

Investigating Φ

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2017-07-28

Overview

- Integrated Information Φ
- 2 investigations:
 - Air vs isoflurane Φ
 - Φ vs Φ^*

Axioms of Integrated Information Theory

- Existence
- Composition
- ***Information***: out of all the experiences we can **possibly** have at any time (uncertainty), at any time we only experience **one** (reduction in uncertainty)
- ***Integration***: we cannot separate an experience into parts (binding problem: we don't see red and a ball; we see a red ball)
- Exclusion

Consciousness and Integration/Information

- Loss of consciousness (e.g. NREM sleep, anaesthesia) has been associated with loss of information or integration
 - e.g. stereotyped responses to stimuli
 - e.g. reduced effective connectivity, feedback
- But what about Φ ?
 - IIT: Φ is consciousness (there's a bit more to Φ)
 - Loss of consciousness \leftrightarrow loss of Φ

What is Integrated Information Φ ?

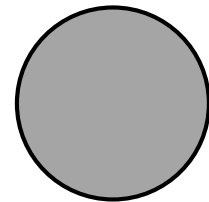
Integrated O

- O = exists only when considering the whole
- O = reduction due to splitting

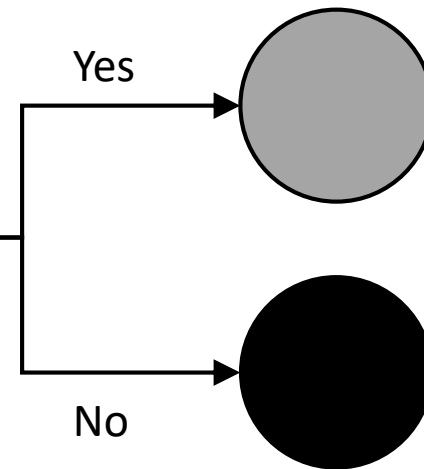
Information I

- I = reduction in uncertainty
- Uncertainty: a neuron can be firing or not firing

The Whole



Some other neuron



1 neuron, 2 possible states

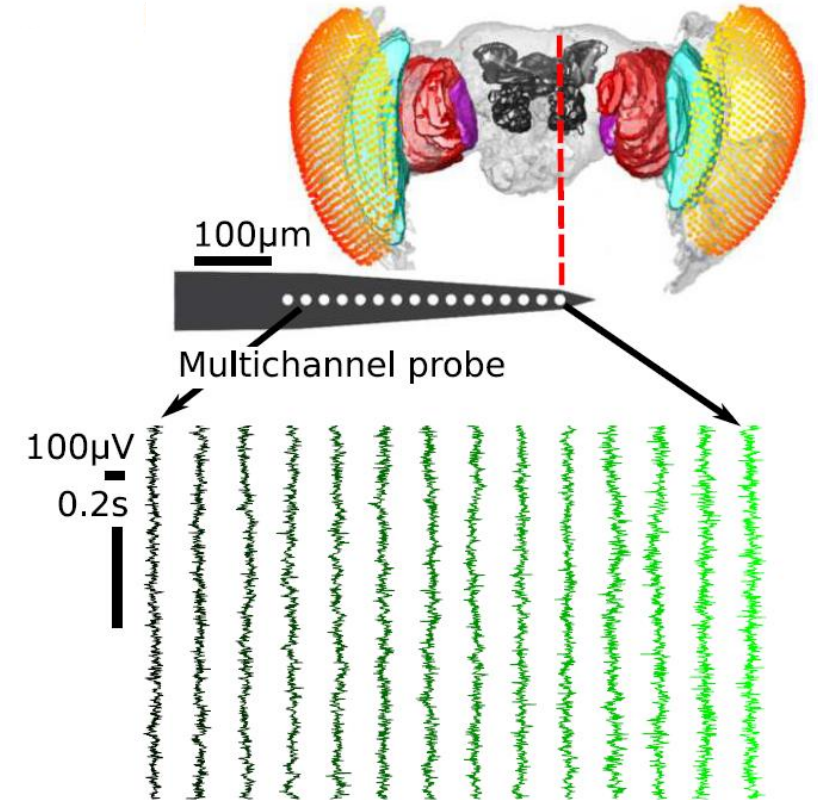
What is Integrated Information Φ ?

- Does a given a network state (e.g. state of all neurons in the brain) constrain the possible **past** and **future** network states?
 - Yes – constrained states = reduced uncertainty = information
 - No – states unconstrained = same uncertainty = no information
- Does splitting the network (e.g. brain into two hemispheres) give us the same information as not splitting the network?
 - Yes – no integration
 - No – integration is a vital part of the system – difference in information is Φ

Data

Fly Data

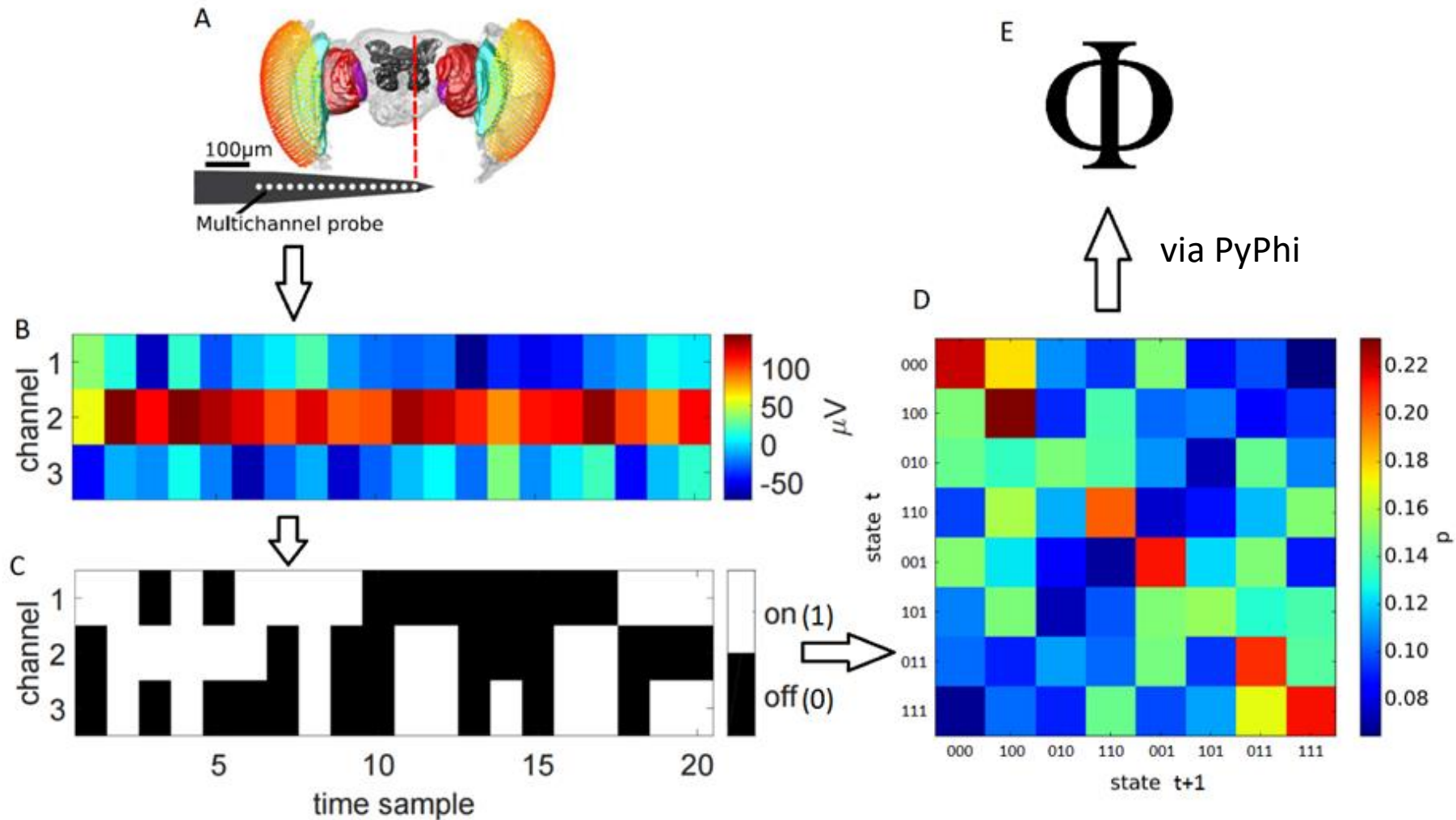
- 13 fruit flies (*Drosophila melanogaster*)
- Half-brain probe: 16 electrodes
 - 15 'channels' after bipolar re-referencing
- 2 conditions:
 - 0% isoflurane (air)
 - 0.6% isoflurane (iso)
- 18s of 'spontaneous' LFP
 - 18s period after an air puff
 - 18s period split into 8 x 2.25s trials, 1kHz sampling rate (downsampled from 25kHz)



Φ Parameters

- Number of channels: 2 to 4 (all combinations)
 - 15 choose 2 = 105 sets
 - 15 choose 3 = 455 sets
 - 15 choose 4 = 1365 sets
- Time lag (τ): 4ms, 8ms, 16ms
 - TPM for 4ms: for a state at sample t , probability of sample $t+4$ being a specific state
 - Exclusion axiom: consciousness flows at a particular speed (where Φ is max)

