

# Propagating Densities of Spontaneous Activity in Cortical Slices

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## Slow Oscillations (SO) as The Default Activity Pattern of the Cerebral Cortex [1]

### Phenomenology

- ▶ Multiscale Slow Oscillations ( $\leq 1\text{Hz}$ ):
  - ▷ from the neuronal level, to the whole brain (slow waves), through the **local network level**.
- ▶ Emergent activity under functional disconnection:
  - ▷ NREM sleep, deep anaesthesia or **cortical slices**

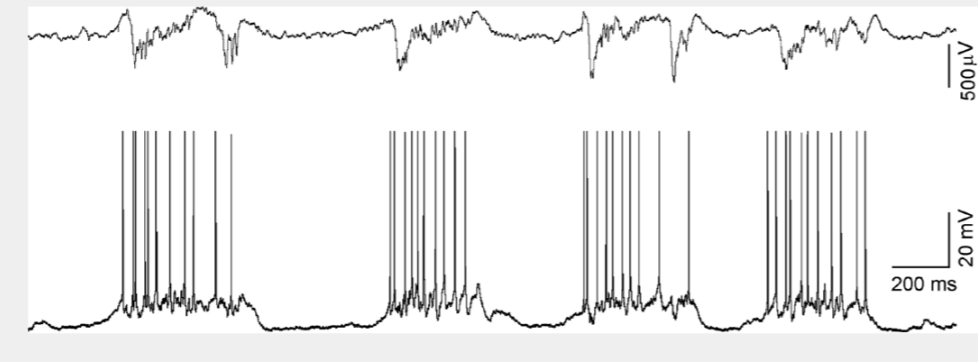


Figure 1: Simultaneous LFP (top) and intracellular (bottom) recordings from the auditory cortex of the anaesthetized rat, exhibiting slow oscillations [2]

### Key Dynamical Features

- ▶ Relaxation-oscillator behaviour:
  - ▷ Intrinsic fluctuations between two alternating metastable attractors: **UP and DOWN states**.
- ▶ Spatio-temporal propagation:
  - ▷ The travelling **UP/DOWN wavefront** reveals properties of the underlying network.

→ **SO is a promising paradigm to study the cortical function and the emergence of consciousness.**

### Advantages of the SO Cortical State

- ▶ Low Connectivity: resilience to perturbances.
- ▶ Facilitation of the transition towards more connected, **awake-like states (AS)**.
- ▶ UP States: Model of circuit attractor implementing computation and acting as a window into consciousness.

## Motivation

- ▶ Can we detect other network states emerging from the SO regime?
- ▶ Candidates:
  - ▷ Nested substates within the SO regime (is there only one single type of UP state?)
  - ▷ States which emerge when the UP/DOWN regime ebbs away.

## Experimental Model and Cortical Slice Recordings

### Extracellular recordings in coronal cortical slices of the ferret's primary visual cortex

#### From SO to an Awake-Like State (AS) [3]

##### Pharmacological Modulations

- ▶ addition of Carbachol (0.5  $\mu\text{M}$ ) + Norepinephrine (50  $\mu\text{M}$ )
- ▶ reduction of extracellular Calcium (to 0.8-0.9 mM)

→ Experimental model to explore the transitions from the SO state towards an awake-like, largely asynchronous state: emulating the transition from unconsciousness to consciousness.

