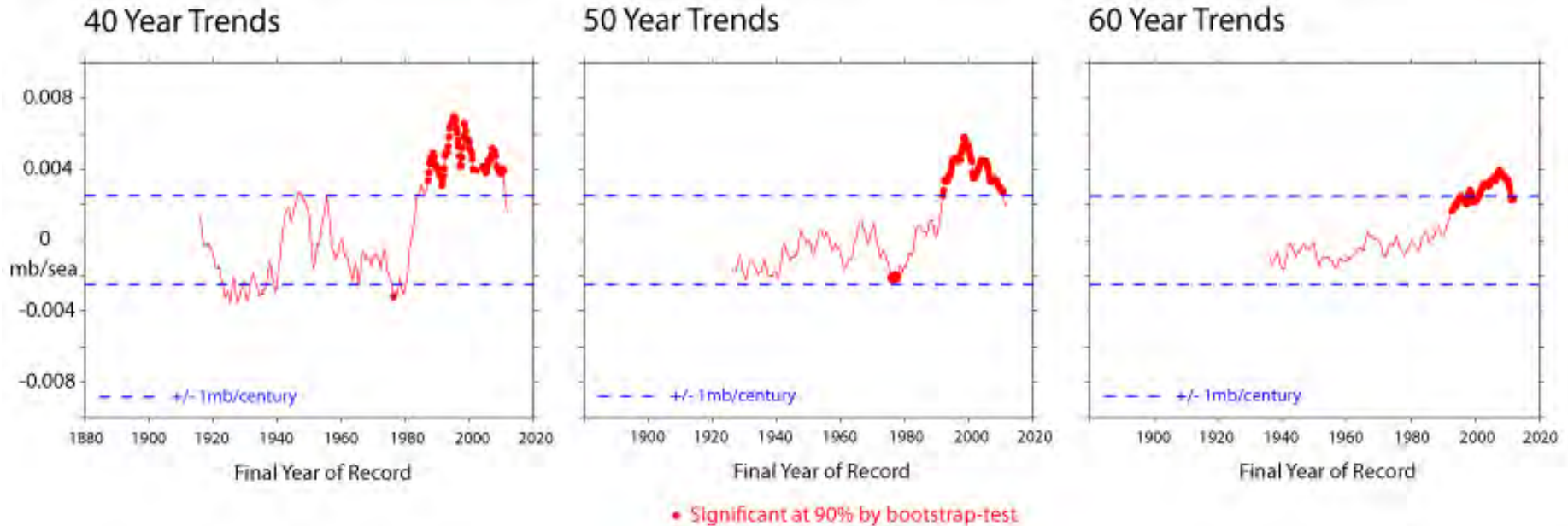
This inconsistency remains even when the amounts of non-trend variability present are estimated from the full record.

# Sliding-window trends in Darwin: 10 to 30 years



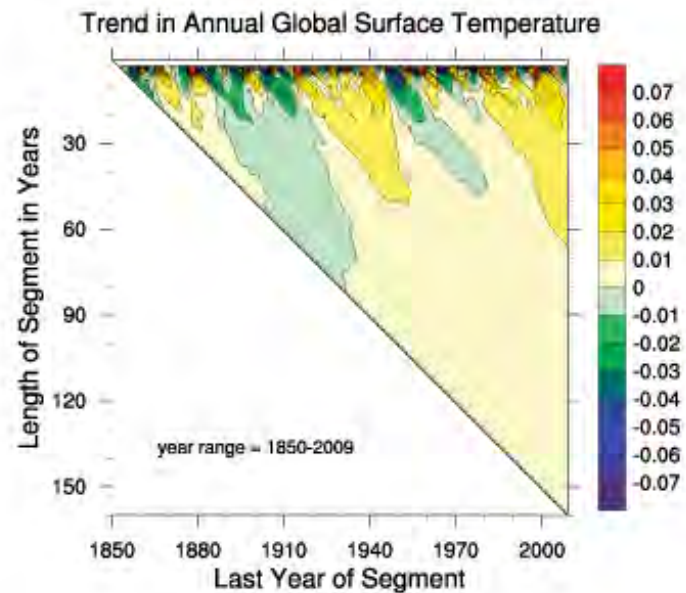
- Similar numbers of positive and negative trends are seen
- Many of each reach statistical significance