Φ Calculation



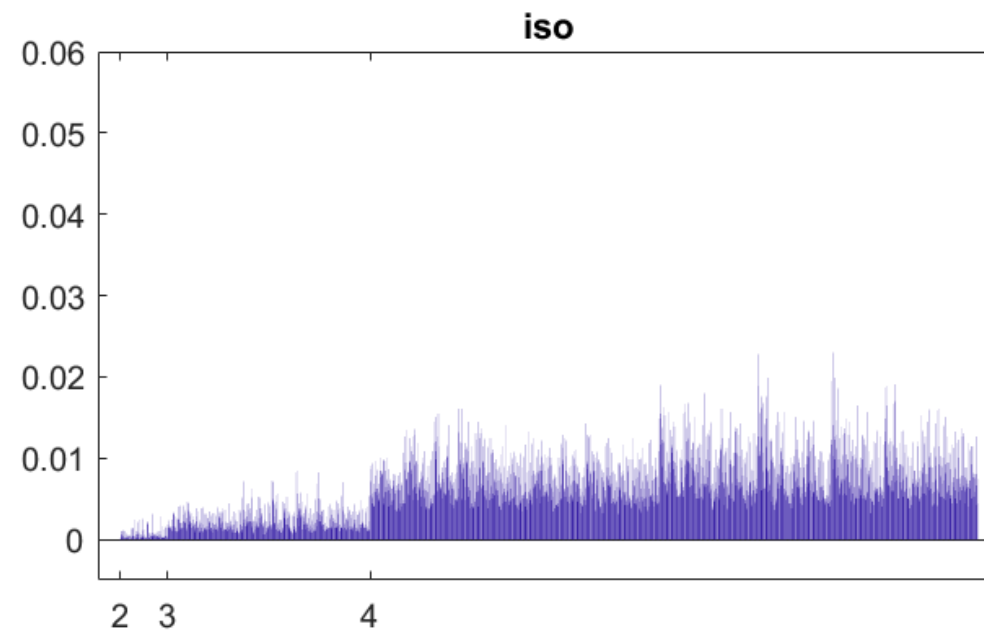
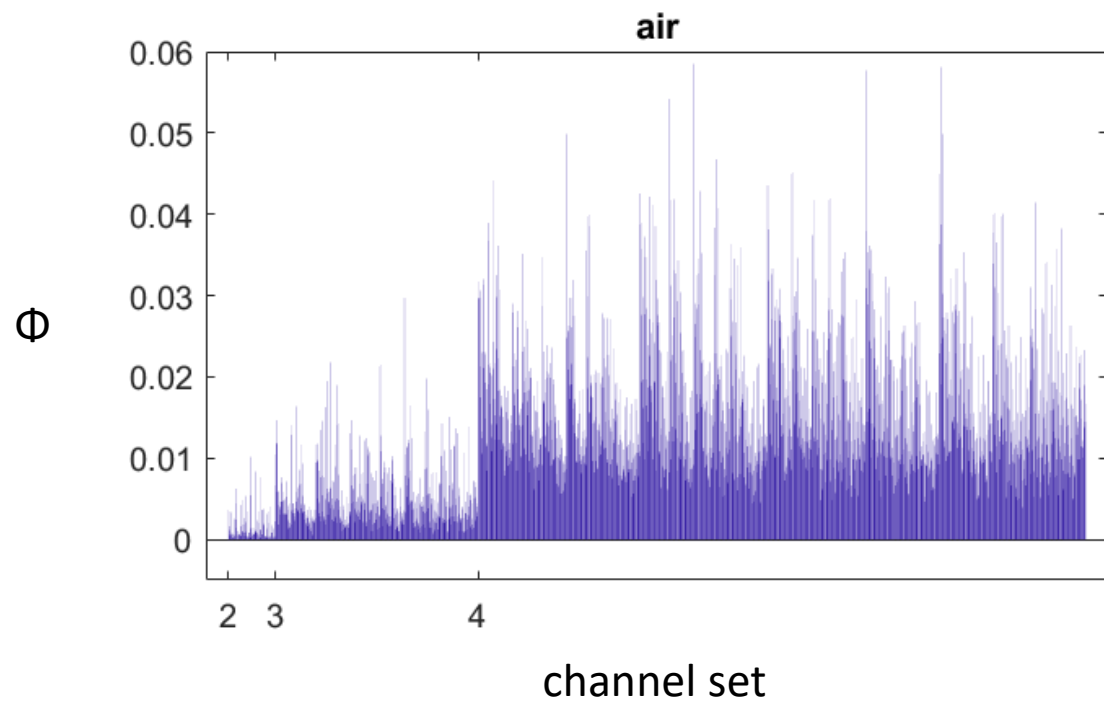
Air vs Isoflurane

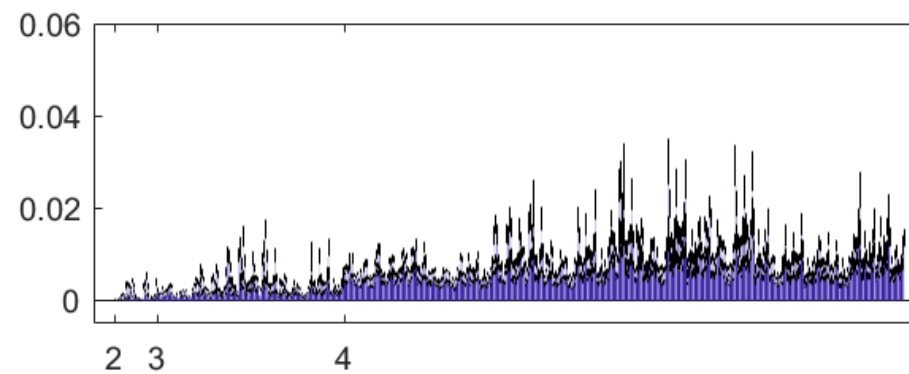
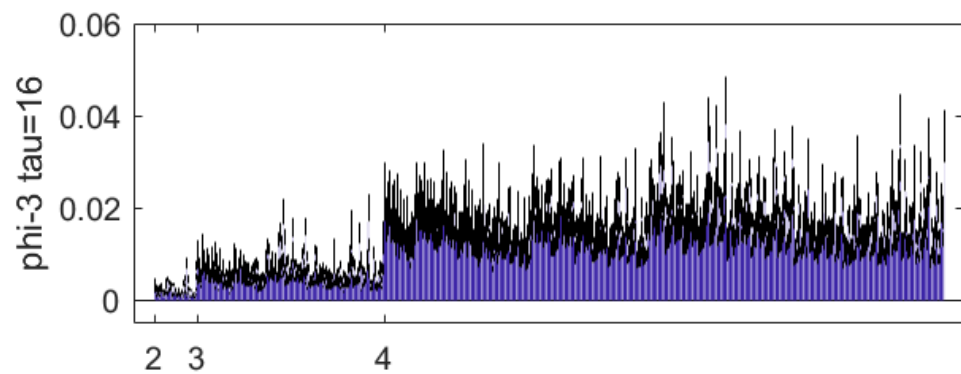
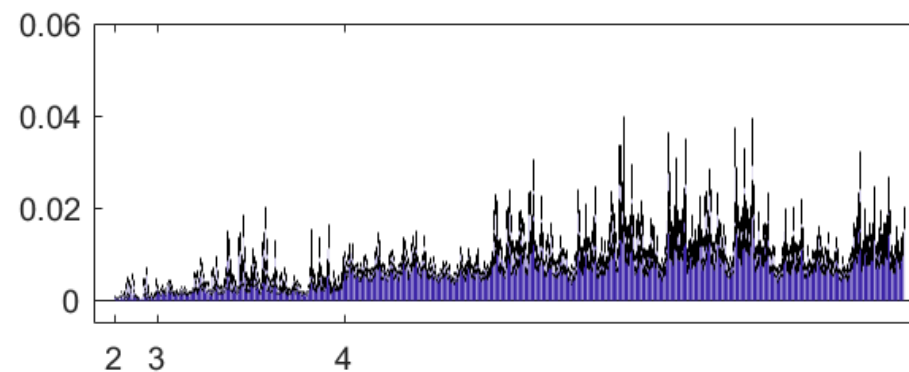
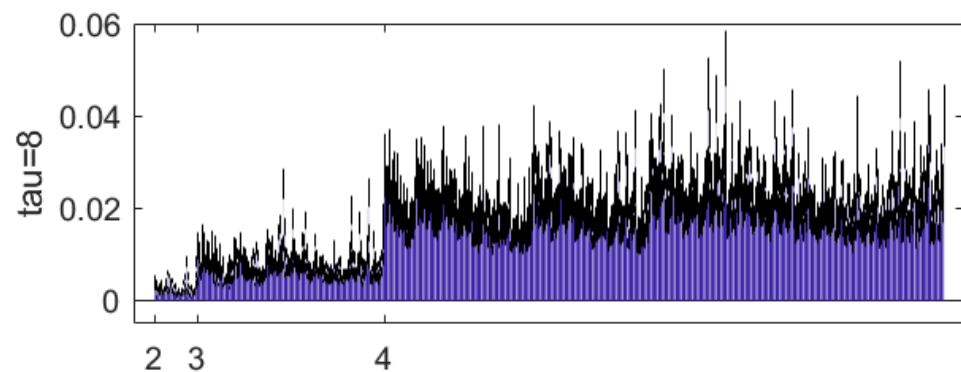
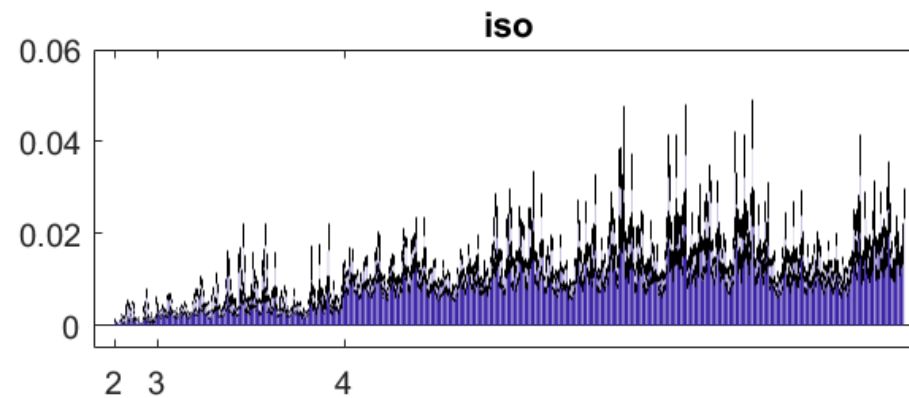
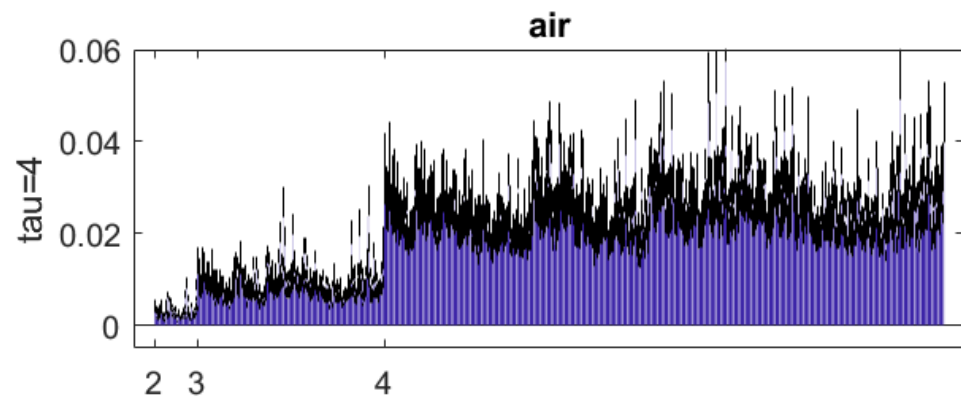
Investigation 1