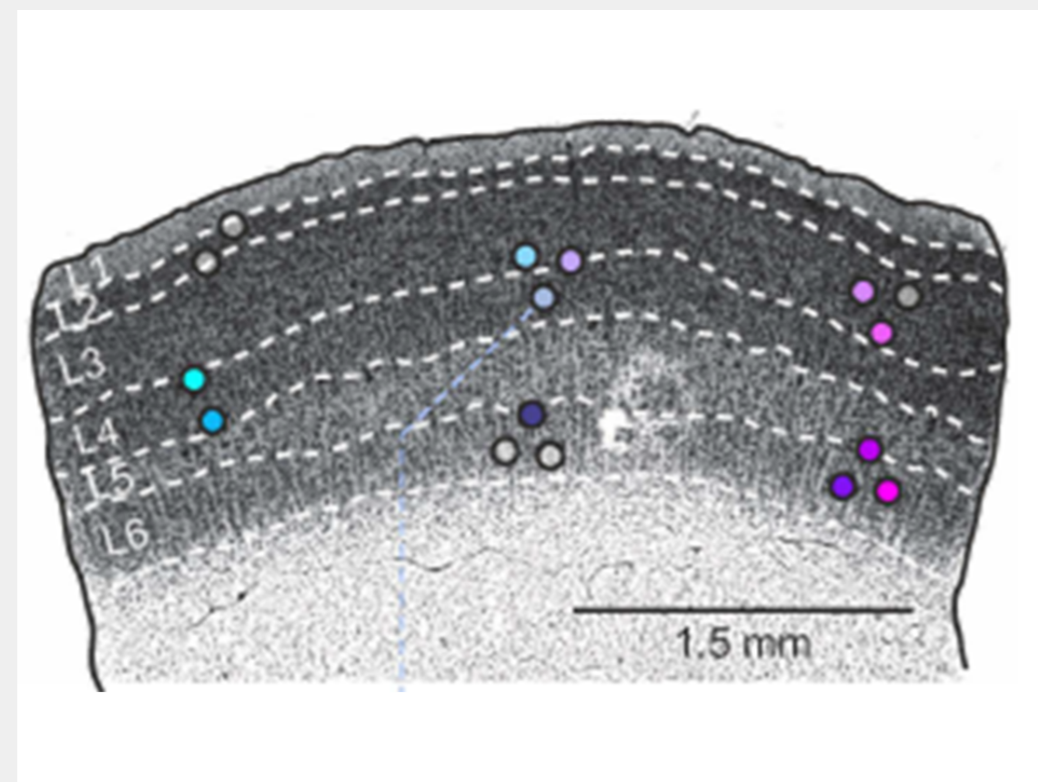


Figure 2: Nissl-stained ferret's V1 cortical slice depicting cortical layers and the location of the multi-electrode array. Electrodes will ideally lie on different layers (supra- and infra-granular), across different cortical columns [4].

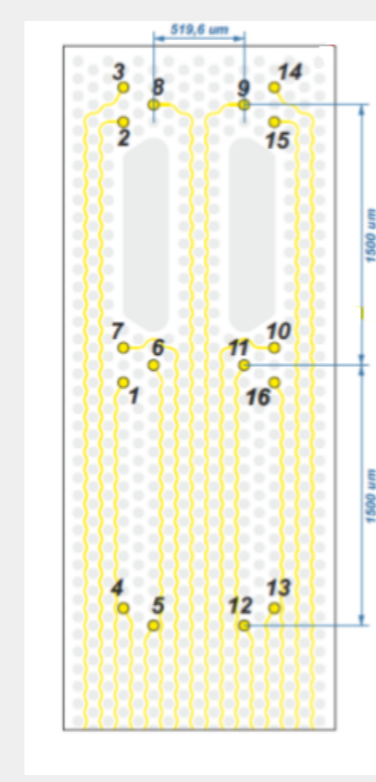


Figure 3: 16-channel flexible multi-electrode array used for the recordings [5].

### LFP and MUA

Extracellular Recordings are usually decomposed into Local Field Potentials (LFP) and Multi-Unit Activity (MUA):

- ▶ LFP results from afferent neuronal activity (e.g., from the summation of EPSP), as captured by the low-frequency band ( $< 200\text{Hz}$ ) of the extracellular recordings.
- ▶ Only units in the vicinity of the electrode contribute to the MUA (i.e., efferent activity), represented in the high frequencies of the recording.

### Estimating the MUA

Theoretical motivation: high-frequency spectral components of the population firing rate are asymptotically proportional to the individual firing rates of the neurons involved [6].

→ The MUA may be estimated as the relative power change of the high frequencies (200-1500 Hz) of the extracellular recordings [7].

