

Week of 10/30 Deliverables



Red Lemurs

Deliverables

- Lemur library alpha
 - [notebook](#)
- Run Eric's pipeline on fMRI data
 - [Notebook](#), [Literature Scoping](#)
- Fitting AR(1)
 - <https://github.com/NeuroDataDesign/lemur-f17s18/blob/master/docs/vidurkailash/ndd-lemurs-10-29.pdf>

Distance Between EEG Scans [notebook](#)

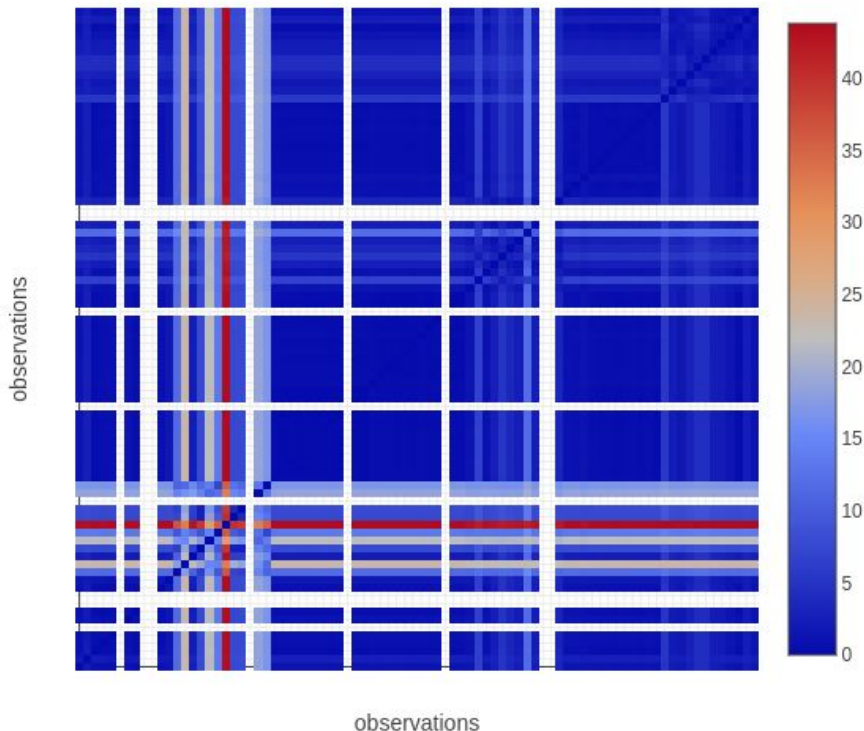
Pairwise Distance Heatmap

Given n observations $X = \{x_1, x_2, \dots, x_n\}$ where each x_i is a $d \times T$ EEG scan, given the distance function $f : X \times X \rightarrow \mathbb{R}, f(x_i, x_j) = \|(x_i x_i^T) - (x_j x_j^T)\|_F$, we define a distance matrix $D \in \mathbb{R}^{n \times n}, D_{ij} = f(x_i, x_j)$.

```
from lemur.distance.functions import FroMetric, ErosMetric
dataset.setDistanceMetric(FroMetric)
dmp = lpl.DistanceMatrixPlotter(dataset)
dmp.plot()
```