Investigation 1: air vs isoflurane

- Is Φ lower during anaesthesia?
- Simplest prediction of IIT:
 - Loss of consciousness = loss of Φ
 - If a system loses consciousness, Φ should be lower
- Here we presume that flies are conscious under air, and lose consciousness under iso
 - Movement responses to air puffs diminished under anaesthesia

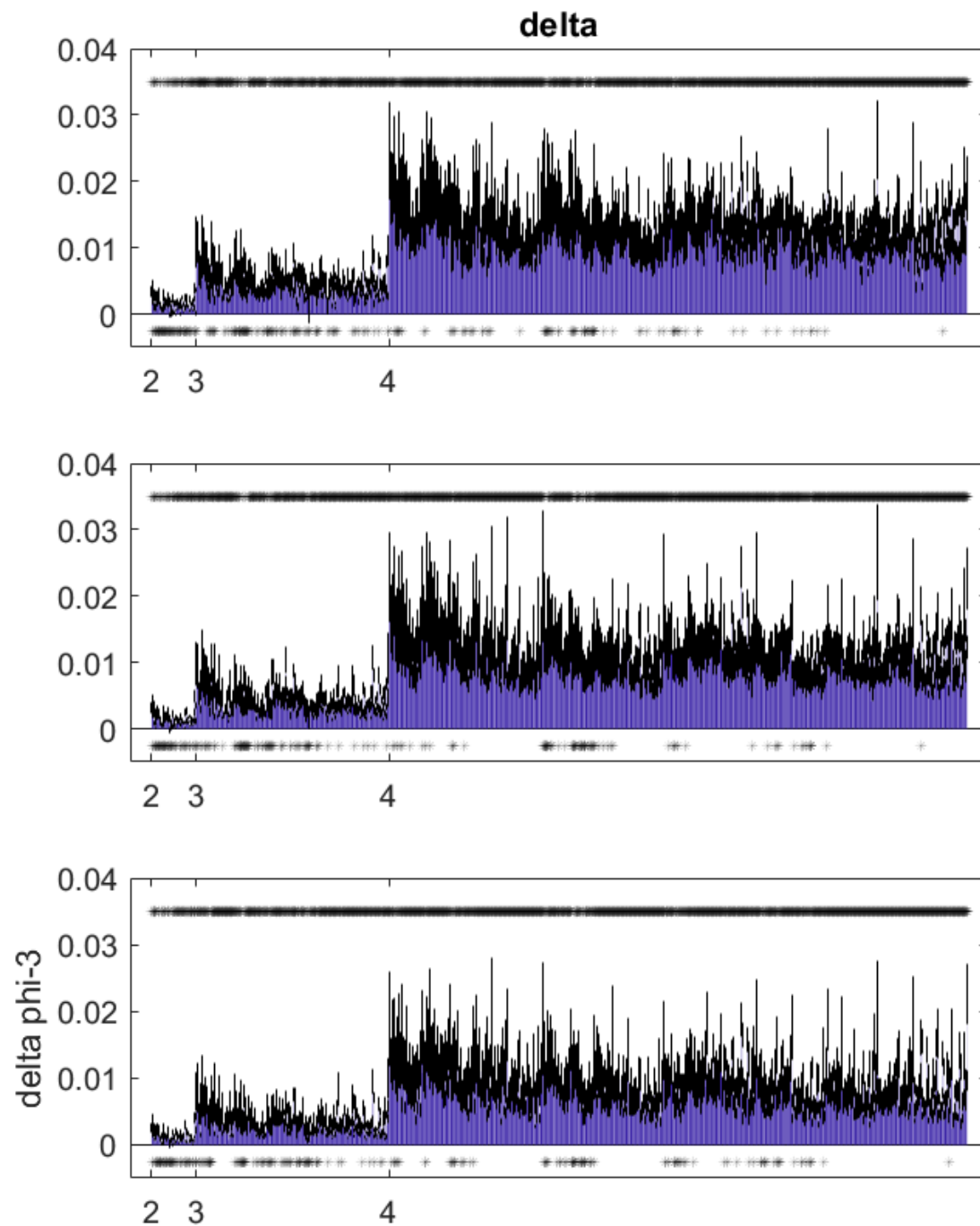
Φ values for 1 fly, lag=4ms





channel set

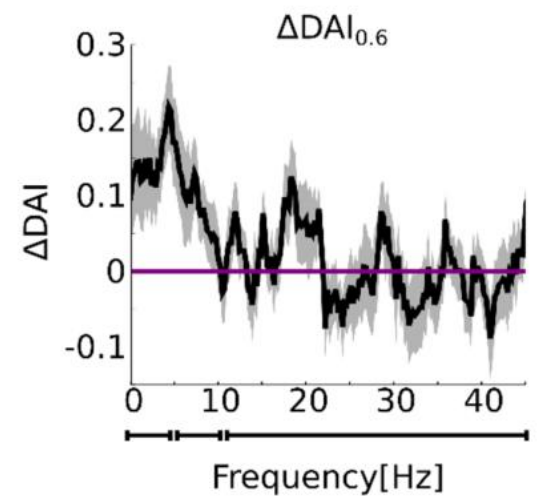
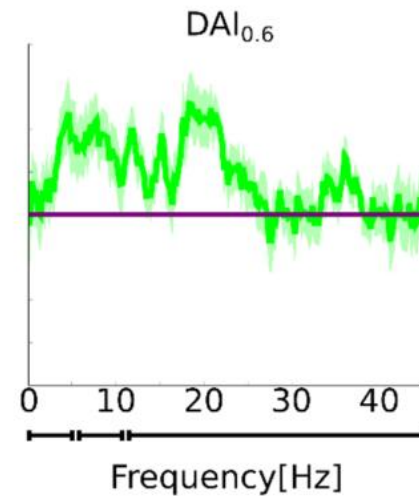
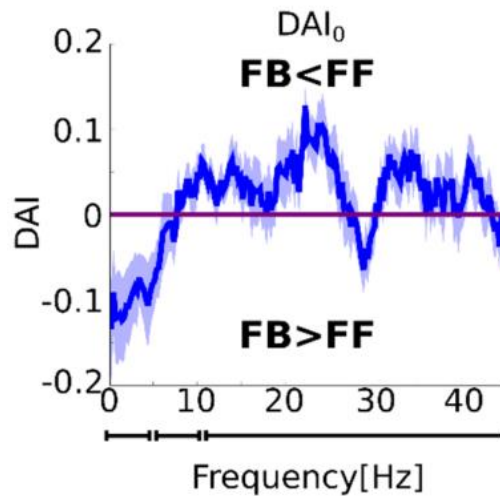
$\text{delta} = \text{air} - \text{iso}$



Past finding: reduced feedback under iso

- Past finding on same dataset using Granger Causality:
 - Feedback reduced under anaesthesia, for low frequencies
 - Feedback: centre channel -> periphery channel
- GC: one signal contains information about another

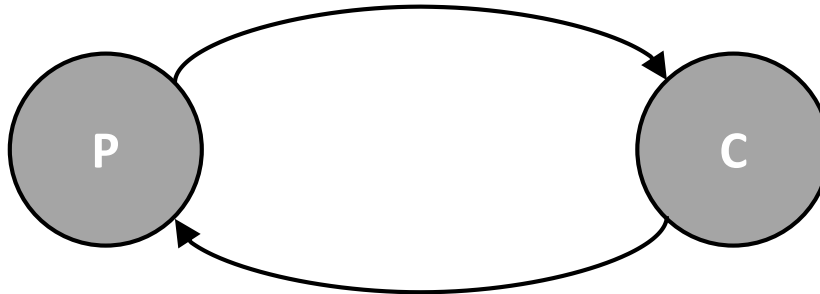
$$DAI = \frac{FF - FB}{FF + FB}$$



Is feedback reduction captured in the MIP?