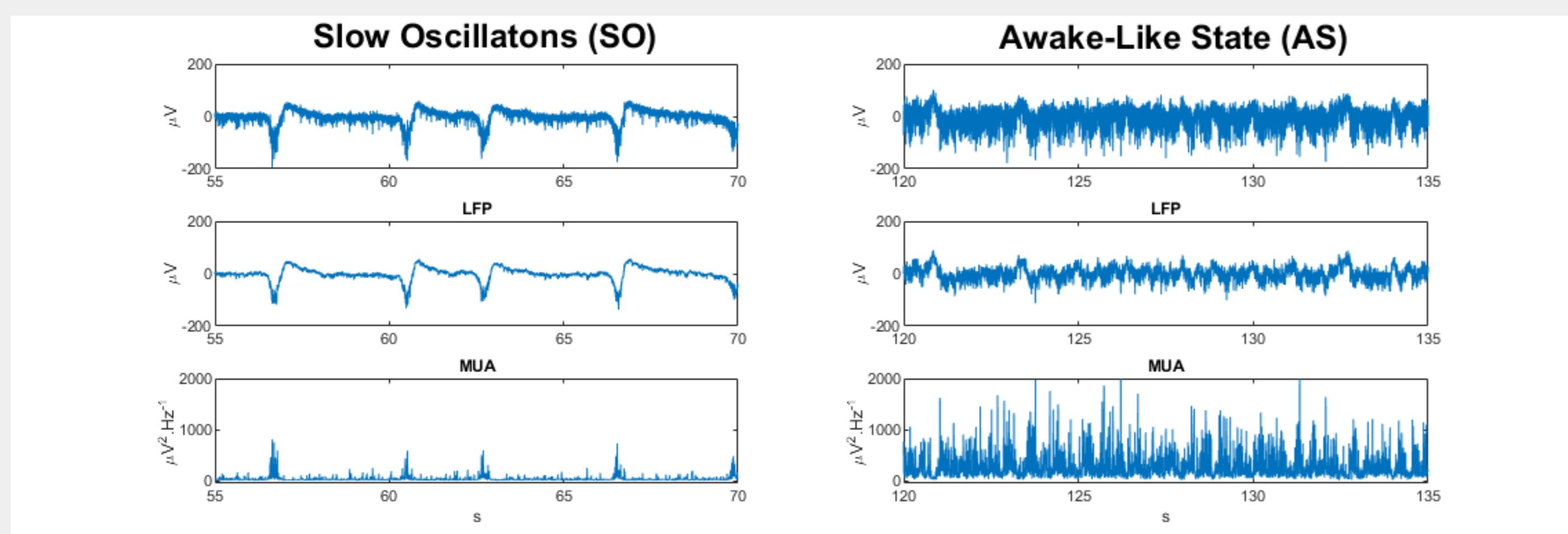


Figure 4: Signals obtained from a sample extracellular recording of an infra-granular electrode in the same cortical slice. Left: during the SO regime. Right: during the Awake-Like (AS). Note the change of magnitude order over the MUA signals.

## Measuring the Evolution of Locally Estimated Densities

Neuronal Network State  $\equiv$  MUA's Probability Density.  
(Working Definition for Network State)

→ When estimated from different electrode groups, with varying time baselines, densities reflect different spatial and temporal scales.

**Kolmogorov-Smirnov time-series (KS<sub>T</sub>s).** For a set of channels  $C = \{c_1, \dots, c_p\}$ , consider  $f_T^C$ , the estimated probability density of the values taken by the signals  $X_T^c$ ,  $1 \leq i \leq p$ , altogether, over a period  $T$  of length  $h$ .

- ▶ Temporal evolution of these densities to be measured by their relative change against a static density  $f_{T_0}^C$  estimated over a baseline period  $T_0$ .
- ▶ The time-series  $K_T^C$  is defined in a suitable sub-sampling set, as the KS statistic between the evolving and the static densities.

$$K_T^C := d_{KS}(f_T^C, f_{T_0}^C),$$

where  $T_T$  is an interval of length  $h$ , containing  $\tau$ .

→ Acts as a spatio-temporal filter that is distribution-free.