HBNB EEG - Distance Matrix



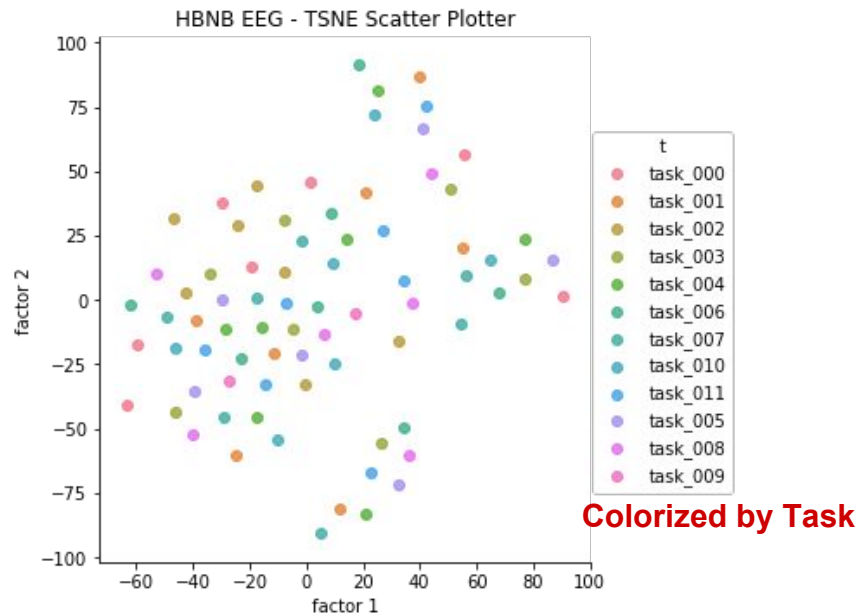
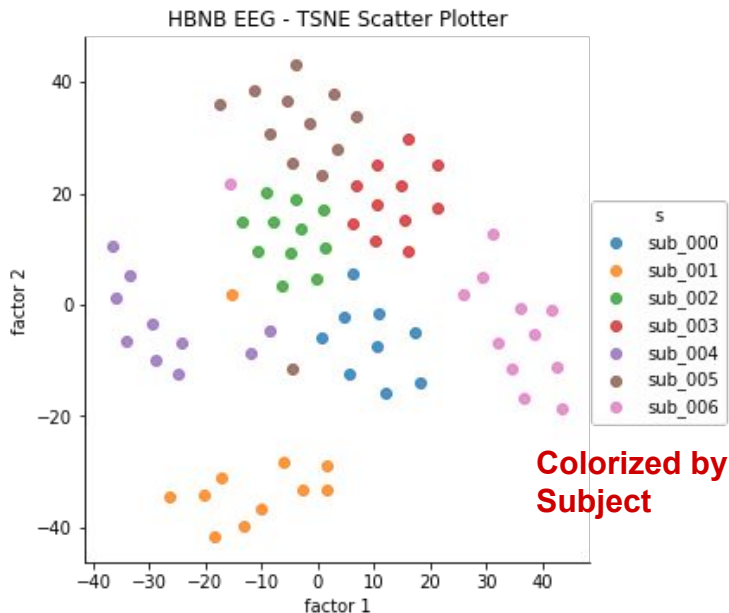
(labels are viewed by hovering over matrix cells)

Visualizing the Pairwise Distances in 2D

[notebook](#)

2 Dimensional TSNE Scatter

Given the (n x n) distance matrix, perform TSNE and plot first colored by subject, then colored by task.

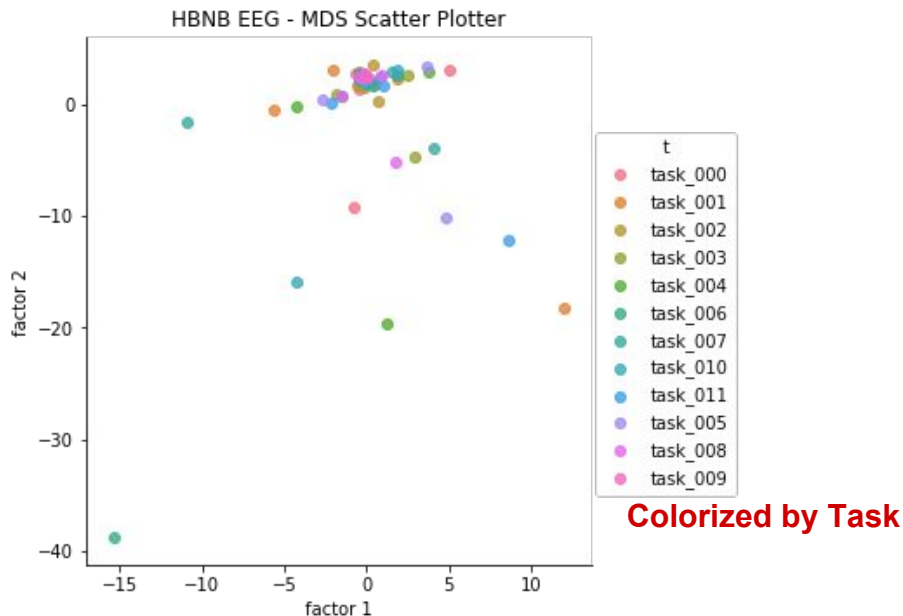
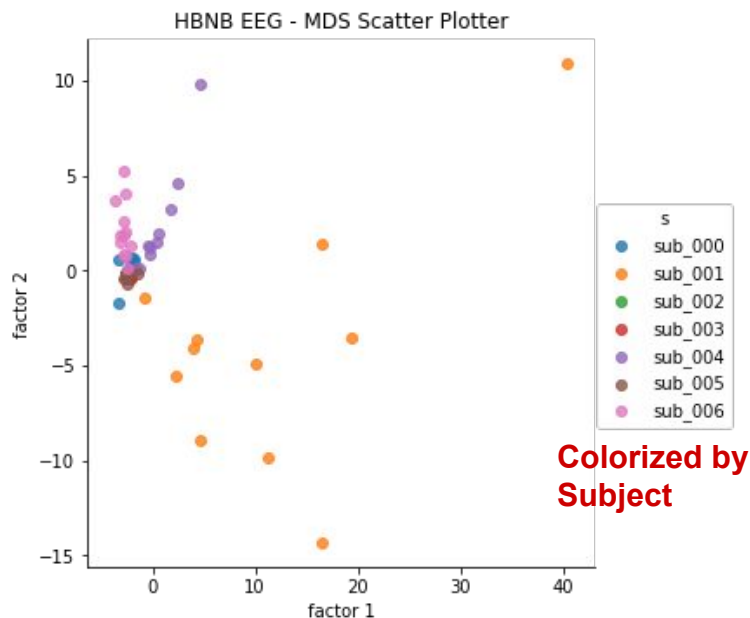