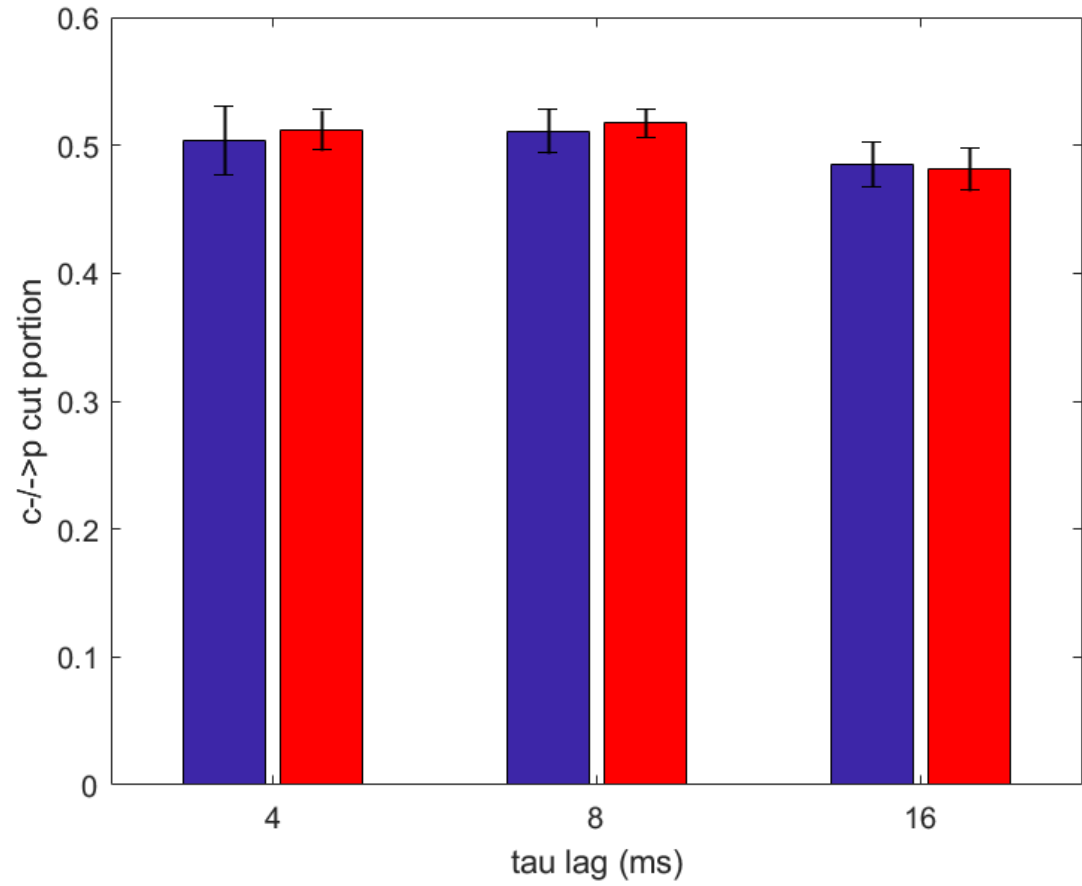
- The minimum information partition (MIP) is the unidirectional split which results in the least difference in information
 - No difference -> integration not vital among the split parts
 - MIP reduces the system as much as possible to independent parts
- If feedback loses importance, then cutting this connection should give a smaller difference
 - So the centre -> periphery cut might be more common under isoflurane

- 2 channel scenario:

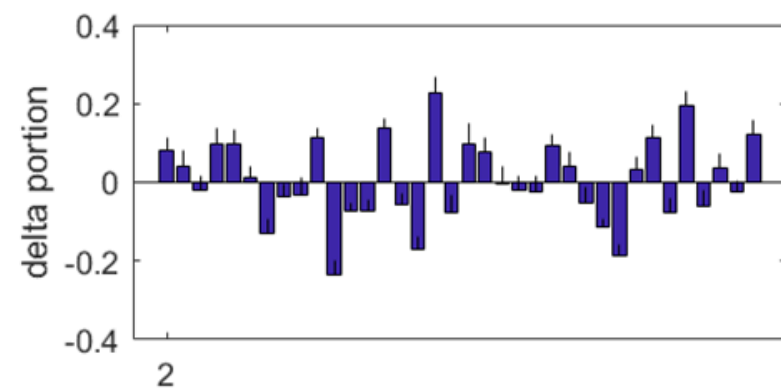
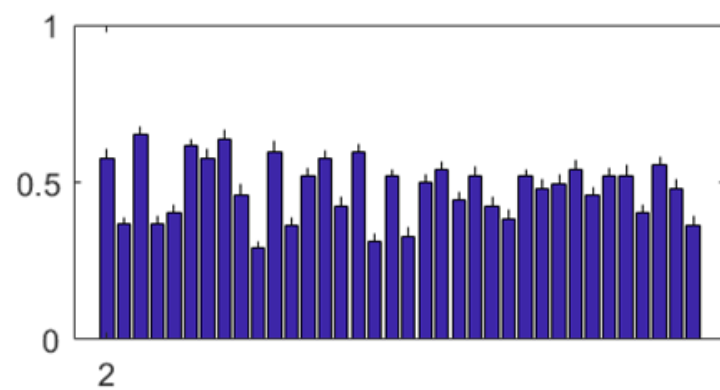
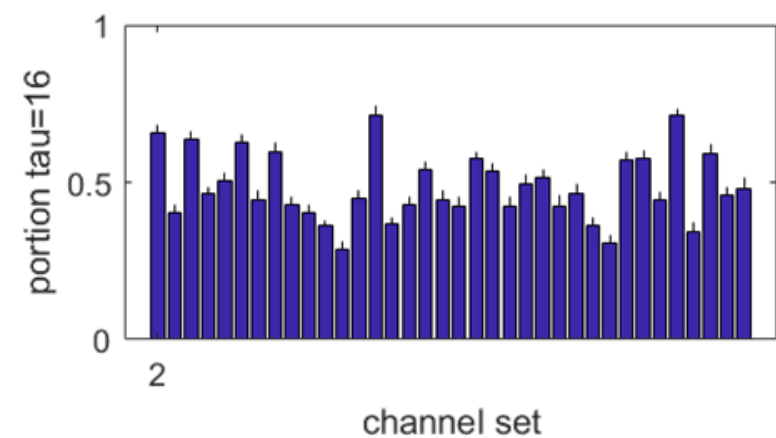
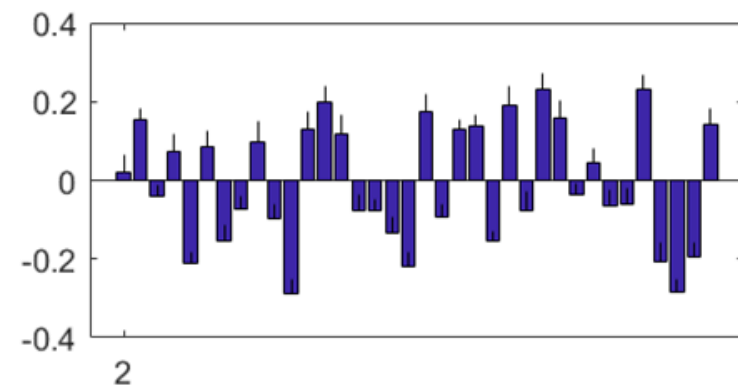
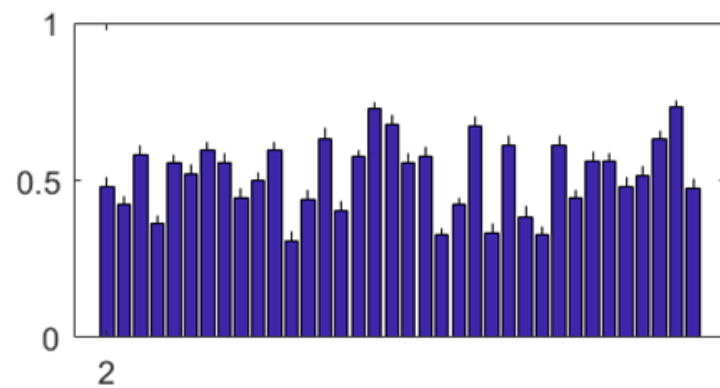
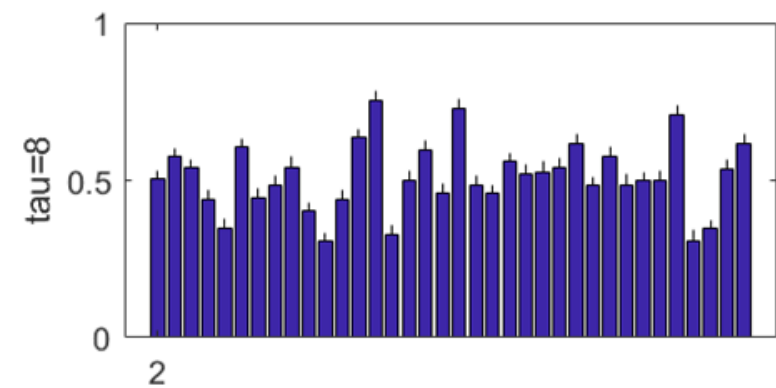
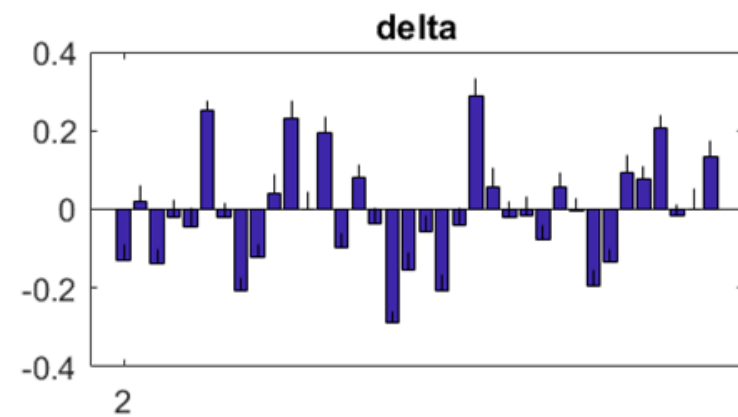
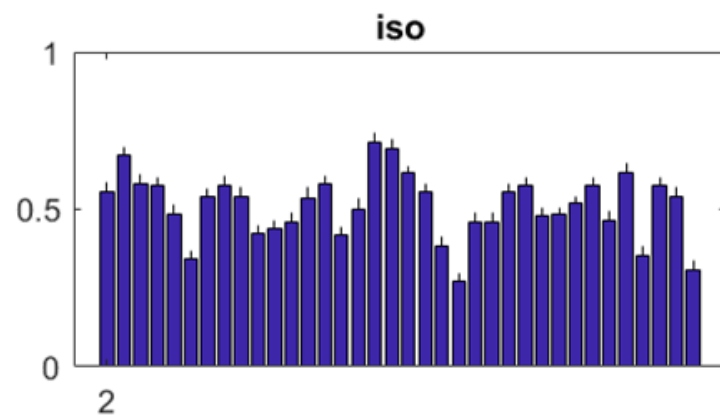
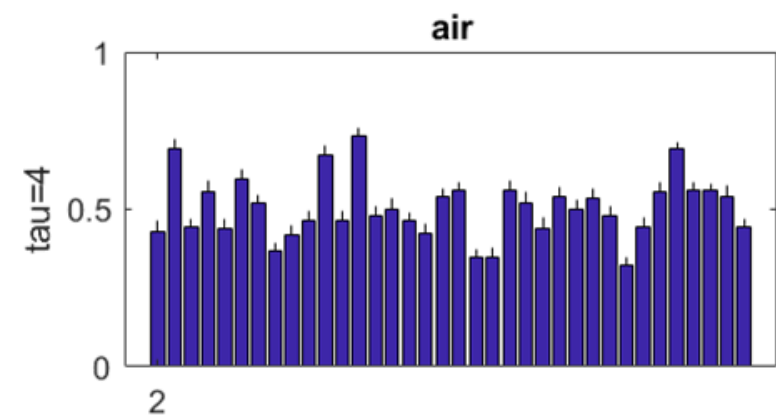