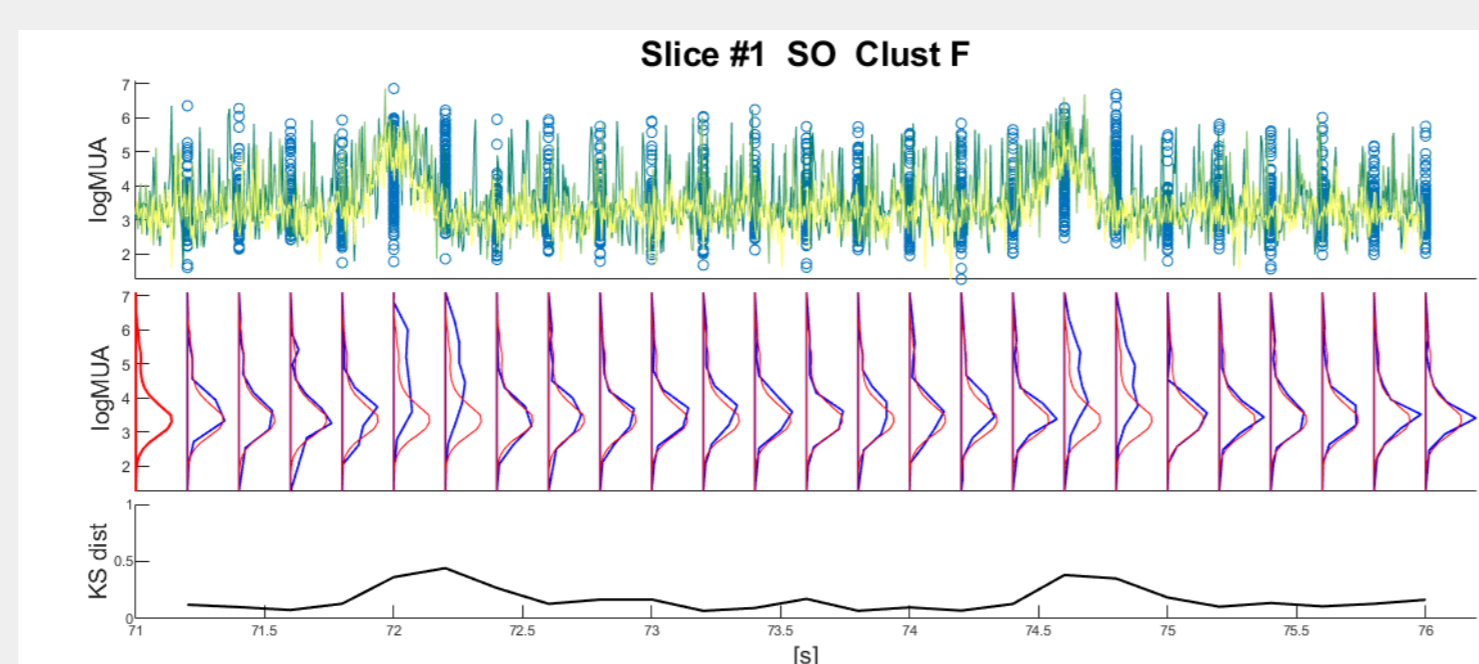


Figure 5: Example of KS-timeseries computation for 3 channels from the same node during SO. Top: log(MUA) signals of distinct channels superposed (green hues); values taken during the sample period (blue dots) Middle: estimated densities (blue) superposed to the baseline static density (red). Bottom: KS-timeseries.

## Spatial Clustering of Multi-Unit Activity Densities

### Static Densities

Density estimation during long baseline periods ( $\geq 300$  s) offers a static spatial image of the network.

- ▶ SO's static densities are a mixture of DOWN- and UP-states' densities.
- ▶ Whilst SO are dominated by DOWNs' subdensities, very similar across channels, UPs exhibit a richer variety, which depends on their cortical location.
- ▶ Differences between groups of electrodes on different layers tend to increase in the AS condition, namely for IG-layer's signals.
- ▶ Interestingly, UP-densities' variability prefigures AS's.