Visualizing the Pairwise Distances in 2D

[notebook](#)

2 Dimensional MDS Scatter

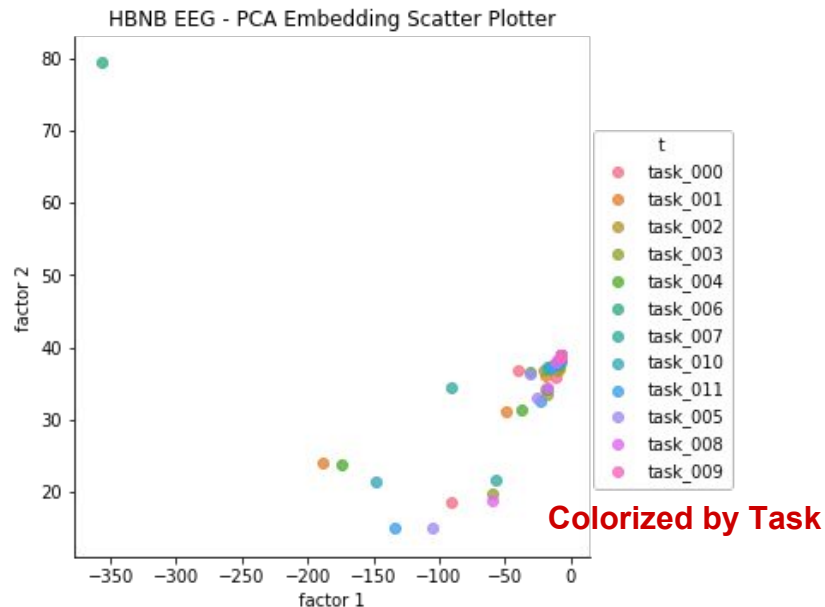
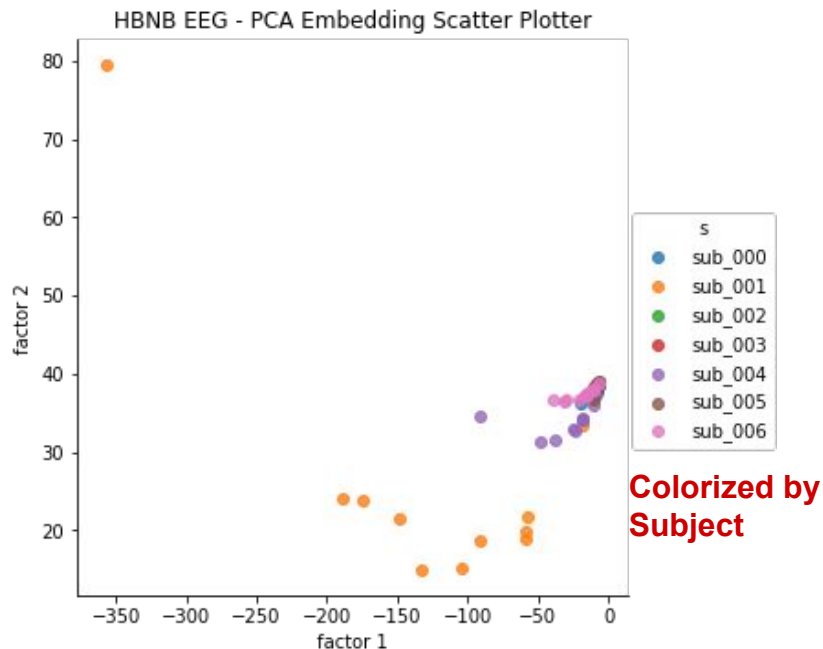
Given the ($n \times n$) distance matrix, perform MDS and plot first colorized by subject, then colorized by task.



Visualizing the Pairwise Distances in 2D

[notebook](#) 2 Dimensional PCA Scatter

Given the $(n \times n)$ distance matrix, we consider each column to be an observation for each of the n data points. We perform PCA on the $(n \times n)$ distance matrix, and project the $(n \times n)$ matrix onto the first two principal components. This gives a 2d representation for each of the n points based on its dissimilarity to other points.



