



**Imperial College
London**

**GUILD
SCHOOL
HALL**

Neural markers of shared conscious experiences in classical music improvisation

In search of neural correlates

Aim

- Investigate neural indicators of **shared experiences** during **improvisational** states
- Detect neural differences between **letgo** and **strict** modes
- Explore **neural dynamics** and **(inter-)brain communication**

Experiments

- Artists performing music pieces in **letgo** and **strict** versions
- EEG signal from musicians during musical performance

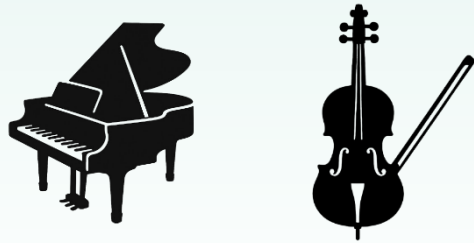
Methods

- Analysis of signal **complexity**
- Exploration of **brain network** topology

Datasets

Duo – Beethoven & Schumann

- Piano
- Cello



Datasets

Duo – Beethoven & Schumann

- Piano
- Cello



Trio – Schubert

- Flute
- Piano
- Singer



The Improvisational State of Mind: A Multidisciplinary Study of an Improvisatory Approach to Classical Music Repertoire Performance

David Dolan¹, Henrik J. Jensen^{2,3}, Pedro A. M. Mediano⁴, Miguel Molina-Solana^{4,5}, Hardik Rajpal², Fernando Rosas^{2,6} and John A. Sloboda^{1*}

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Trio – Ravel & Improvised

- Flute
- Harp
- Viola



The improvisatory approach to classical music performance: An empirical investigation into its characteristics and impact

David Dolan¹, John Sloboda¹, Henrik Jeldtoft Jensen², Björn Crüts³

and Eugene Feygelson⁴

MPR

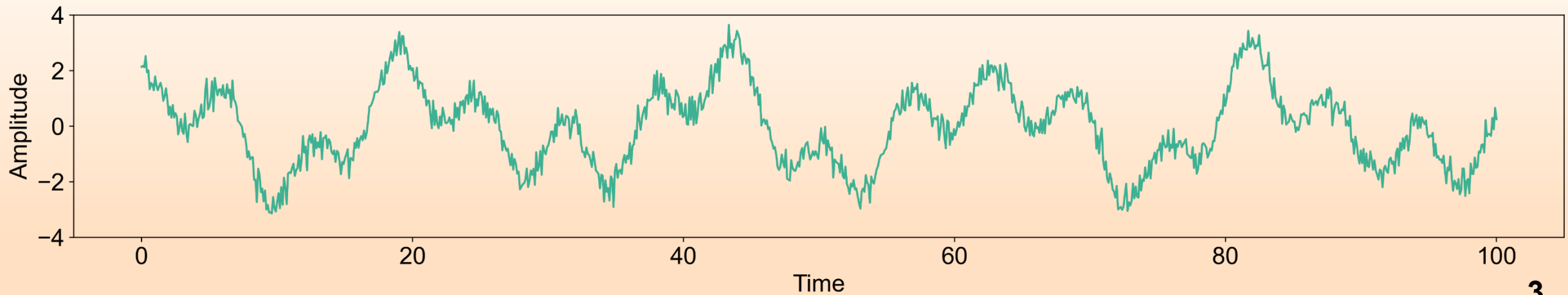
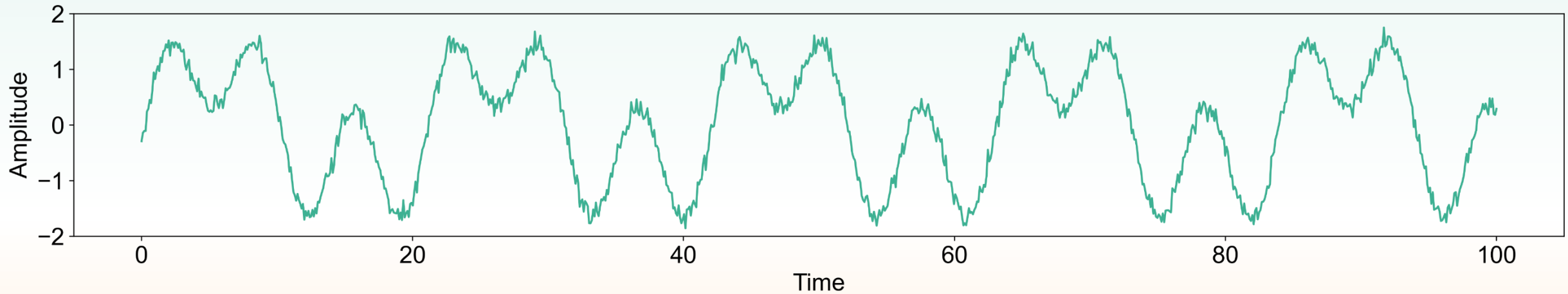
Music Performance Research
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Intermezzo #1 – Complexity and CSER