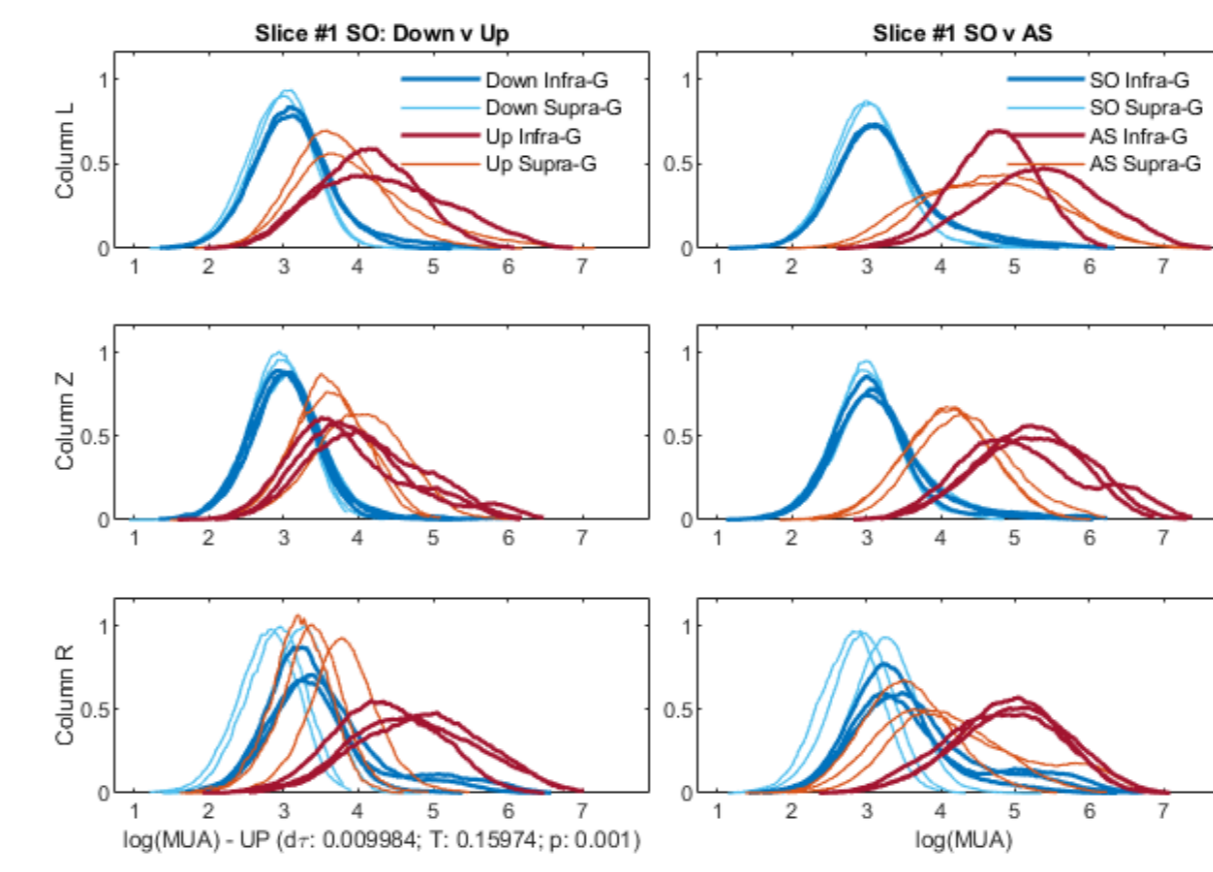


Figure 6: MUA's static densities comparison across electrode groups (by column and layer position). Left: within SO for two states (Down and Up). Right: for two distinct regimes (SO and AS)

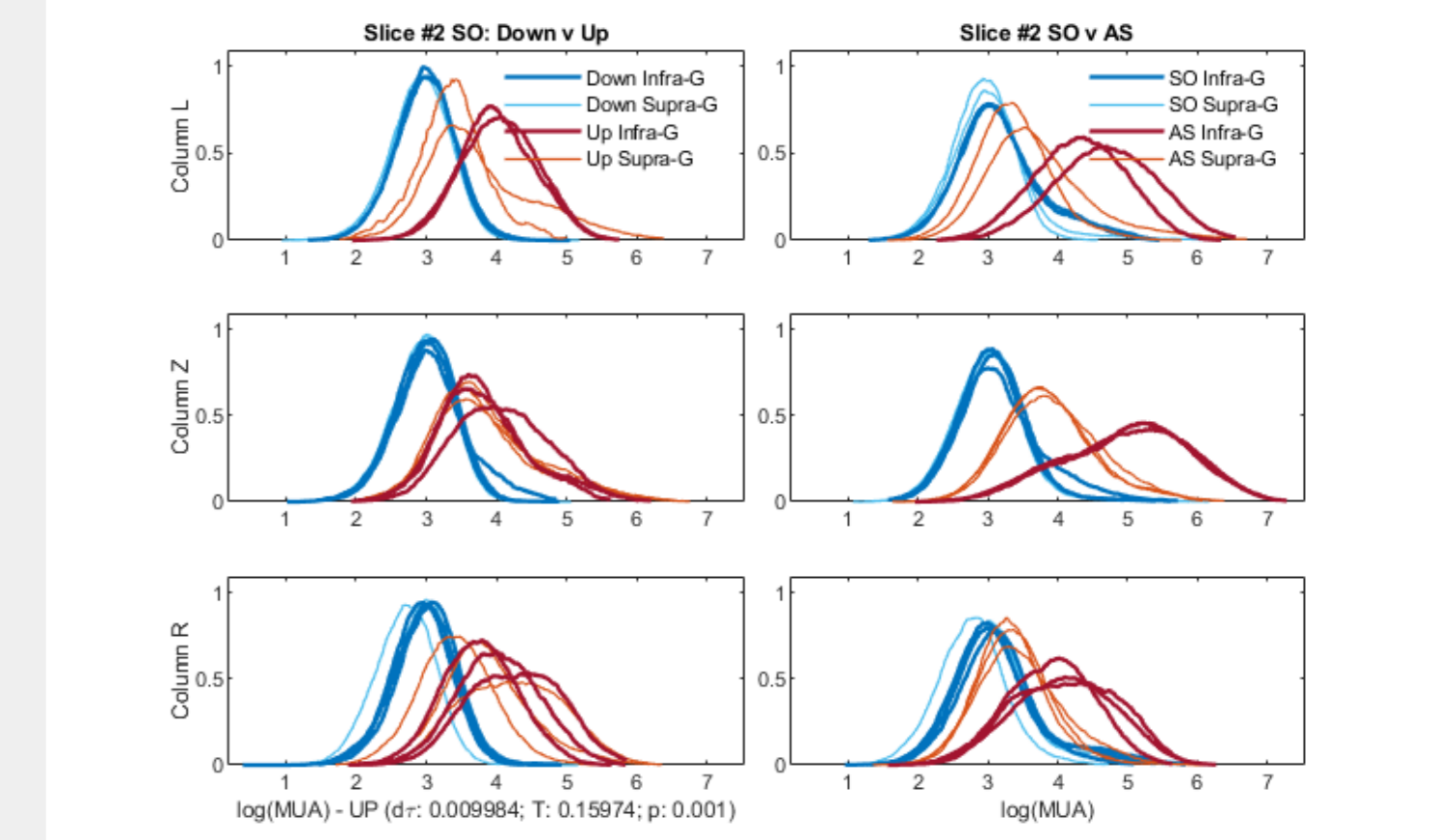


Figure 7: Same as fig 6 for a different slice. Inasmuch as the position of the MEA may slightly vary from one preparation to another, so the actual layer-relative location of the electrodes cannot be ascertained a priori.