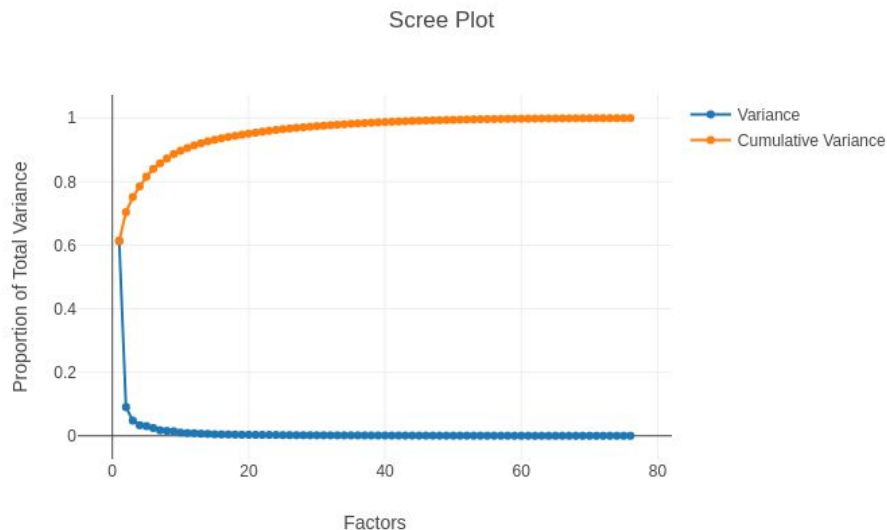
Visualizing Spectral Info of the Pairwise Distance Graph [notebook](#)

Raw Heatmap of the Left Eigenvectors of the Distance Matrix

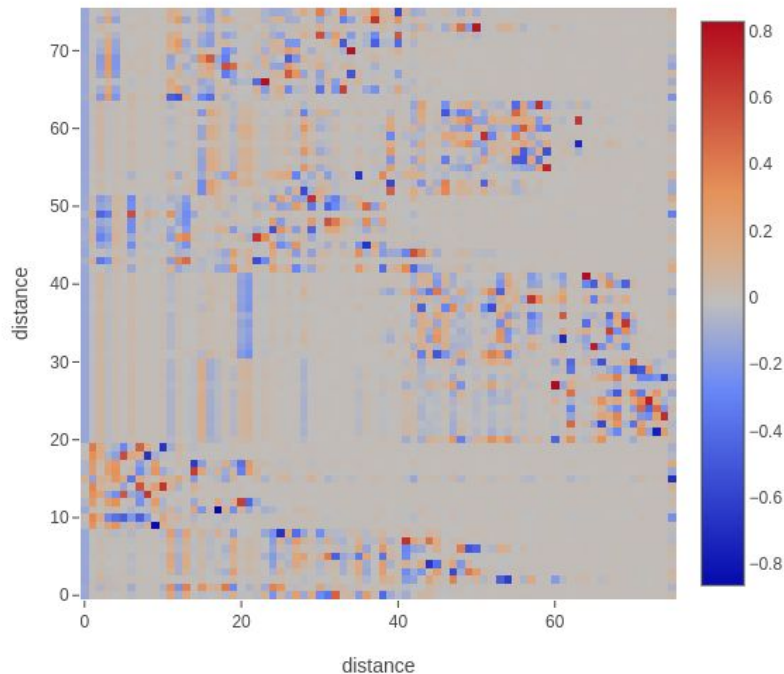
We perform PCA on the $(n \times n)$ distance matrix, then plot the U matrix (the left singular vectors).

Scree Plot

A scree plot of the spectrum of the singular value decomposition of the $(n \times n)$ distance matrix.