Signal complexity: Measure of the dynamical richness of a signal

Intermezzo #1 – Complexity and CSER

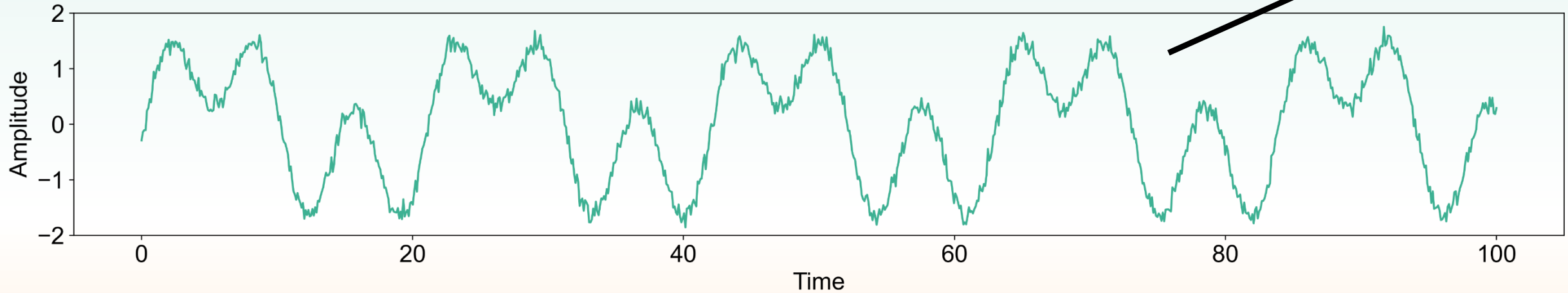
Signal complexity: Measure of the dynamical richness of a signal



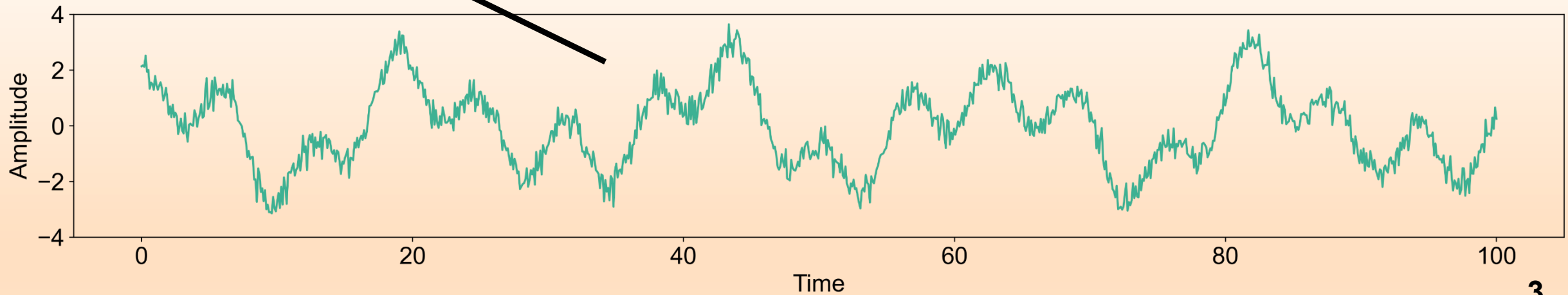
Intermezzo #1 – Complexity and CSER

Signal complexity: Measure of the dynamical richness of a signal

Low
Complexity



High Complexity



Intermezzo #1 – Complexity and CSER

Signal complexity: Measure of the dynamical richness of a signal

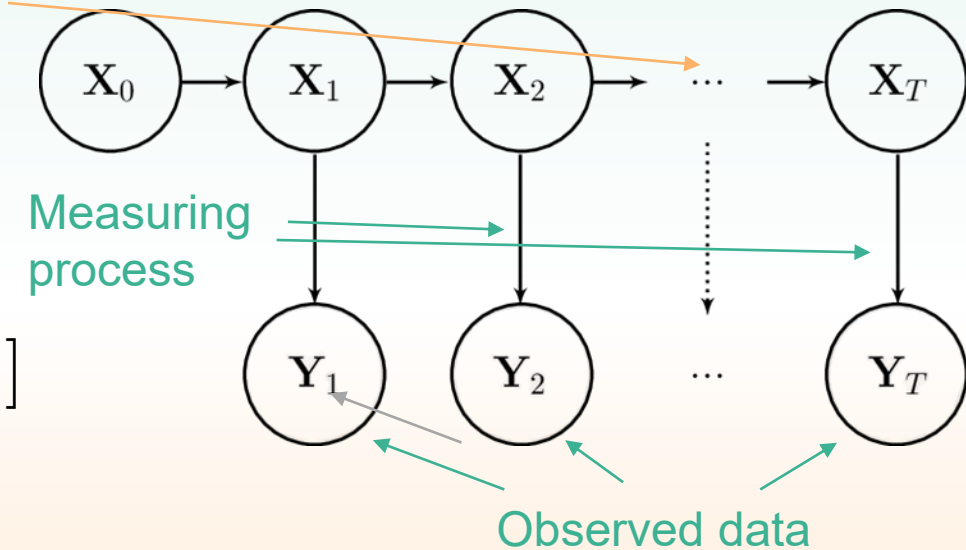
State-space models

$$X_{t+1} = AX_t + K\epsilon_t \quad \text{State Equation}$$

$$Y_t = CX_t + \epsilon_t \quad \text{Observation Equation}$$

- ϵ_t is the *innovation* at time t : $\epsilon_t \equiv Y_t - \mathbb{E}[Y_t|Y_t^-]$