### Densities' Spatial Clustering

Electrode grouping: hierarchical cluster analysis of the MUA densities over a long baseline period.

- ▶ Clusters are farer apart in the AS condition than in the SO's.
- ▶ AS's clusters tend to be organised longitudinally, according to alleged cortical layers.
- ▶ UP's clusters lie on a deformation path between SO's and AS's.

→ The clustering of high-activity states (UPs and AS) seems to reflect the laminar structure of the slice.  
→ UP-states activity anticipates the awake-like state.

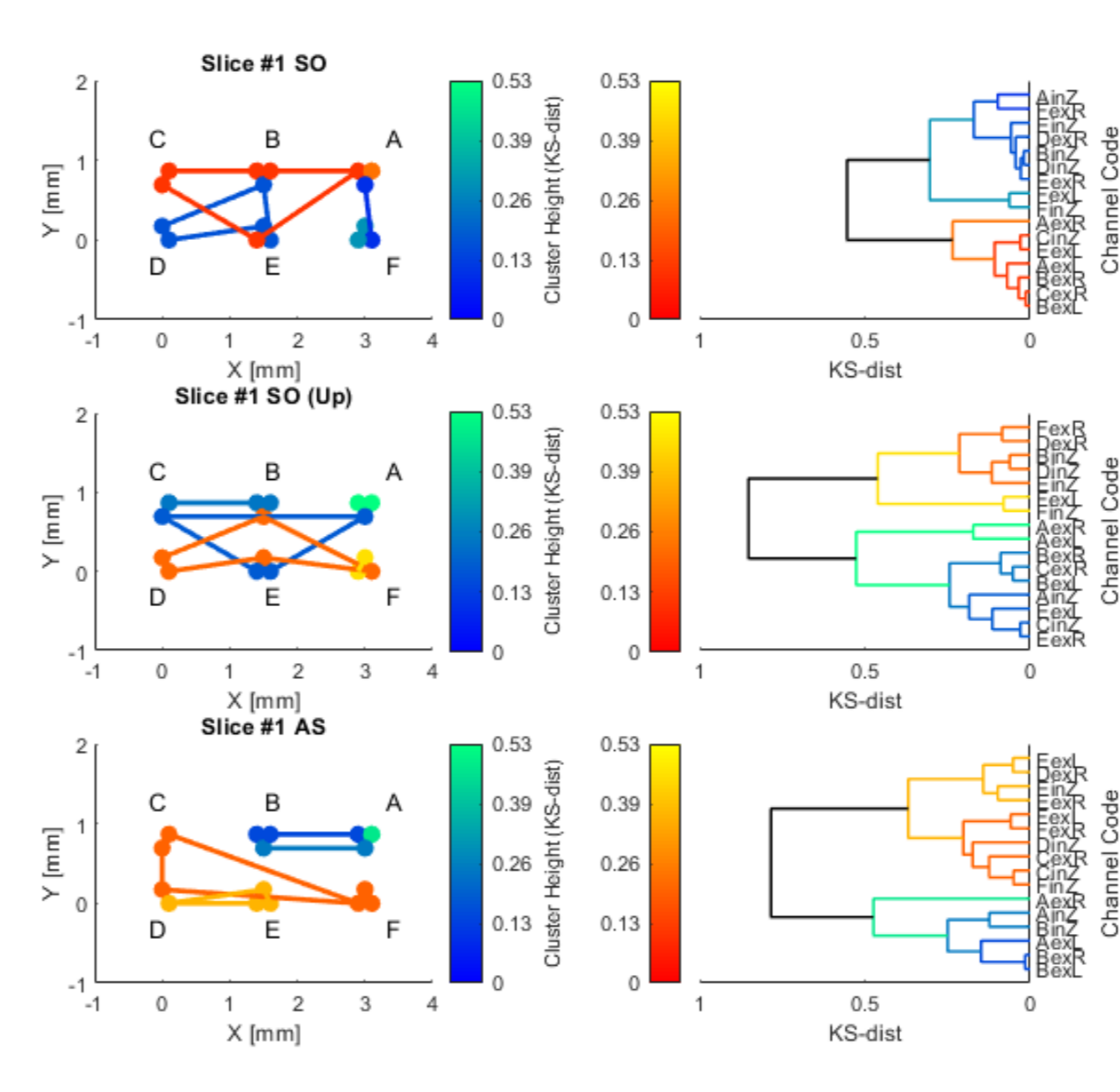


Figure 8: Hierarchical clustering of static densities' similarity. Comparison for individual slices under different regimes (top: SO (overall), middle: SO (Up), bottom: AS). Groups of similar static densities are outlined.