# Sliding-window trends in Darwin: 40 to 60 years



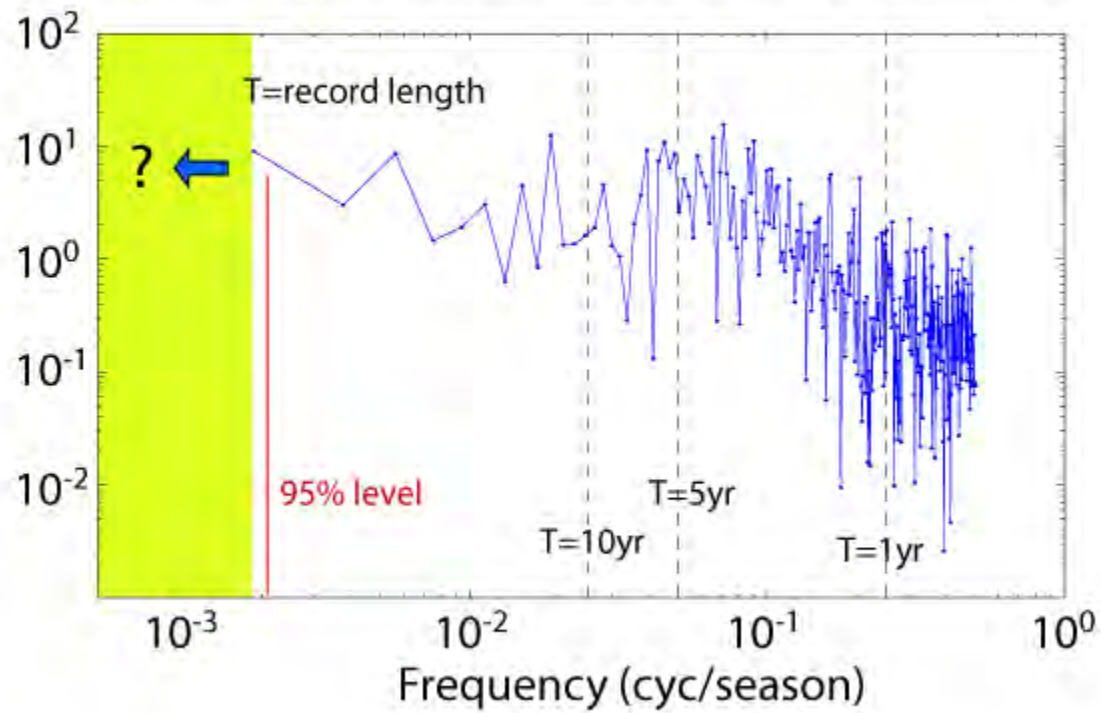
# Multi-decadal and century-length trends

- Need for understanding relationship between relatively short and long term trends has been recognized
- Visual tool suggested by Leibmann et al. (2010)
- Interest in our work is in seeing how this plays out for a different type of variable – trend significance methods from Leibmann et al. do not apply to Darwin SLPA.