Portion of c-/->p cuts

- 2 channels = 4 states
- Portion of samples within a trial with a feedback cut as the MIP



B: air
R: iso



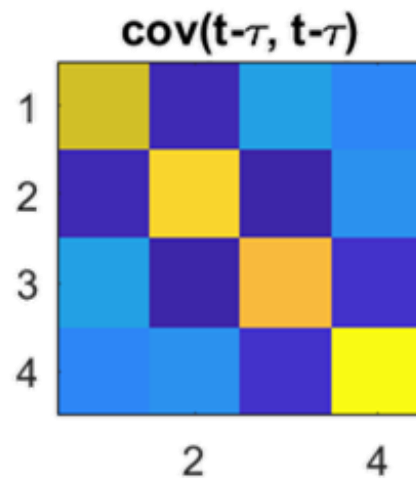
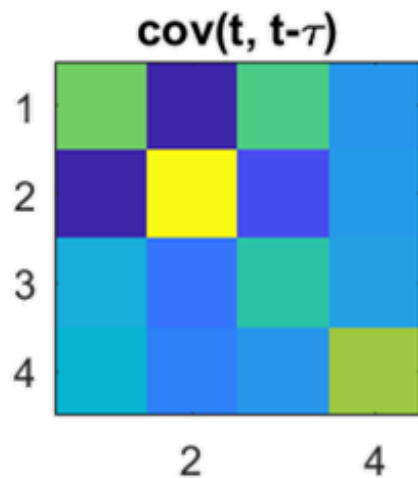
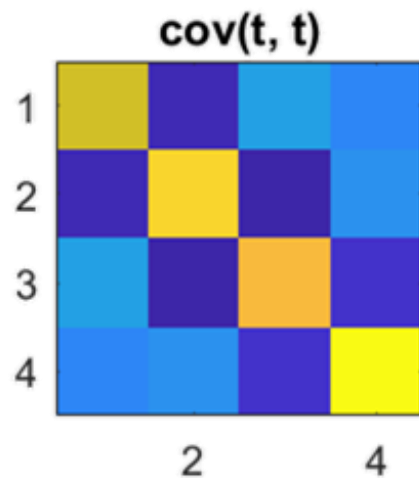
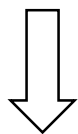
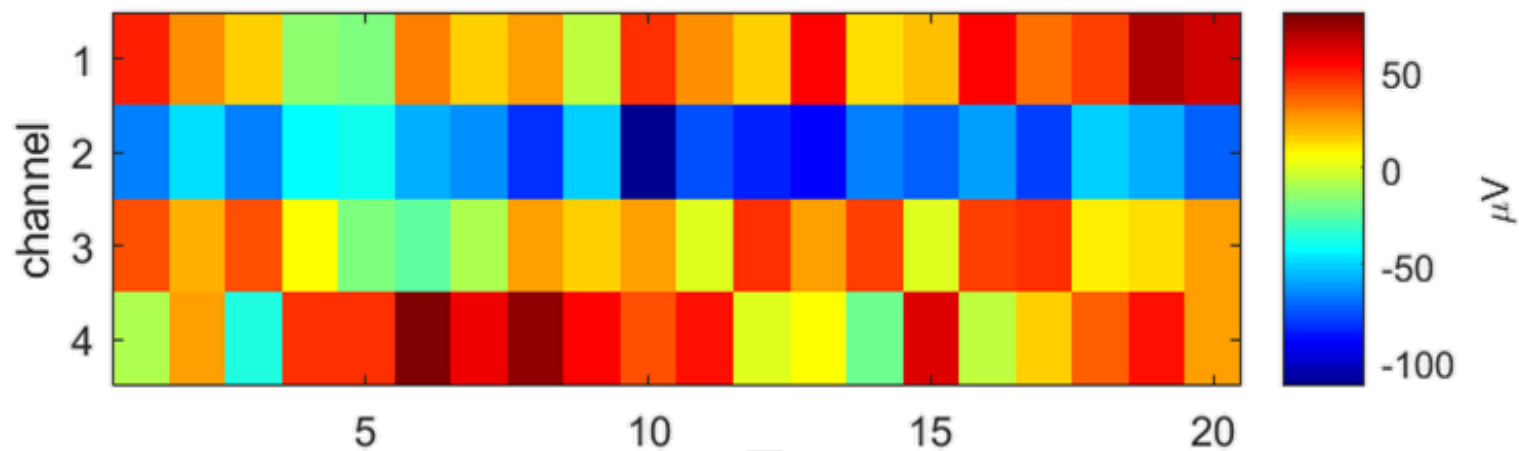
Φ vs Φ^*

Investigation 2

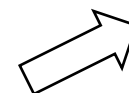
Investigation 2: Φ^* vs Φ

- Φ computation is resource intensive
- Φ^* can be analytically computed using the Gaussian approximation (this means faster computation)
- Φ^* based on IIT 2.0
- Slight differences between IIT 2.0 and IIT 3.0
 - IIT 2.0 assesses how a state constrains a system's past; IIT 3.0 assesses also how it constrains the future (more complex)
 - Φ^* : symmetry between past-present and present-future

