

Determining Dynamic Brain Networks from resting-state fMRI data

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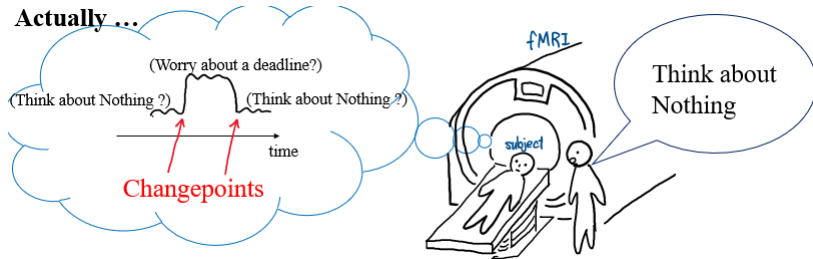
Introduction

Data (rs-fMRI data):

Some subjects have change points in their mean time series.

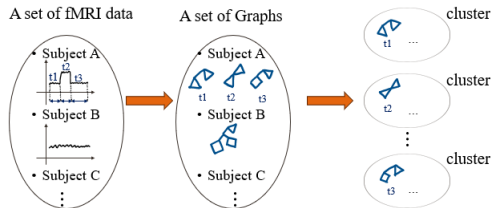
- Aim: Determine dynamic brain networks

Actually ...



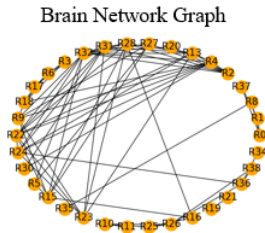
Method

- 1 Produce brain connectivity graphs
 - ▶ Each graph corresponds to a time section segmented by changepoints
 - ▶ For subjects with no change points, only one graph is produced
- 2 Find clusters in the set of graphs
- 3 Compare networks from each cluster



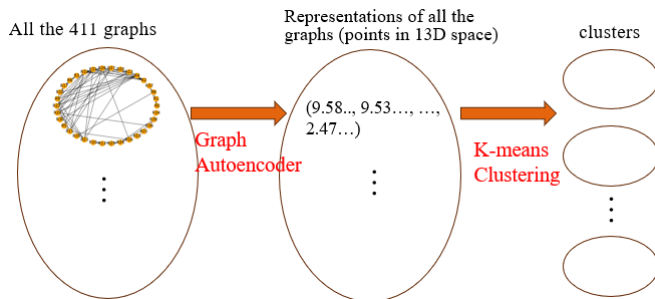
Produce brain networks

- Preprocessing (detrend & fix motion and change shapes to match with template)
- MSDL atlas with 39 regions.



Clustering Analysis

- 1 Represent graphs as points in 13D space using Graph Autoencoder
- 2 Find clusters on this set of points using K-means Clustering



Latent space representation

A: Adjacency Matrix
X: Correlation Matrix



2-layer GCN

$$\tilde{A} ReLU(\tilde{A} X W_0) W_1$$

$$\tilde{A} = D^{-\frac{1}{2}} A D^{-\frac{1}{2}}$$

$$\hat{A} = \text{logistic sigmoid}(\bar{X} \bar{X}^T)$$

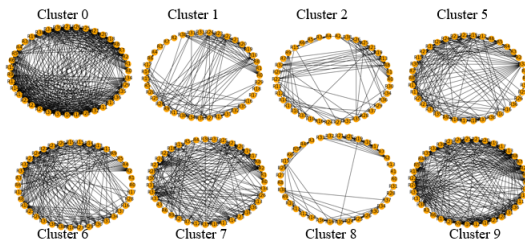
\hat{A} : Reconstruction of A

D: Degree Matrix
W: Weight Matrix

Graph Representation = \sum rows of \bar{X}

Compare Networks

For each point closest to the centroid for each cluster, graphs are inverted.
8 big clusters were found ($K=10$)



- Only 8 (out of 107) subjects with changepoints have their three graphs in the same cluster
- Only 17 subjects with changepoints do not have a change in how dense their graphs are

Details of clusters

Each cluster has a higher proportion of graphs of some type.

	No change points	1 st time segment	2 nd time segment	3 rd time segment	Total
Cluster 0	14	7	12	21	54
Cluster 1	4	6	5	9	24
Cluster 2	8	20	15	18	61
Cluster 3	0	1	1	0	2
Cluster 4	1	1	1	3	6
Cluster 5	14	19	13	10	56
Cluster 6	11	13	13	8	45
Cluster 7	8	14	20	15	57
Cluster 8	12	8	16	14	50
Cluster 9	18	18	11	9	56
Total	90	107	107	107	411

Compare networks with DMN

Clusters 1, 6, 2, 7, and 8 look like the Default Mode Network.
Clusters 0 and 9 do not show the features of the Default Mode Network.