Real unobserved
mechanism



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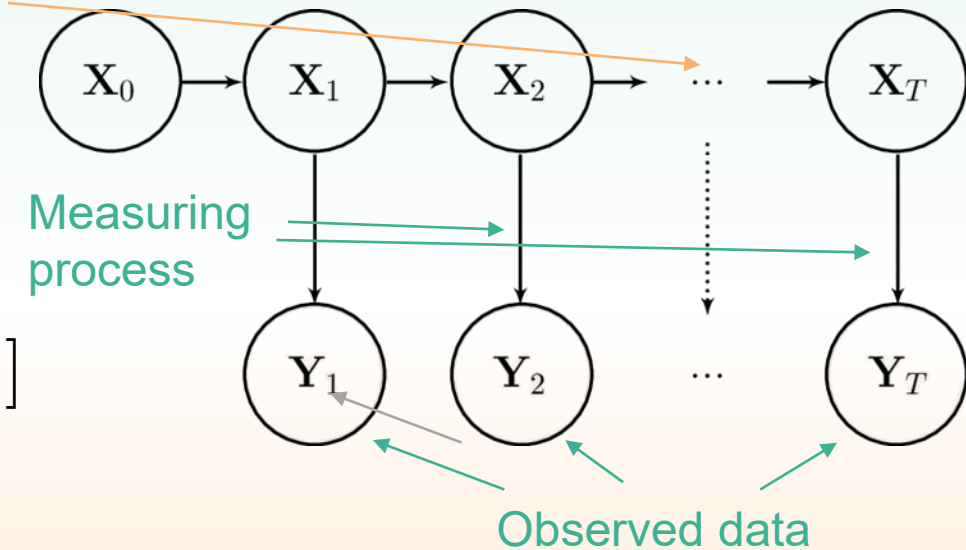
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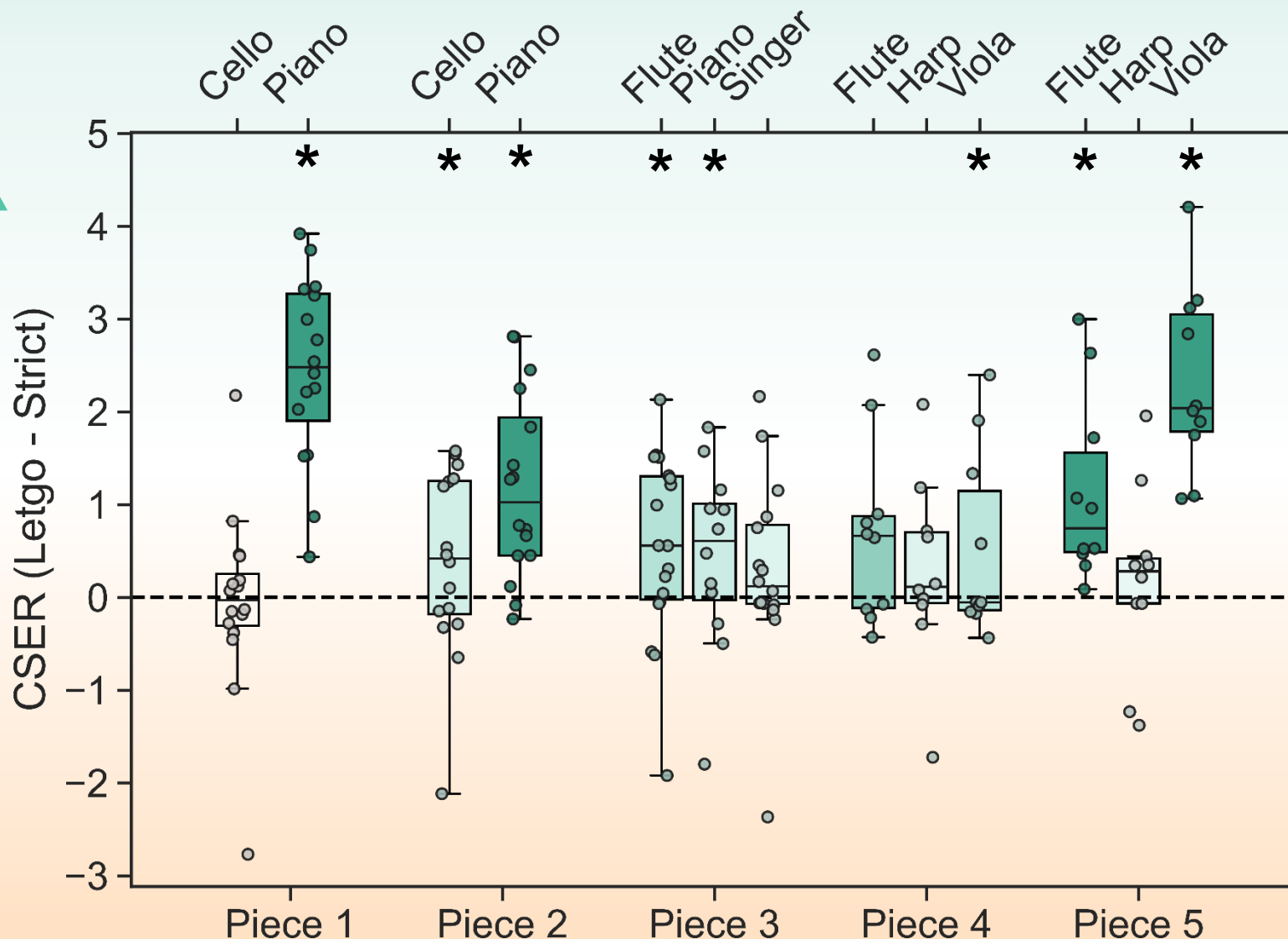