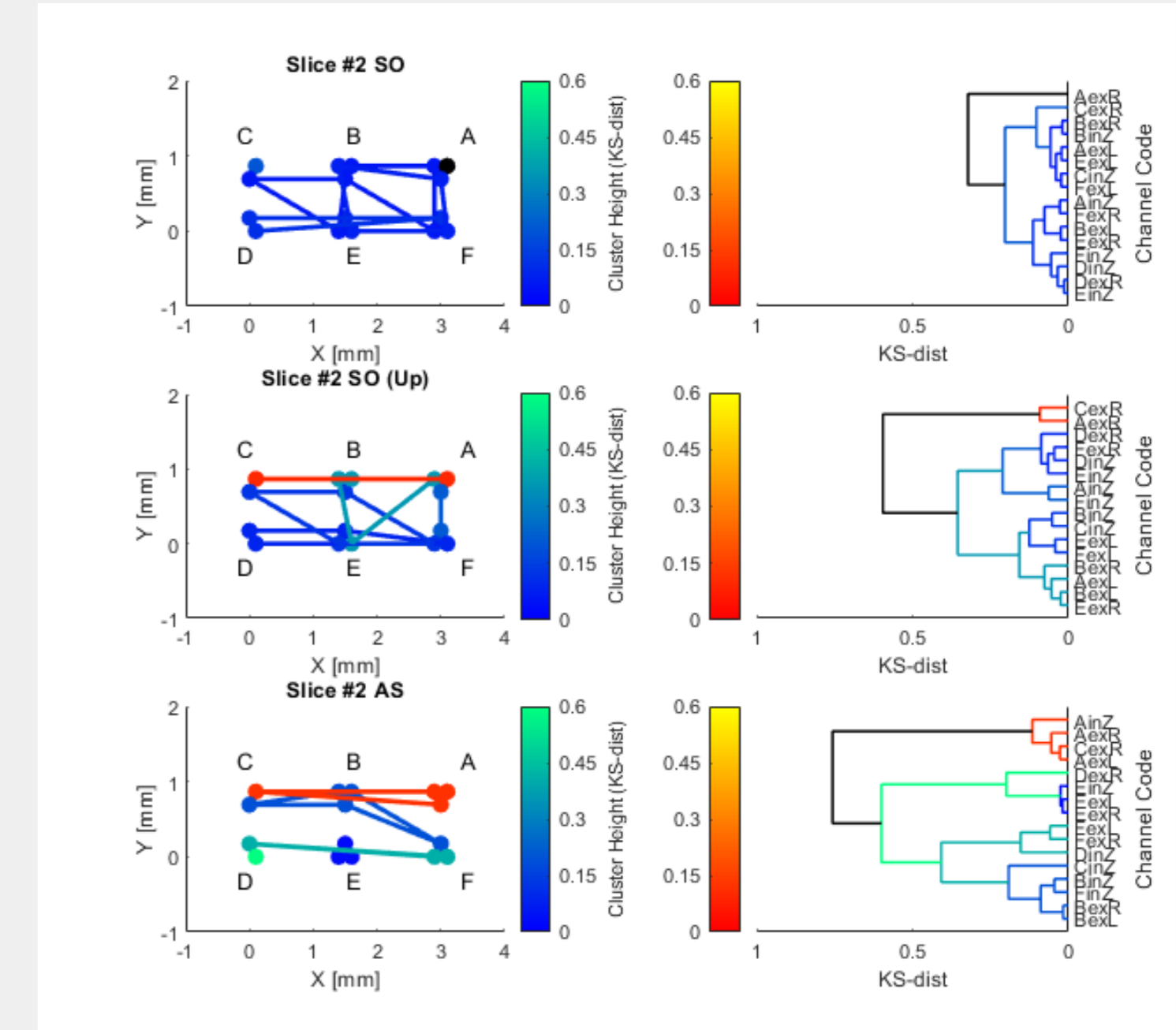


Figure 9: Same as fig 8 for a different slice. Right: Dendrograms exhibiting clusters distances. Left: Schematic projection of the dendrograms onto MEA. Letters refer to nodes of electrodes in the MEA.

## A Glimpse on the Spatio-Temporal Propagation of MUA Densities

Unified analysis of the MUA's spatio-temporal evolution under different dynamical regimes: in absence of wave-front (AS) and poorly stationary signals (SO).

