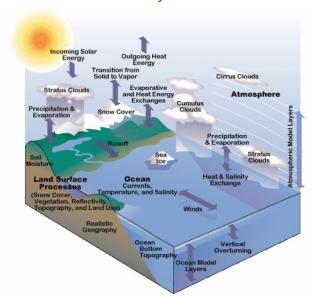
Tree cover variability increases from 2005 to 2100 in Sub-Saharan Africa

Eric Kalosa-Kenyon, Cody Carroll, Amy Kim

University of California, Davis

Introduction: climate system



https://www.ucar.edu/communications/CCSM/overview.html

Introduction: climate system modeling

- ▶ Climate change is driven by anthropogenic carbon forcing
- ▶ IPCC has developed representative carbon forcing trajectories
- Computer simulations are run predicated on particular forcing pathways
- ► These simulations are realizations of gridded meteorological PDEs

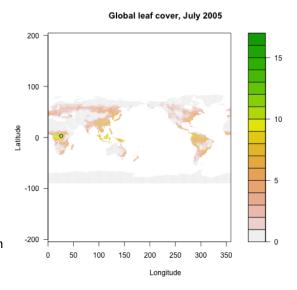


Introduction: climate system modeling

- ► The Community Climate Model System has 5 components and a coupler: atmosphere, sea, land, sea ice, and land ice.
- ▶ We focus on the land system output from a single ensemble under the RCP4.5 experiment.
- ▶ $\theta \in \Theta$, $\{X_t | t \in \mathbb{Z}\}$ where $X_t \sim ARMA_\theta$

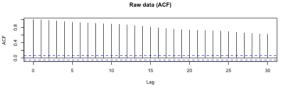
Introduction: leaf area index (LAI)

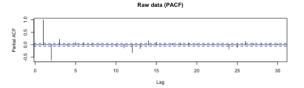
- ► LAI is unitless quantity (leaf area (m^2))/(ground area (m^2))
- "Comparative Physiological Studies on the Growth of Field Crops" Watson 1947 Annals of Botany
- ▶ Bounded below by 0, above by physiological limits
- We interrogate a location in a tropical rainforest



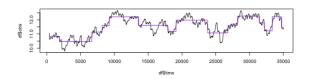
Raw data



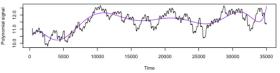




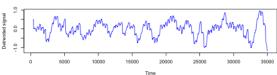
Detrended data





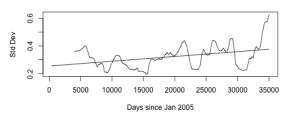


Detrended

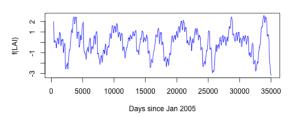


Standardize variance

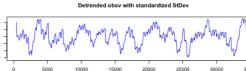
Running standard deviation 10 year window



Detrended obsv with standardized StDev



Standardized variance



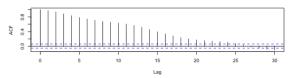
15000

Days since Jan 2005 Detrended data (ACF)

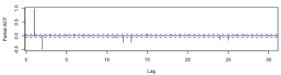
25000

30000

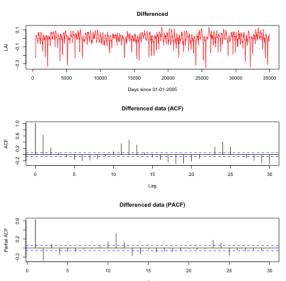
35000



Detrended data (PACF)



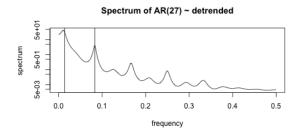
Differenced data



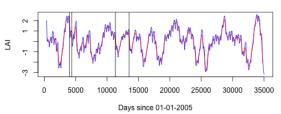
Perhaps we need to

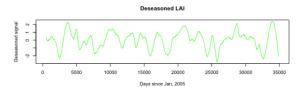
deseason the data before differencing to find stationarity.



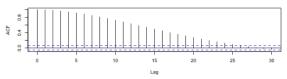


Moving average seasonality (filter.width=1yr)

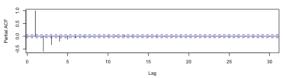


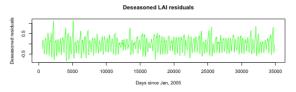


Series na.omit(d.af.deseas)

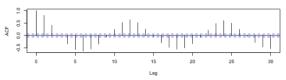


Series na.omit(d.af.deseas)

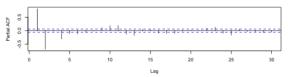


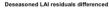


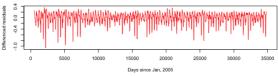




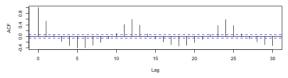
Series na.omit(d.af.deseas.resid)



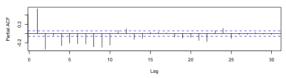




Series na.omit(d.af.deseas.resid.diff)

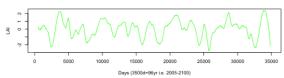


Series na.omit(d.af.deseas.resid.diff)

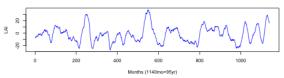


AR(4)

Deseasoned data



Simulated from AR(4) ~ deseasoned



Spectral density of AR(4)