Complexity via State-space Entropy Rate (CSER)

- Assume Gaussian noise: $\epsilon_t \sim \mathcal{N}(0, V)$
- Define: $\text{CSER} = \frac{1}{2} \log |V|$

Results – Complexity

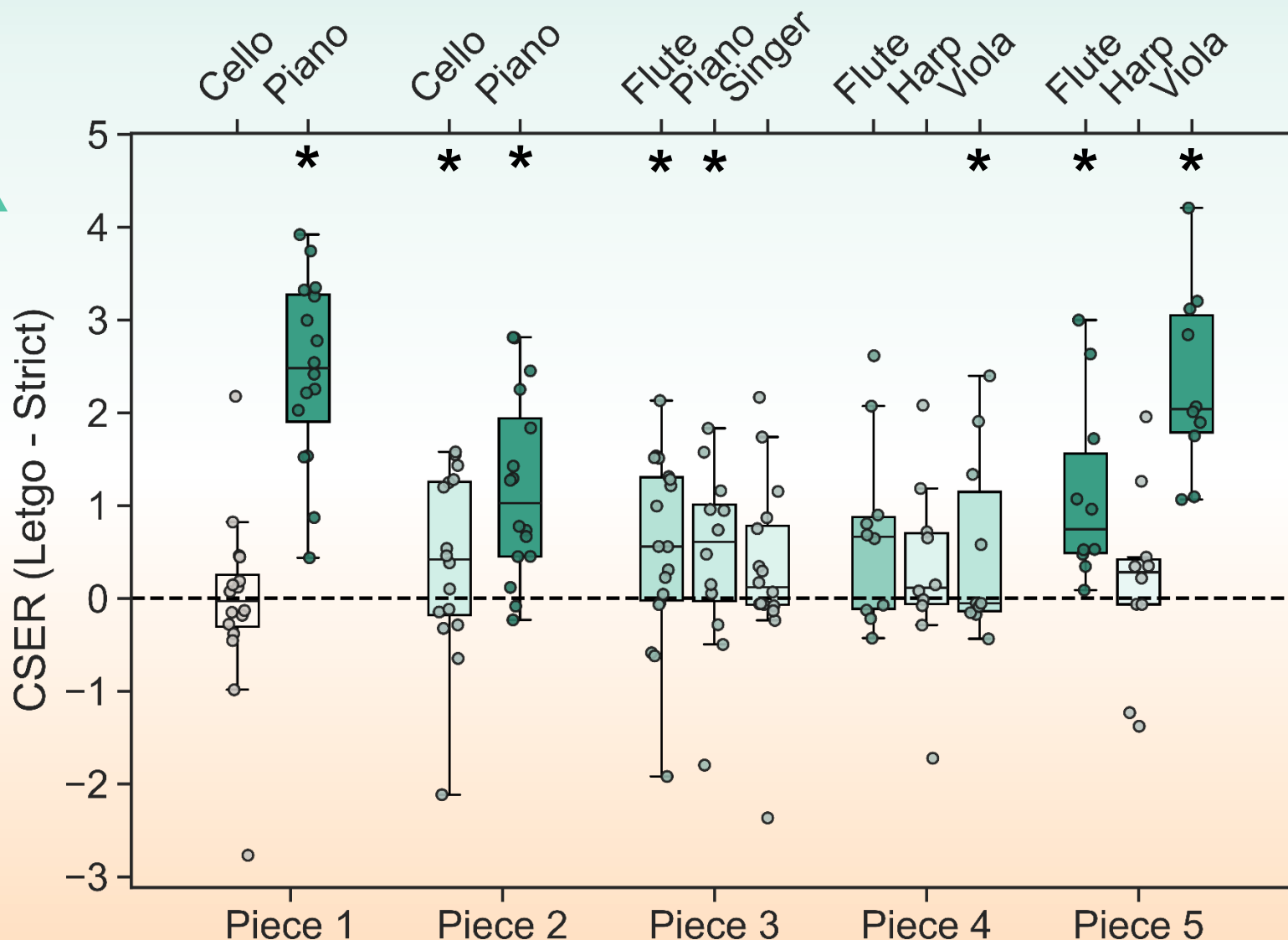
Higher complexity in **letgo**



Higher complexity in **strict**