Left Eigenvector Matrix

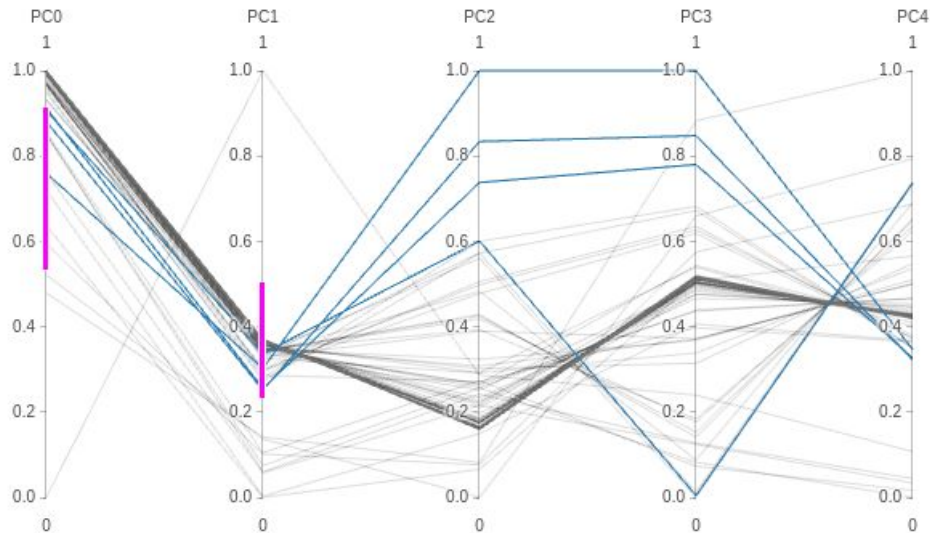


Other Misc. Plots [notebook](#)

Parallel Coordinate Plot

Parallel Coordinate plot where coordinate i is the projection of the $(n \times n)$ distance matrix onto its i 'th singular vector.

You can
filter which
lines are
colored
blue.

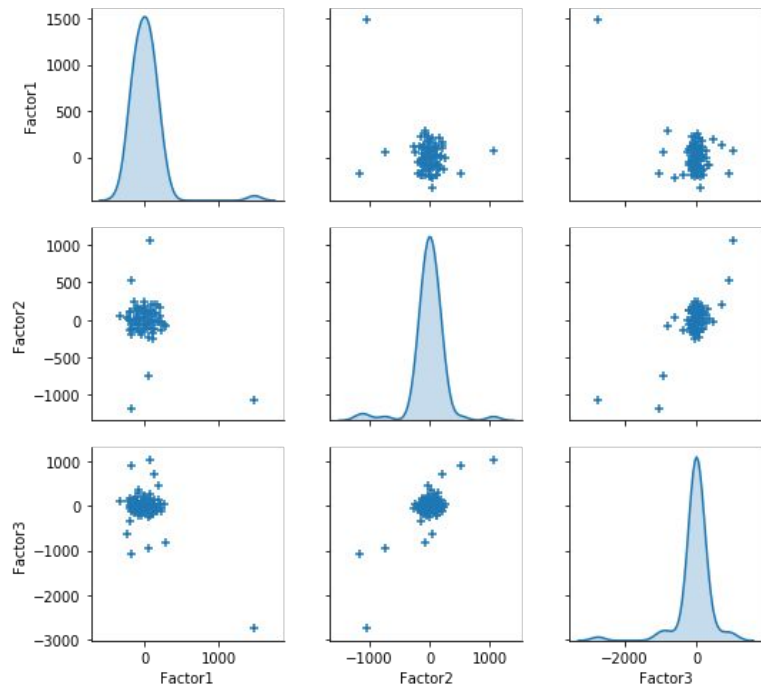


Other Misc. Plots [notebook](#)

Pairs Plot of 3 T SNE dimensions

(T SNE with the precomputed metric set as the $(n \times n)$ distance matrix)