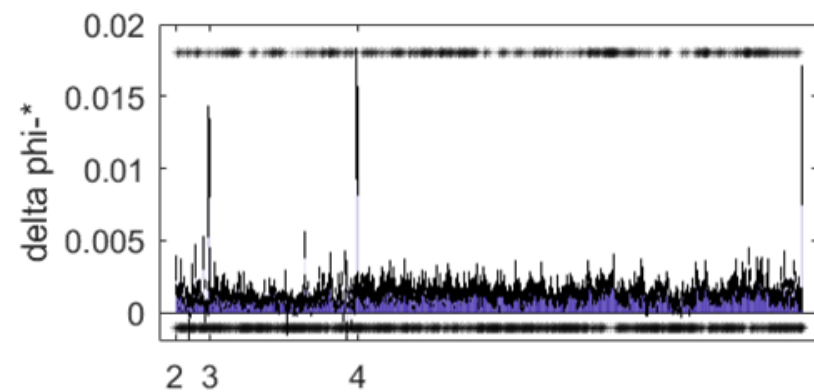
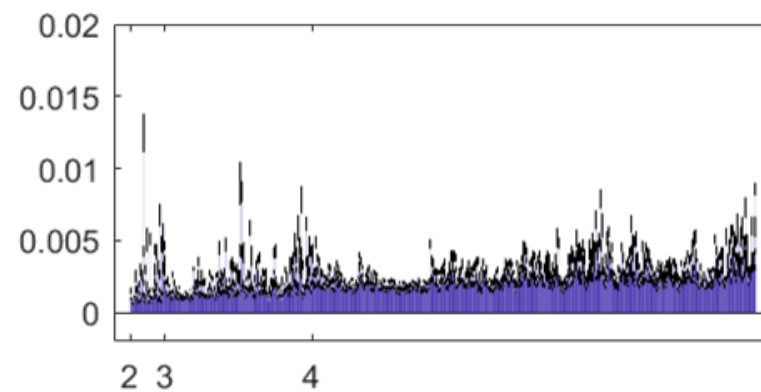
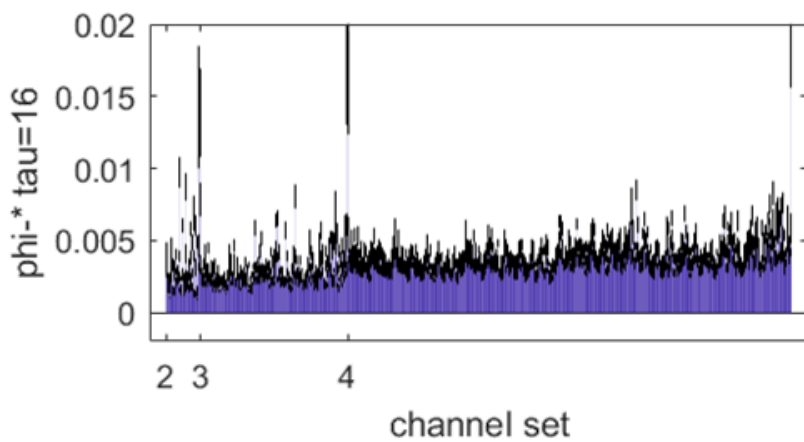
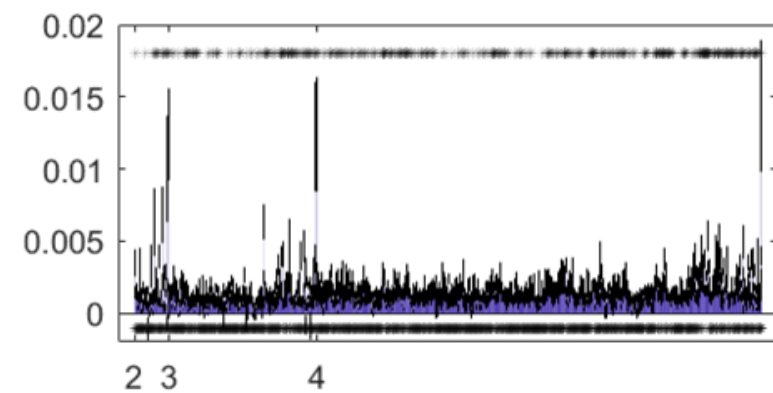
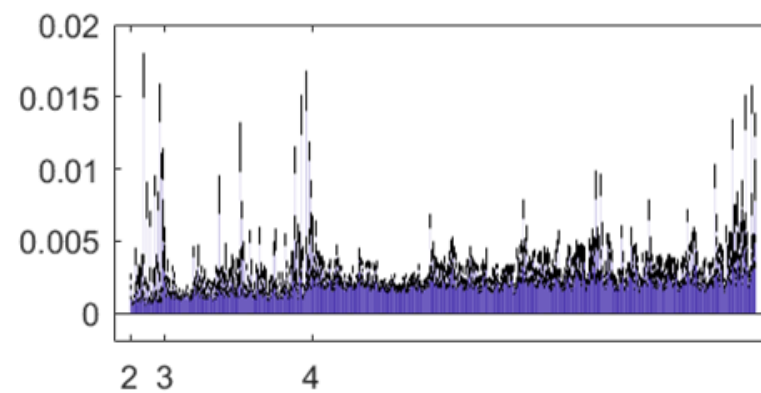
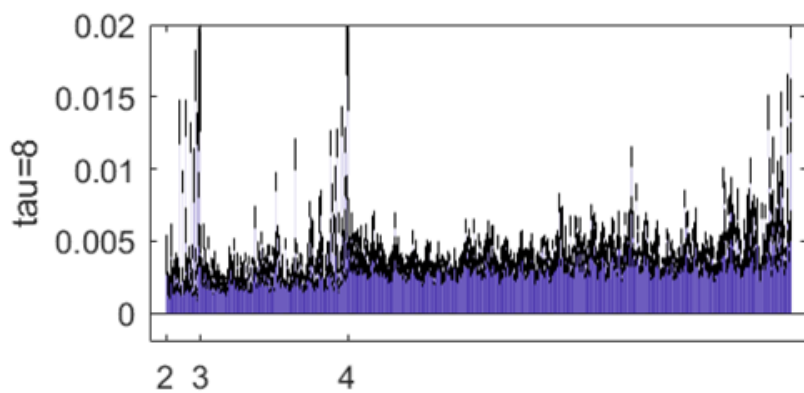
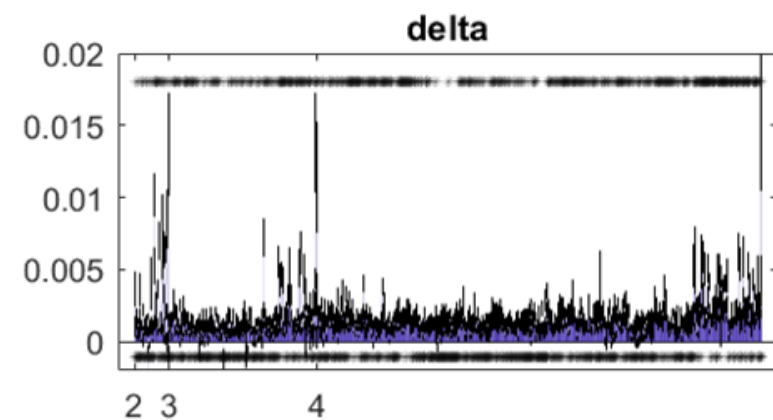
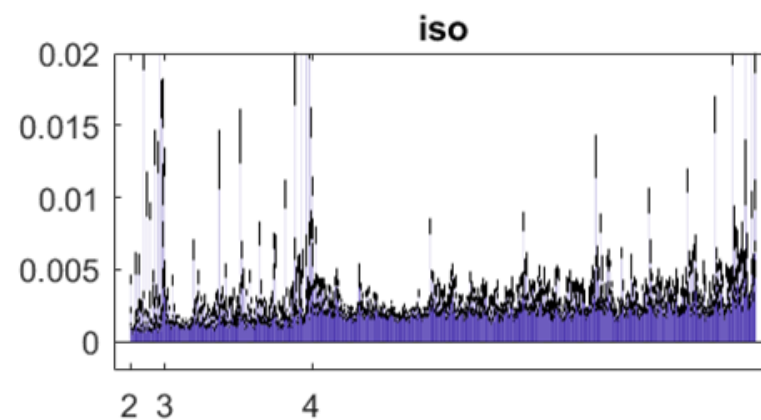
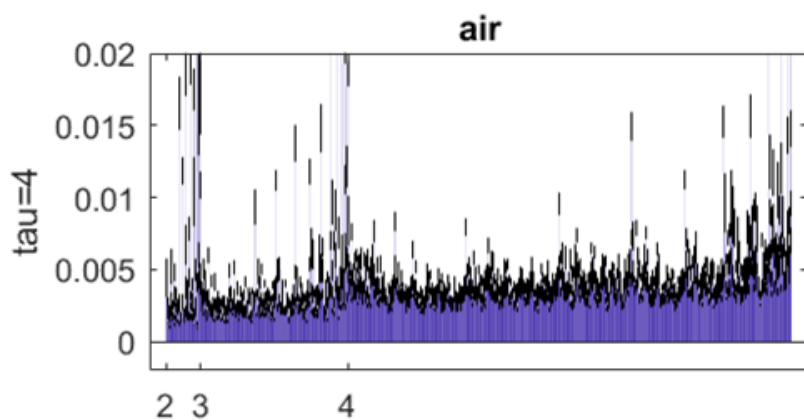
Φ^* Calculation



Φ^*



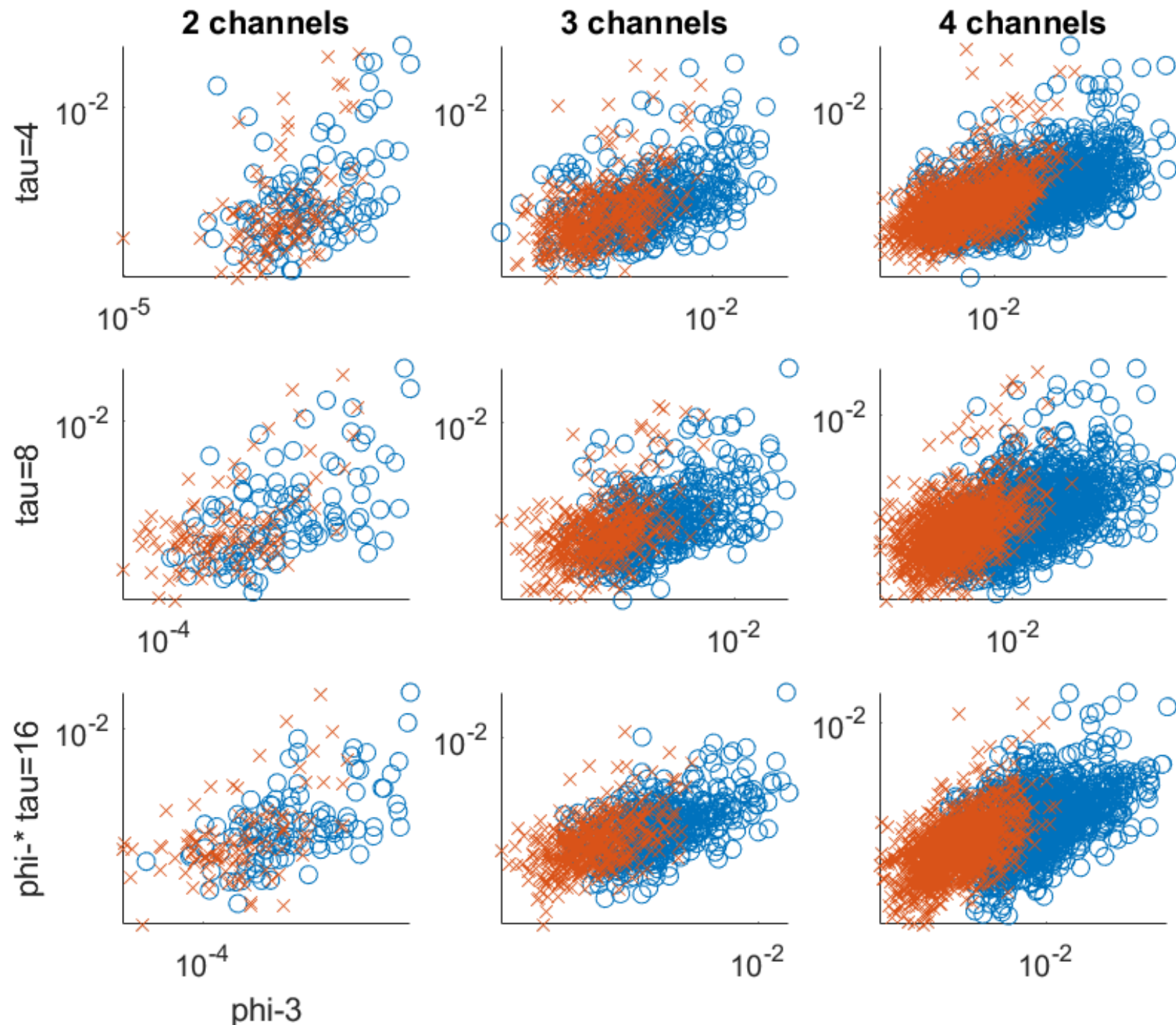
via phi_toolbox_Feb2014
(Haun et al., 2016)