Results – Complexity

Higher complexity in **letgo**



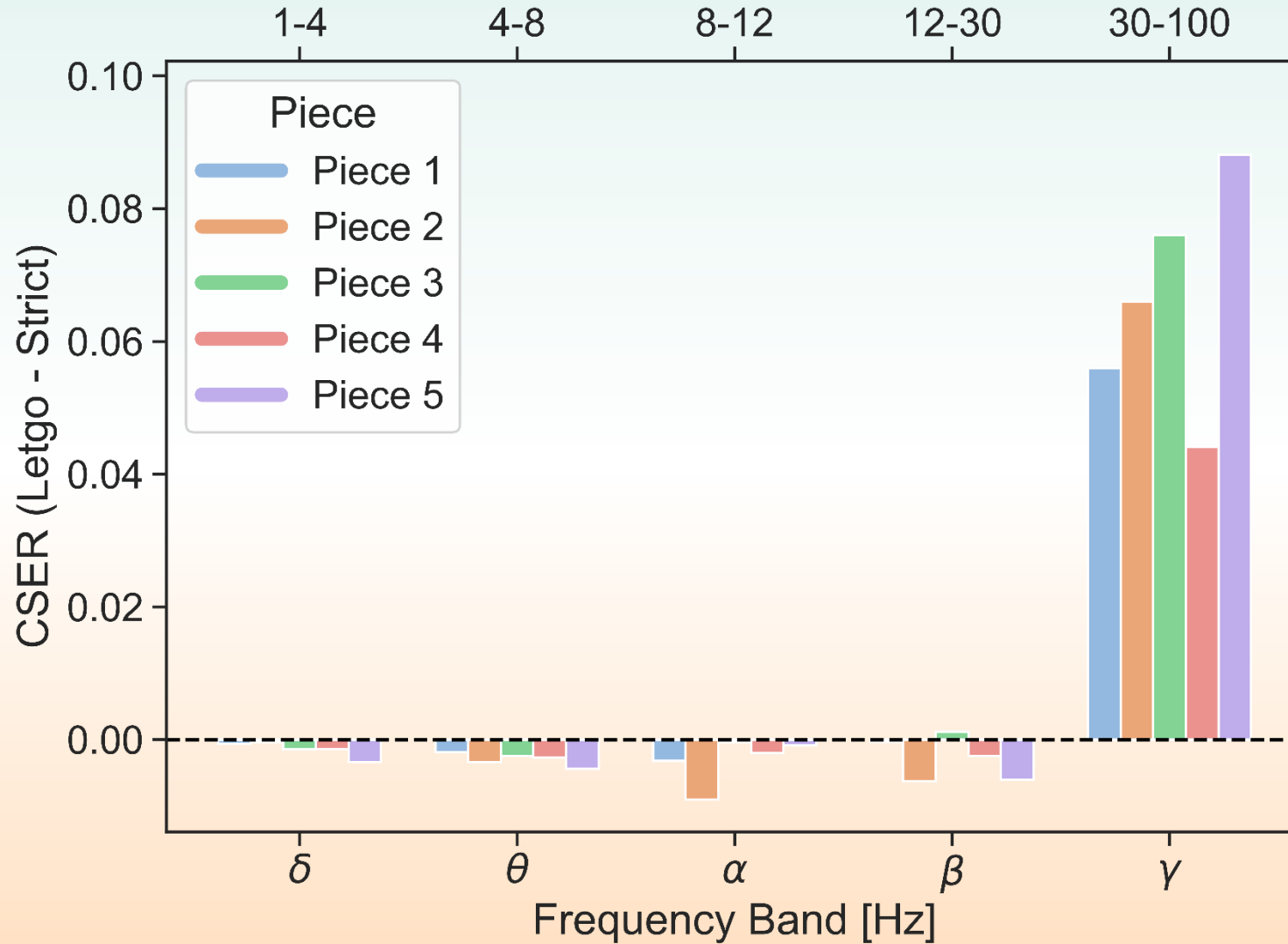
Higher complexity in **strict**



- Letgo performances have higher neural signal diversity and richer dynamics

Results – Complexity

Higher
letgo