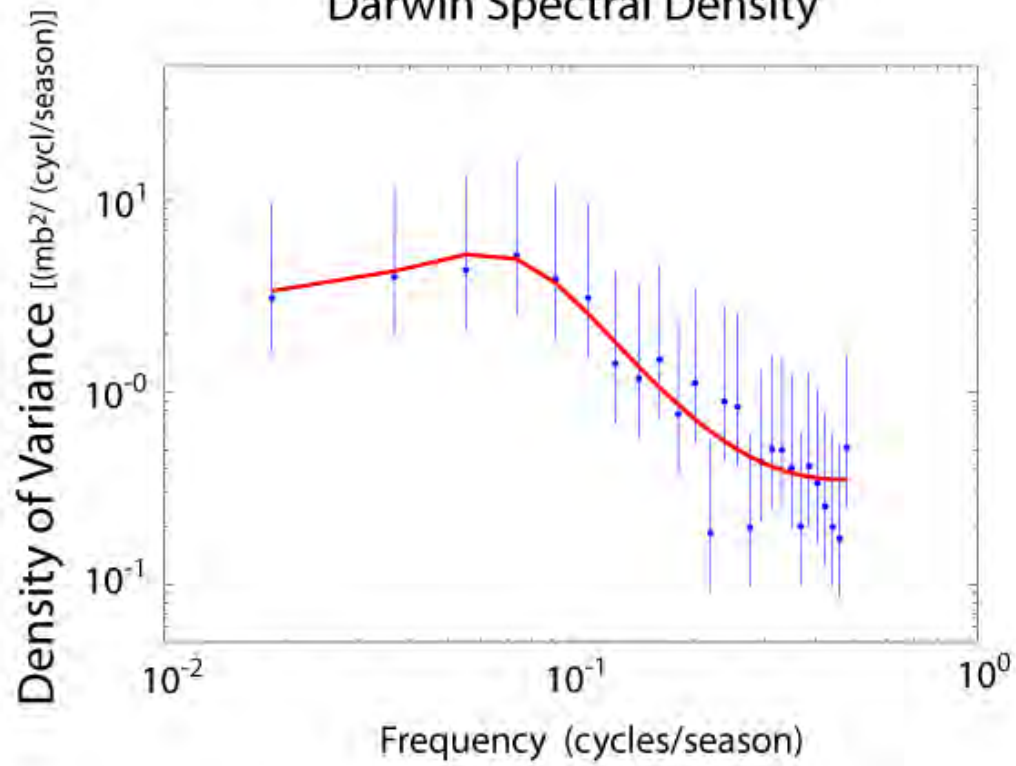


From: Leibmann, et al., BAMS, 2010

## Raw Darwin SLPA Spectral Density Estimate



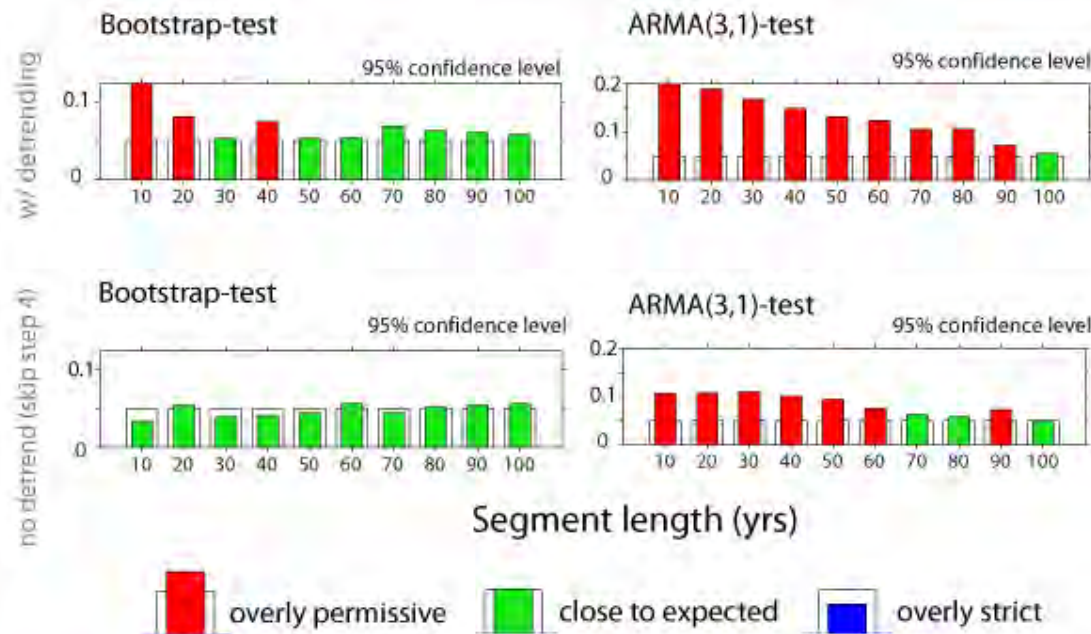
## Darwin Spectral Density



# Simulation experiment results

Simulation experiment with no long-term trend specified

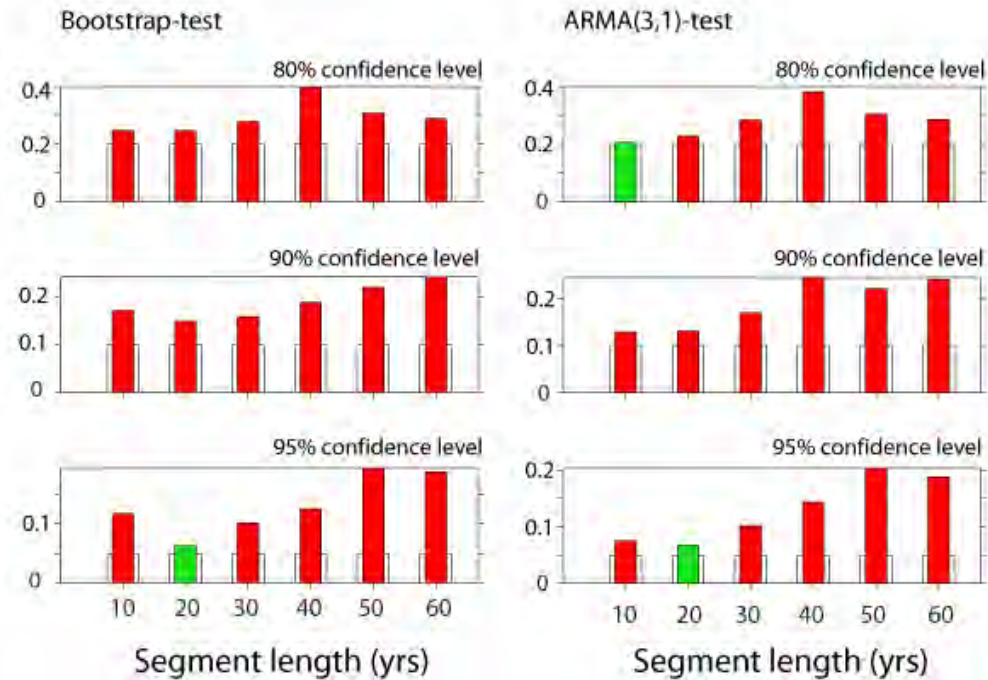
Fraction of Segments with Statistically Significant Trends