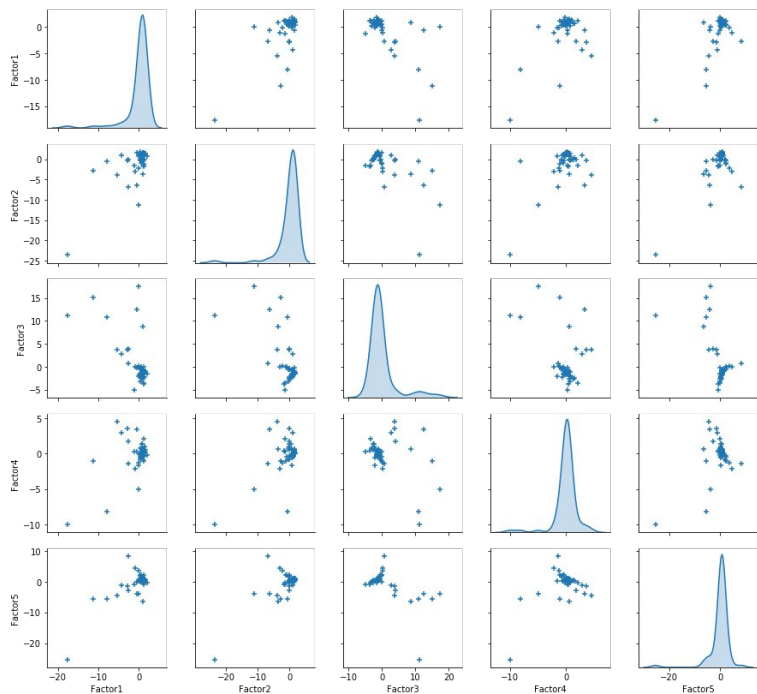
TSNE Pairs Plotter



Pairs Plot of 5 MDS dimensions

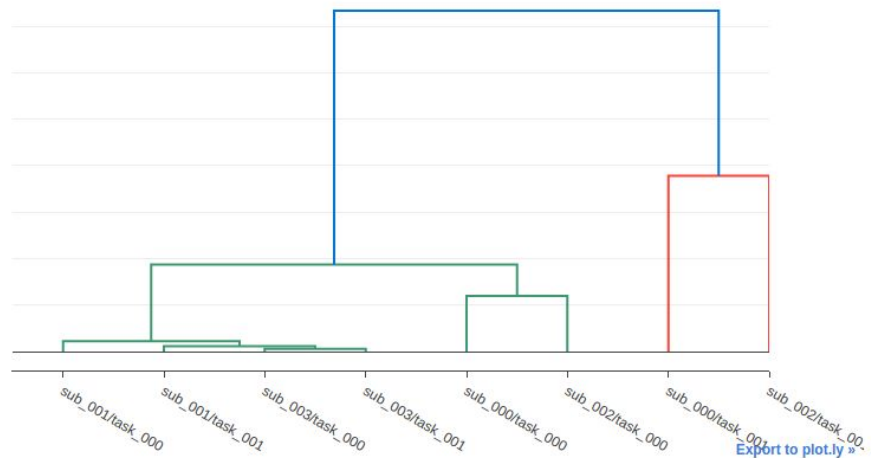
(MDS with the precomputed metric set as the $(n \times n)$ distance matrix)

MDS Pairs Plotter

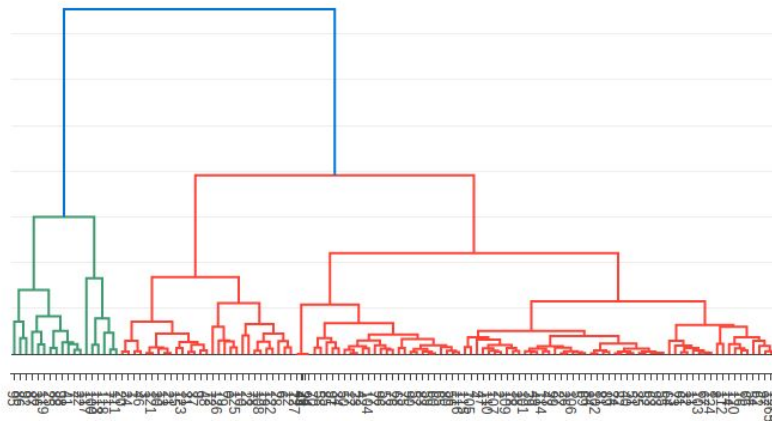


Other Misc. Plots [notebook](#)

4 Subjects 2 Paradigms



Subject NDARAA075AMK

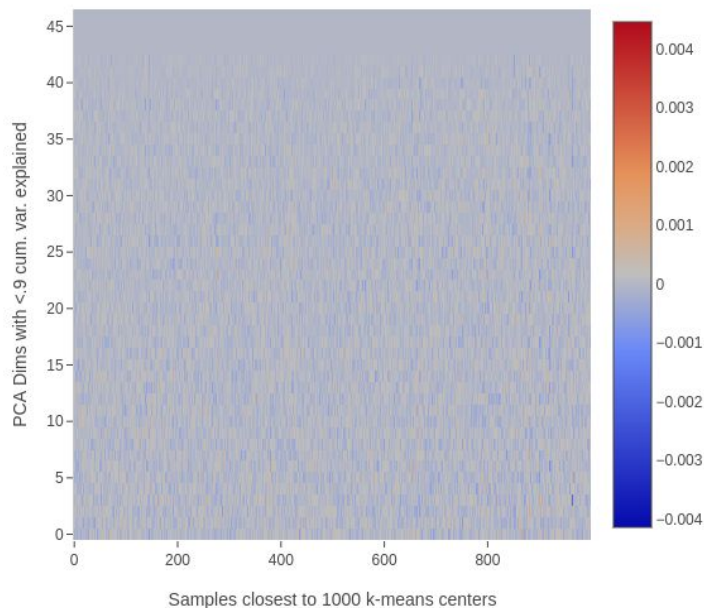


Plotting Single Trials of EEG Data [notebook](#)