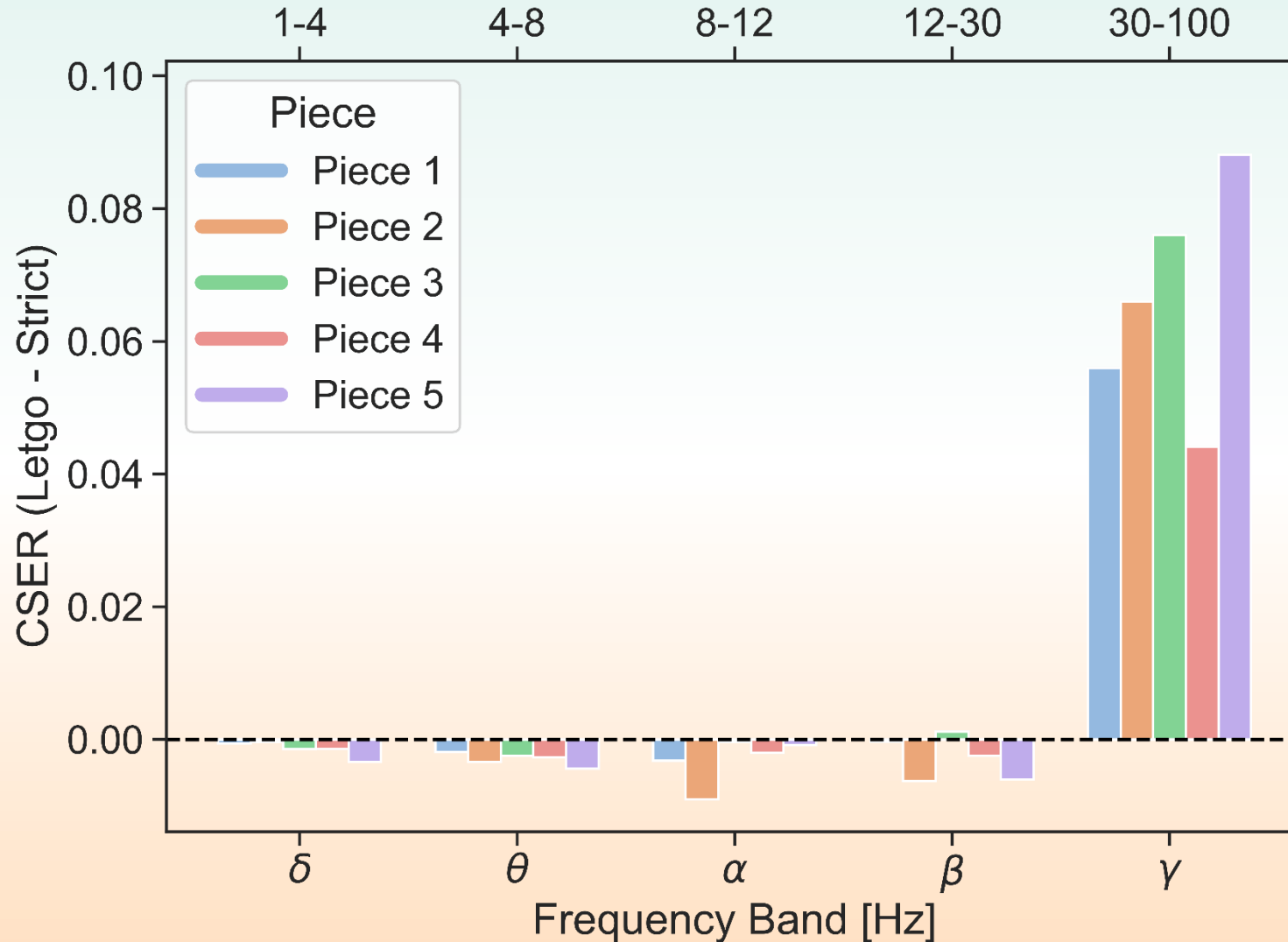


Higher
strict



Results – Complexity

Higher
letgo



Higher
strict



- Indicators of heightened awareness and cognitive engagement during letgo

Intermezzo #2 – Communication and Networks

How do brains communicate with each other?