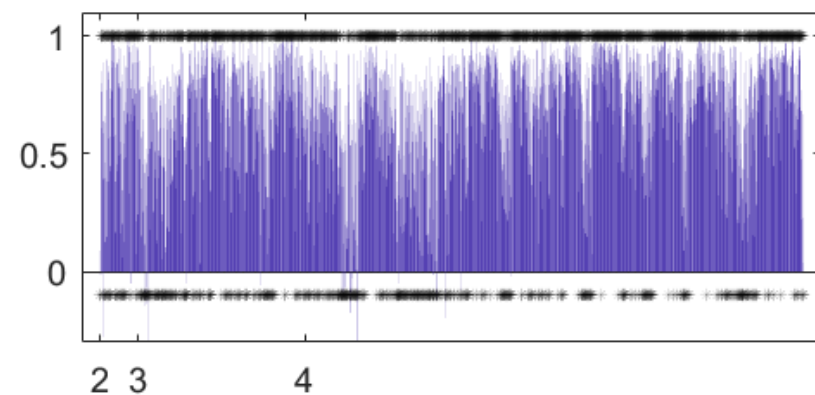
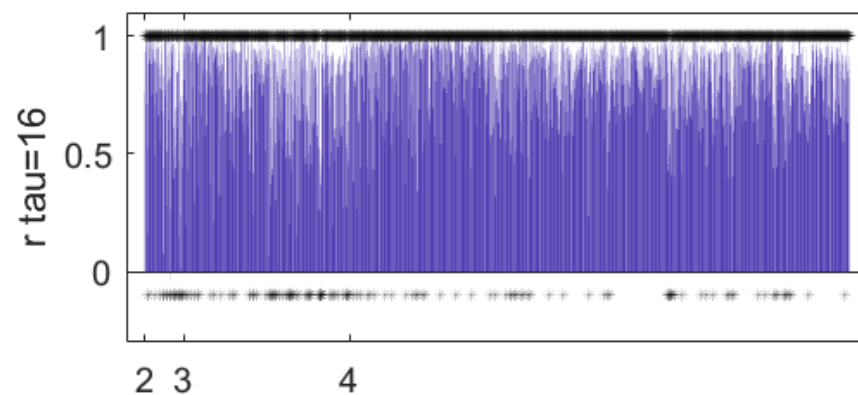
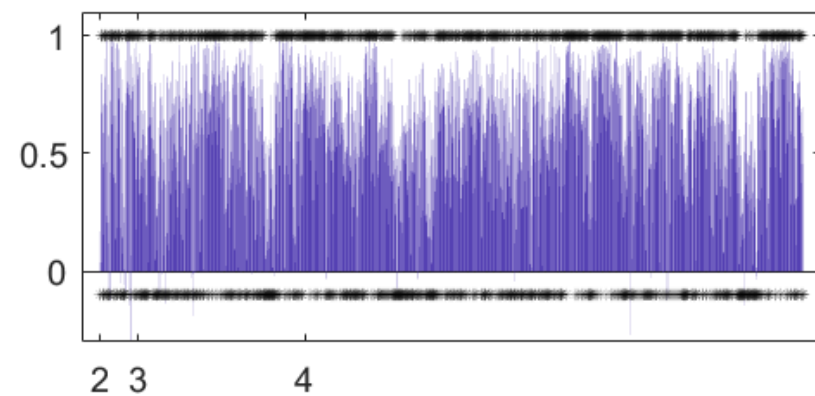
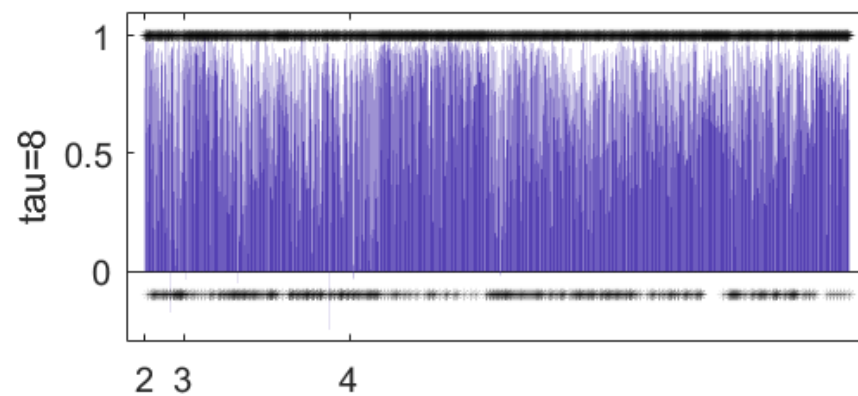
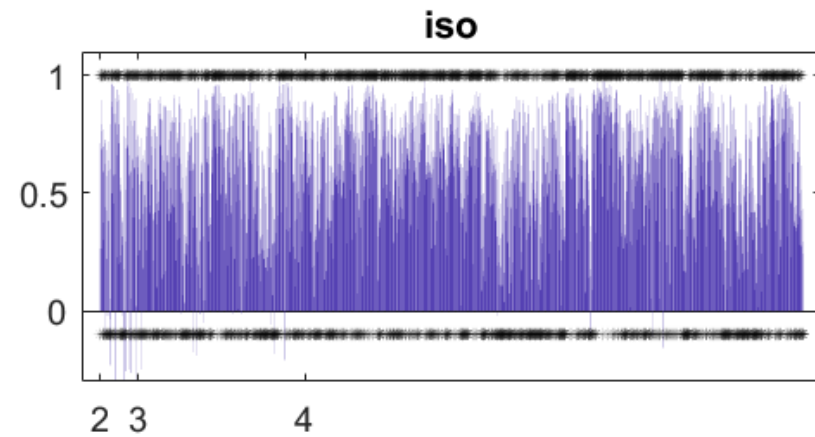
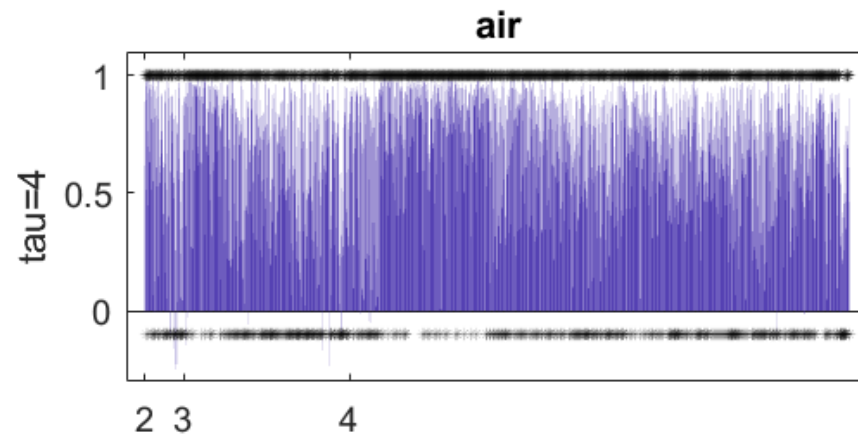
Comparing Φ^* to Φ

- Do they increase/decrease together?
- Do they give equivalent MIPs?

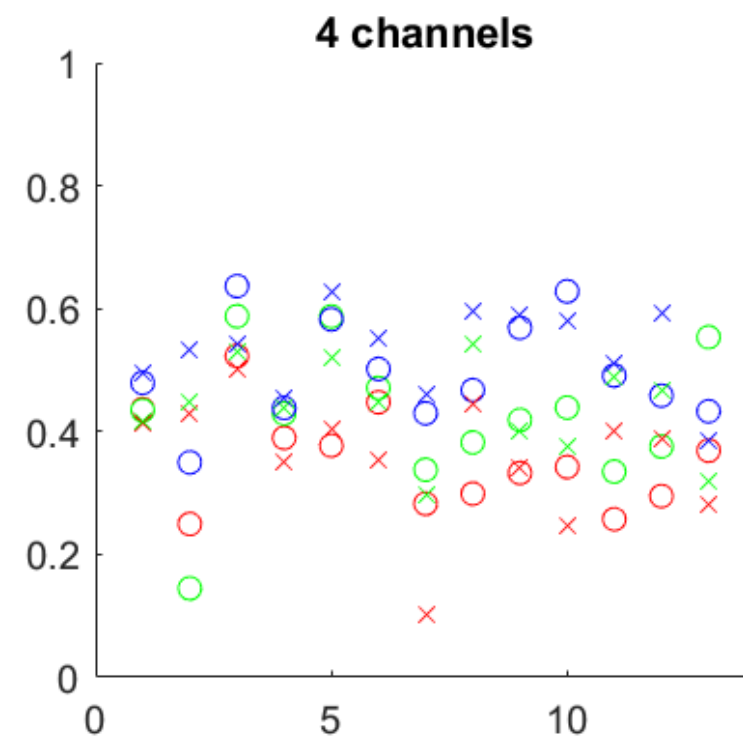
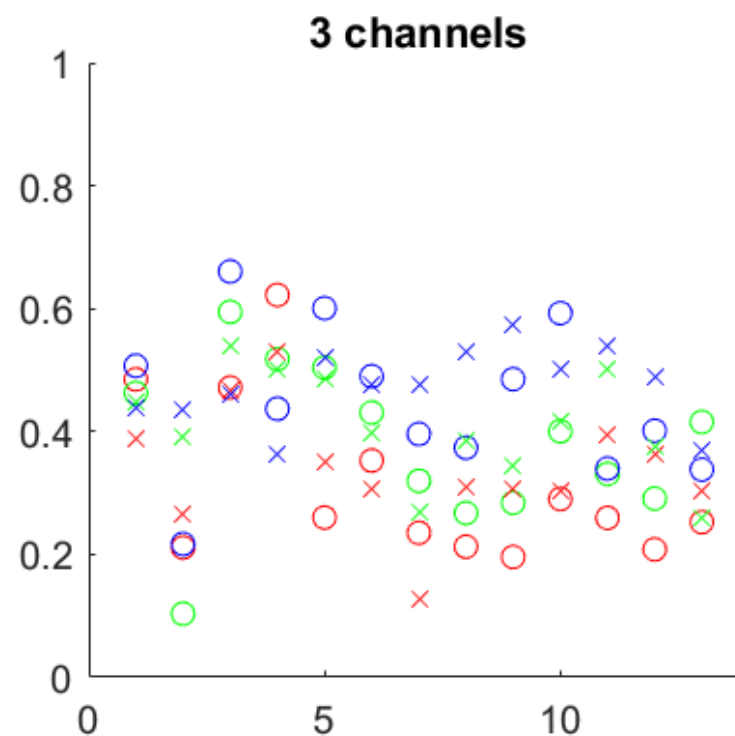
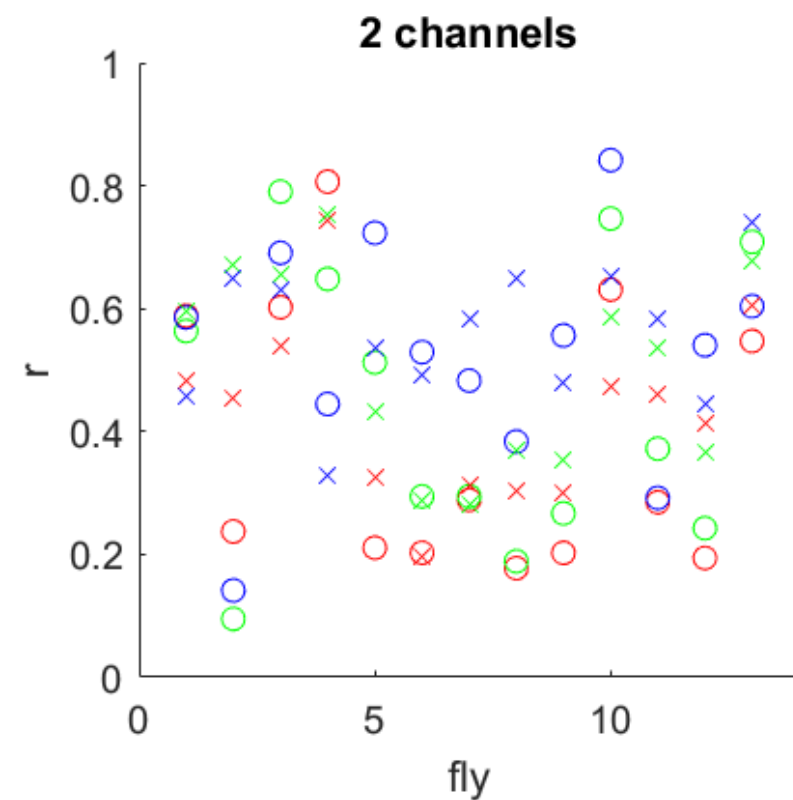
Φ - Φ^*
correlations
for 1 fly



