

Title: Reconstruction of time series using pruning via sampling

Problem: For a given set of time series, one has to make a dynamic graph, prune it, and reconstruct the initial time series (according to MSE or another convenient criterion).

Data: Any time series (example in Varenik 2022)

References: Masters Thesis Varenik 2022, Discrete Graph Structure Learning for Forecasting Multiple Time Series 2021

Base solution: implementation of method without pruning loss

Proposed solution: add density loss, i.e. $|\|A\|_1 - p| \rightarrow \min_A$

Novelty: ability to control binary adjacency matrix to prune graphs

$$\min_w \mathbb{E}_{A \sim \text{Ber}(\theta(w))} [L(A, w, X) + L_{\text{prune}}(A, p)]$$

Parametrize A s.t. $A_{ij} \sim \text{Ber}(\theta_{ij}(w))$, where

$\theta_{ij} = f(z_i \| z_j; w)$ - success prob. of Bernoulli distribution,
 $f: \mathbb{R}^{2k} \rightarrow \mathbb{R}$

$z_i = g(X_i; \varphi)$ - feature extracted from i^{th} time series
 $g: \mathbb{R}^{t \times d} \rightarrow \mathbb{R}^k$