Raw Heatmap

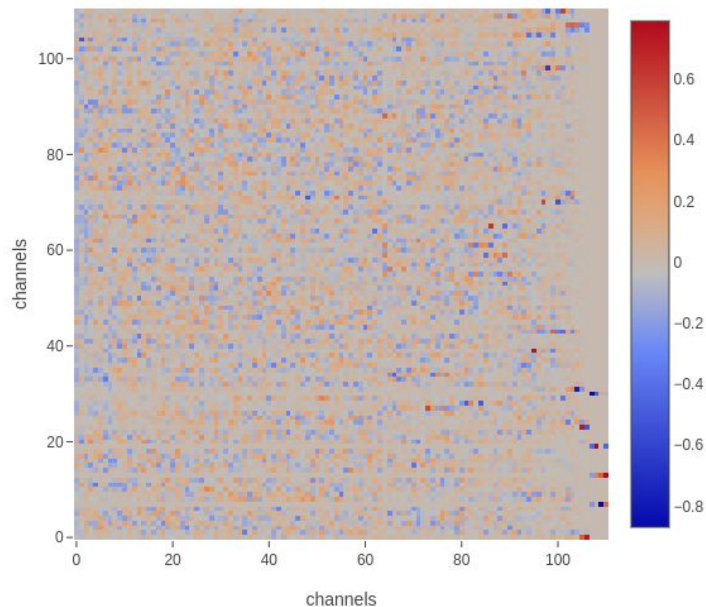
If there are more than 100 dimensions, then we first project the data onto the top k PCs, where k is the number of the PC which makes the cumulative variances explained go over 0.9.

HBNB EEG - sub_000 - task_006 - Heatmap Plot



Raw Eigenvectors Heatmap

HBNB EEG - sub_000 - task_006 - Eigenvector Matrix

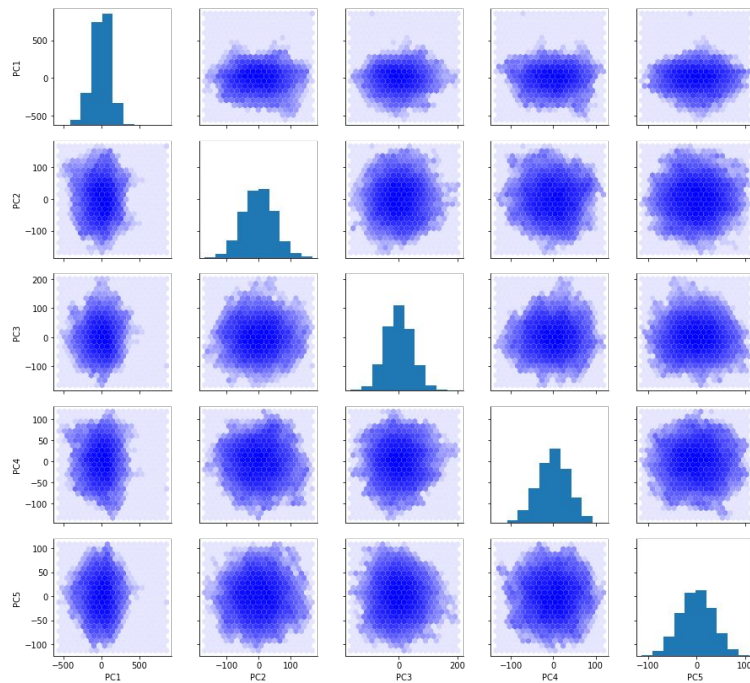


Plotting Single Trials of EEG Data [notebook](#)

Eigenvectors Pairs Plot

Pairs plot of data points projected onto the first 5 PCs. If the number of points is > 1000, we use hex binned plots instead of raw scatter plots. Hex bins are log scale colorized.

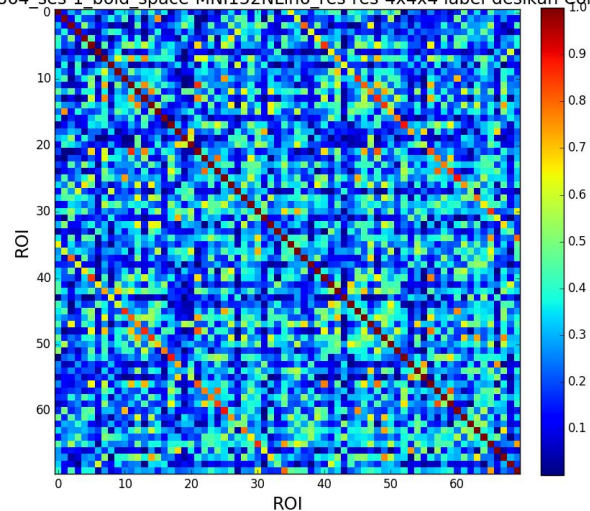
HBNE EEG - sub_000 - task_006 - Eigenvectors Pairs Plot