Correlations
for each
channel set



Correlations for each fly



R: tau=4ms

G: tau=8ms

B: tau=16ms

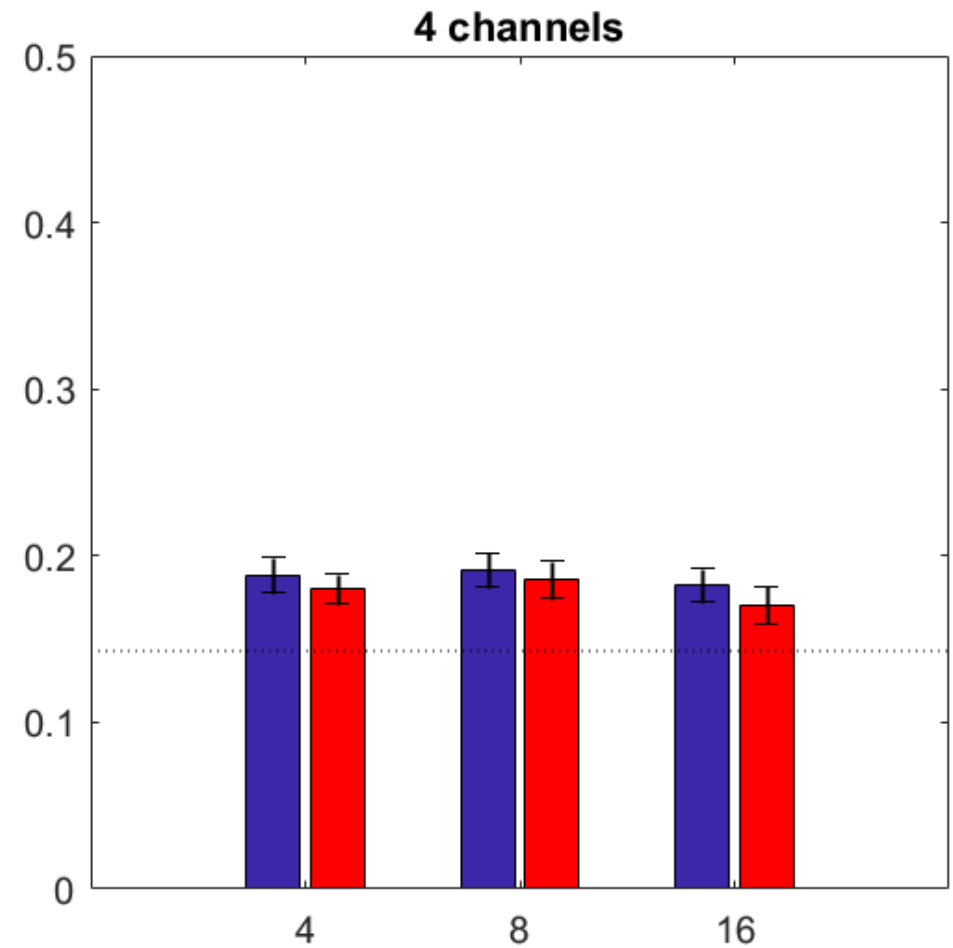
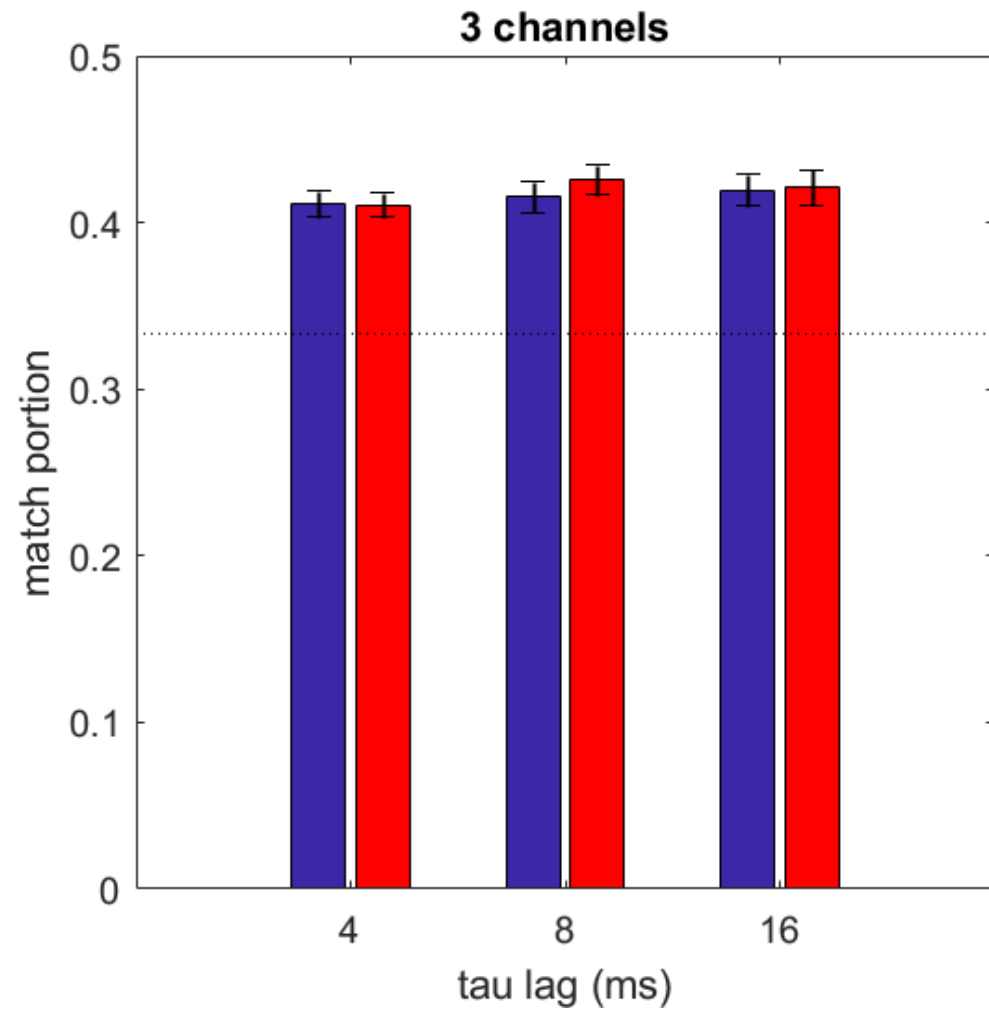
Difference between Φ and Φ^* MIPs

- IIT 3.0: MIPs are bipartitions from unidirectional cuts
 - Directional: $A \rightarrow B$ is different to $B \rightarrow A$
 - Separated partitions can be considered appendages
- Φ^* MIPs are non-directional
 - IIT 2.0 only considers the past and present (symmetrically in Φ^*)
 - Cut connections leave partitions completely isolated
- Φ^* MIPs are not limited to bipartitions

MIP Matching

- For comparison, ignore directionality of Φ MIPs
- For comparison, only consider Φ^* MIPs which are bipartitions
- Reminder: only one Φ^* MIP per trial, but multiple Φ MIPs

Portion of matching MIPs



Conclusions

- Clearest prediction of IIT met
- Reduced feedback not captured by MIP cuts
 - May be due to building the TPM once per condition
- Moderate correlations between Φ and Φ^*
 - Slightly stronger for larger τ
 - Likelihood of MIPs matching slightly higher than chance
- Future direction: Use TPM built across both conditions to calculate Φ
- Future direction: calculate Φ^* using discretised values