

**Assignment 10**  
**Data Analytics Colloquium**  
**Changepoint Models with Dr. Patrick Brandt**  
**11/17/22**

**Introduction**

Assignment 10 Question: Review the visualization methods used in presentation.

Meeting Date and Time: 11/17/22 8 pm to 10 pm central time.

Subject: Dr. Brandt demonstrated the Changepoint (CP) models: Statistics and Time Series for policy intervention and change identification.

Problem: Observe some data such as time series and you reach a boarder (time, space, etc.), how do you identify the change and its boundary.

**Models**

Types of CP Models

Model Type 0: Basic time series intervention model / causal inference setup

Model Type 1: Binary segmentation

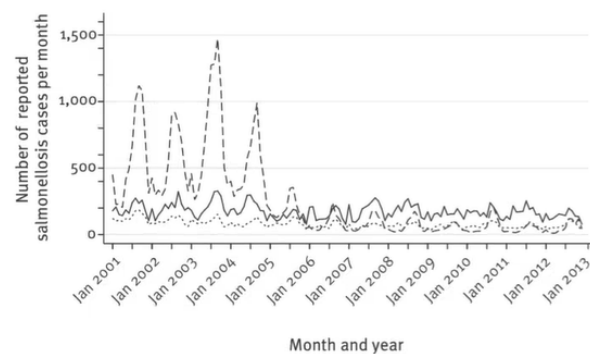
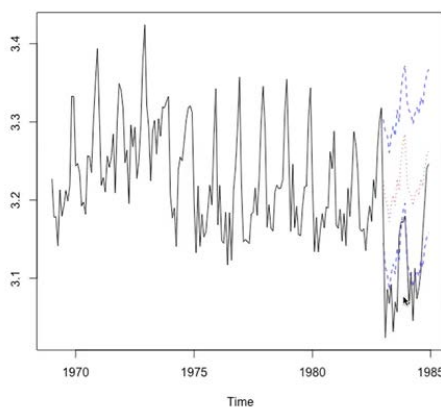
Model Type 2: L1/L0 regularization and lasso

Model Type 3: Bayesian methods

Individual Models

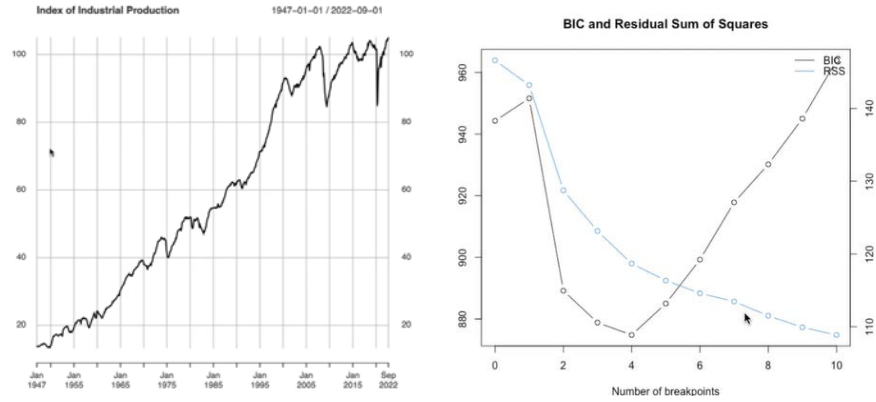
Model Type 0 (standard ARIMA, regression, etc.)

Graphics: Linear time series line graphs (standard and log based), for example:



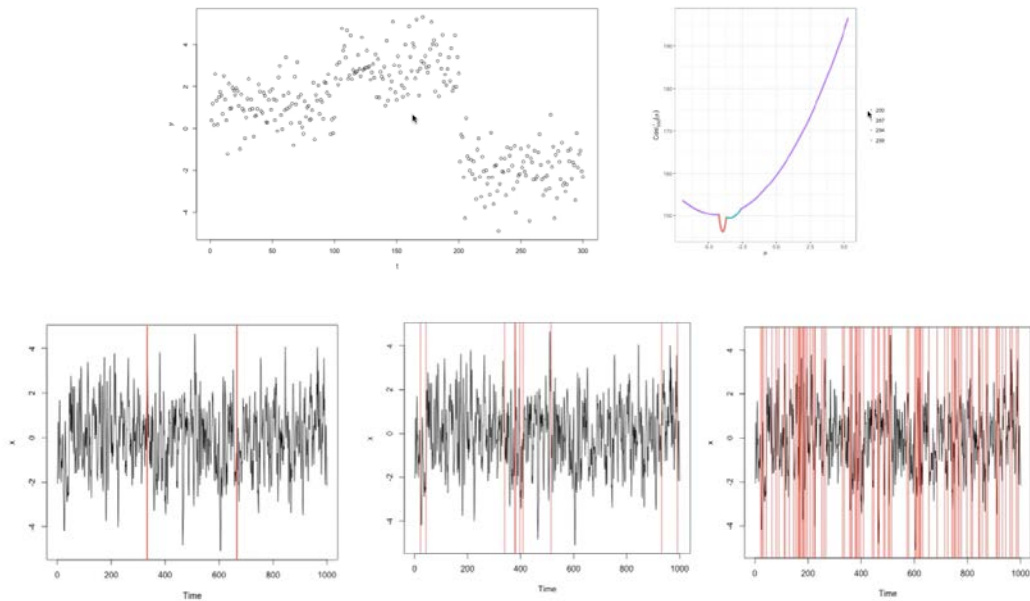
## Model Type 1 (Bai-Perron Model linear programming)

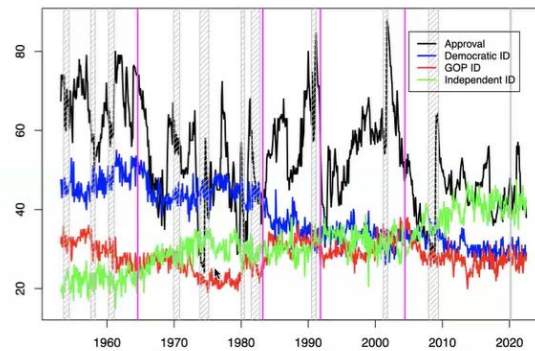
Graphics: Linear time series and comparison line graphs, for example:



## Model Type 2: L1/L0 regularization and lasso (regularizations, fused lasso, BS univariate)

Graphics: Scatter plot, line comparison charts, segmented time series line chart, for example:





Model Type 3: Bayesian methods

[NOT COVERED DURING PRESENTATION]

## Recommended Literature

# References / cites

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