Run Eric's pipeline on fMRI data [Notebook](#)

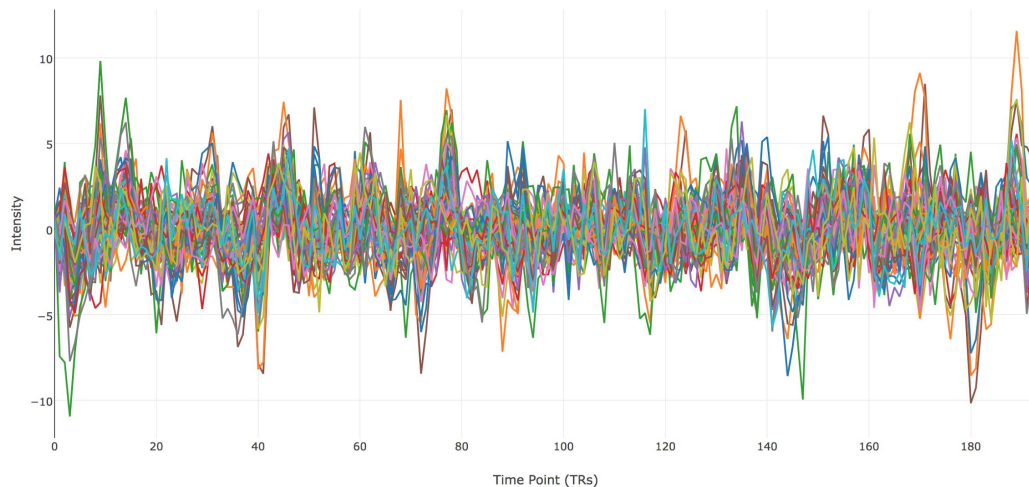
Correlation Matrix

sub-0025864_ses-1_bold_space-MNI152NLin6_res-res-4x4x4_label-desikan Correlation Matrix



Time Series Plot

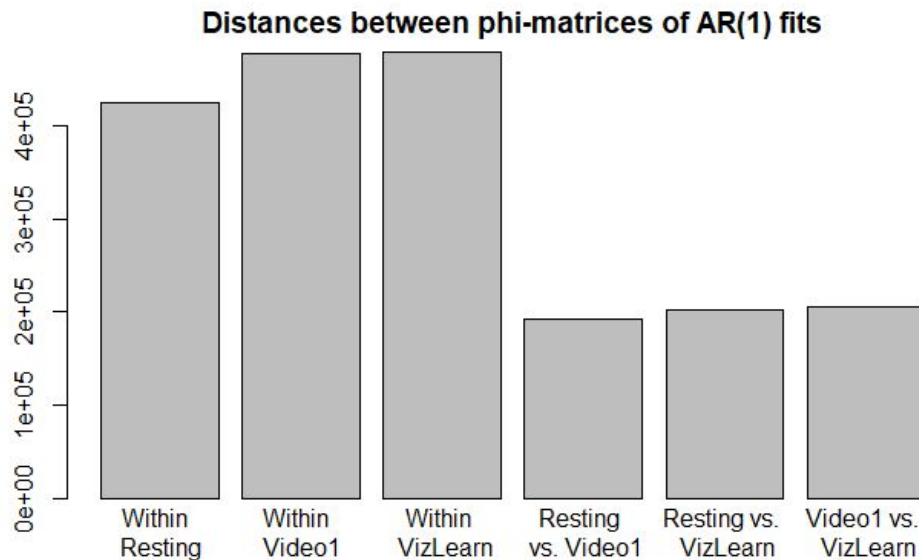
sub-0025864_ses-1_bold_space-MNI152NLin6_res-res-4x4x4_label-desikan ROI Timeseries



[Export to plot.ly »](#)

AR(1) Fitting

AR(1) fitting for 15 time series.
Within each paradigm - calculate norm of pairwise distance matrices and then averaged them. Between each paradigm - average all matrices for each paradigm and then calculate pairwise distances. Distance is much higher for within than between.



Sprint 1 Progress

- Scope problems from literature
 - EEG Biomarkers
 - fMRI Biomarkers (connectivity)
 - Analysis of survey data (p-factor)
- Lemur Alpha Library
 - Need more modality specific plots for single data point to single plot (spatial + temporal)
 - Flattened EEG Heatmap
 - Graph of fMRI connectivity between ROIs
 - Iterate on aggregate plots, add Energy Distance and AR as a metric.
- Lemur Demo Notebook
 - Need to run on fMRI data also, run on larger datasets (15+ EEG subjects)
- Uniform plotting aesthetic & API
 - API examples in demo notebook, all plotly except 1-2 plots which will be switched over.