Intermezzo #2 – Communication and Networks

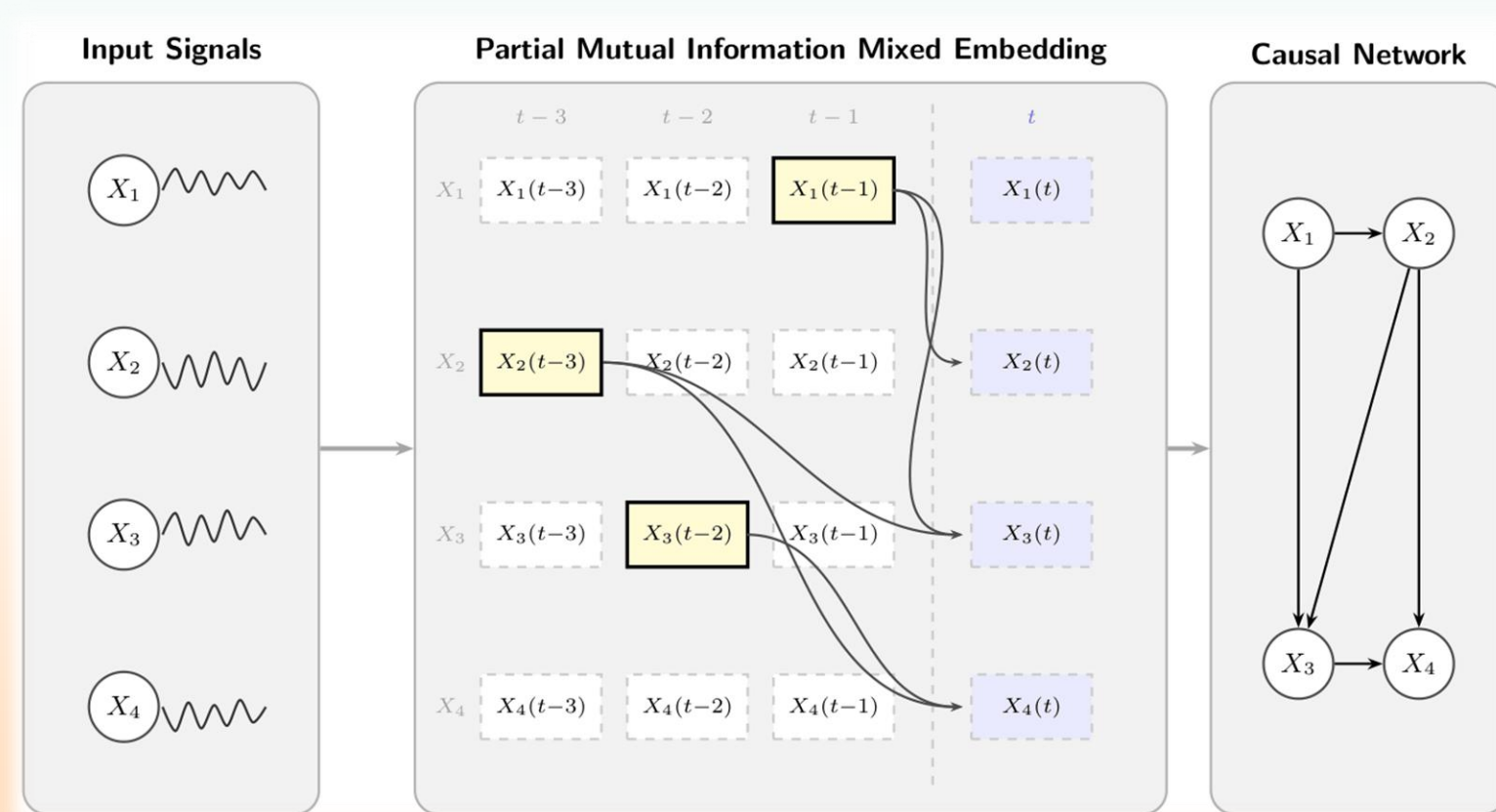
How do brains communicate with each other?

Use Partial Mutual Information Mixed Embedding (pMIME)
to construct networks of information flow

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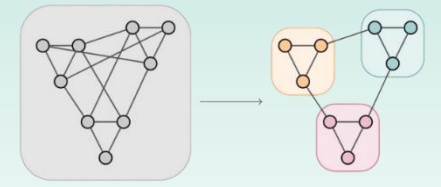
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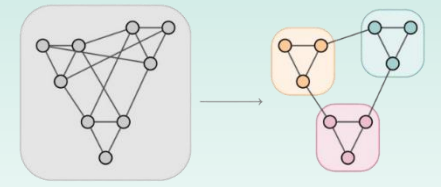