### SO: a whimsical propagating wave

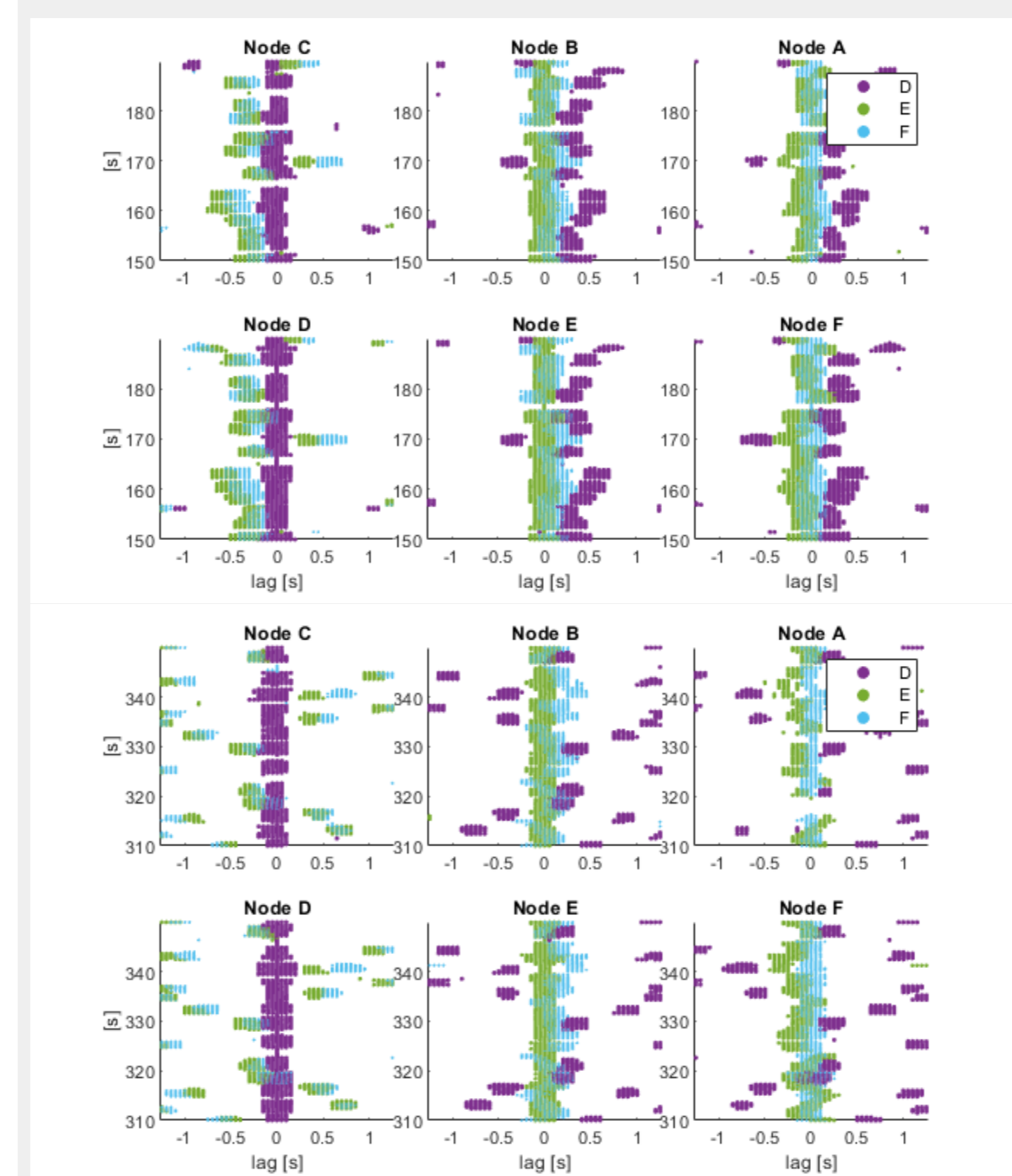


Figure 10: Merged cross-correlograms of KS<sub>T</sub>s during SO, at two different epochs from the same slice as (figs 6&8). Colours represent target nodes D, E and F.

### AS: ephemeral coordinated activity arises amid asynchrony



Figure 11: Merged cross-correlograms of KS<sub>T</sub>s during AS for the same slice as fig 10, for two sets of target nodes for the same epoch.

- ▶ All the nodes exhibit sustained SO, but not all do engage equally in the UP-front propagation, nor in the same order (fig 10).
- ▶ A general regime of asynchrony prevails during the AS, were not for the occurrence of some UP-like bursts of activity (fig 11).
- ▶ Columnar connectivity (from infra- to supra-granular) seems still favoured in AS.
- ▶ Some evidences of slower long-range connectivity of integrated activity during the AS.

## References

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