# Statistically significant multi-decadal trends in Darwin

## Sliding-window examination of Darwin SLP

Test step 4 based on the full 136yr record



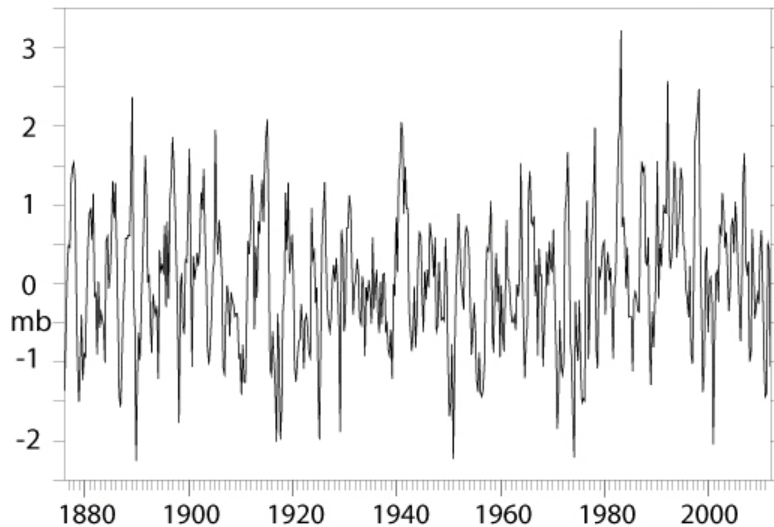
□ expected value if there is no long-term

This inconsistency remains even when the amounts of non-trend variability present are estimated from the full record (Note that there is some reduction in the fraction of shorter segments that yield statistically significant trends, but not much change at the longer time scales considered).



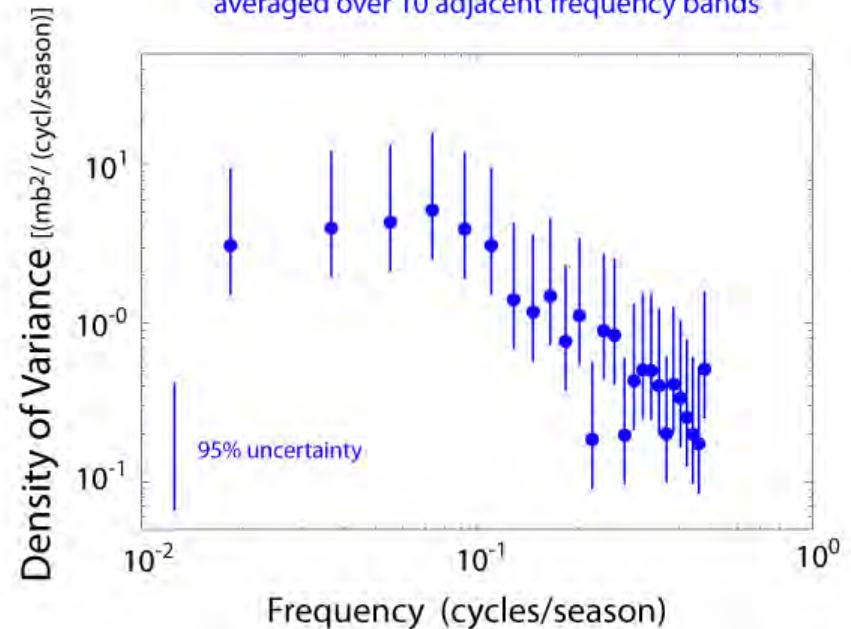
# Darwin SLP Anomaly

Darwin Mean Sea Level Pressure Anomaly



Darwin Spectral Density

averaged over 10 adjacent frequency bands



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