Results – Clusters

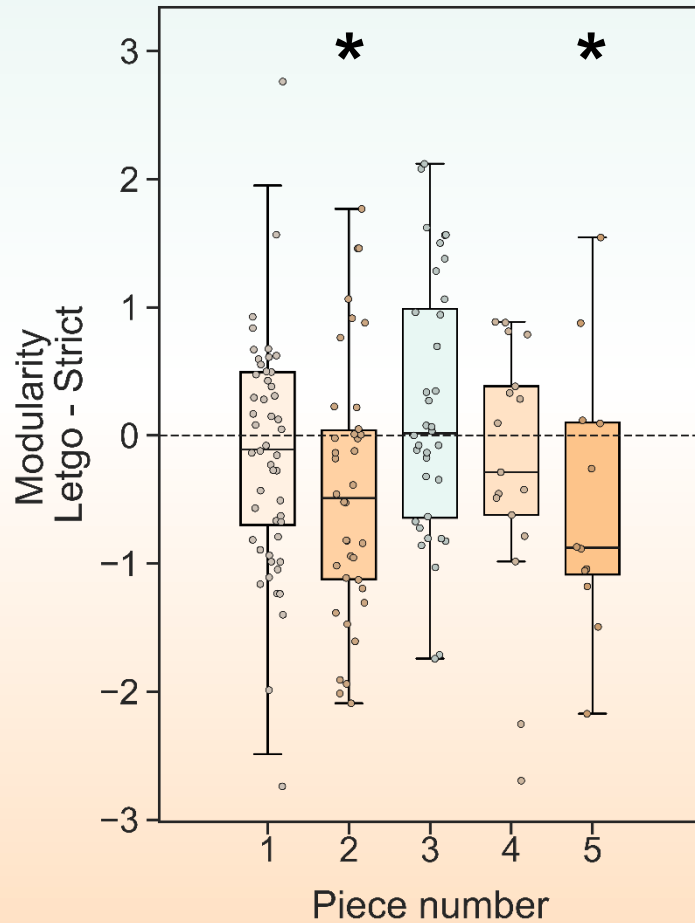


Community detection to identify clusters of increased interdependence

Results – Clusters

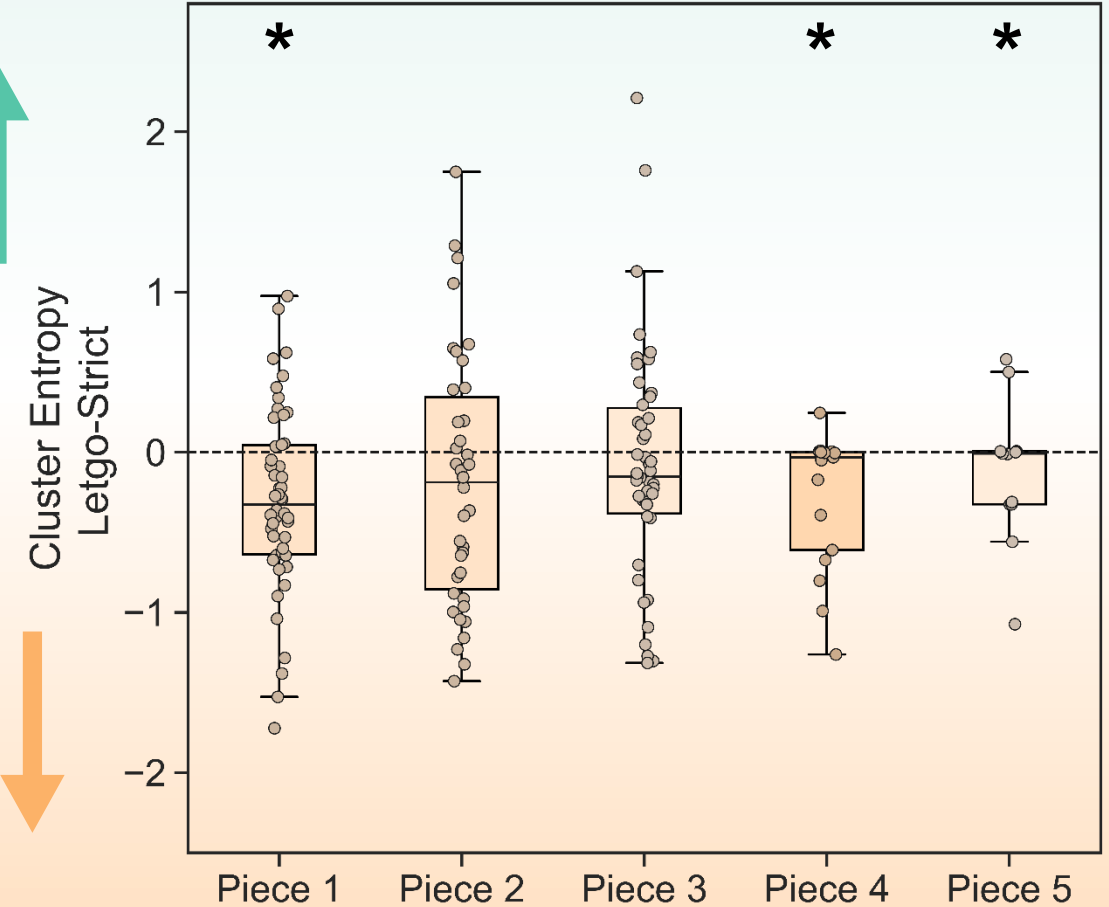
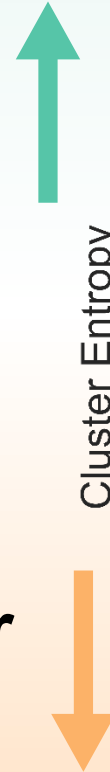


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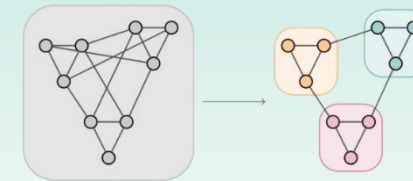


More modular
in **letgo**

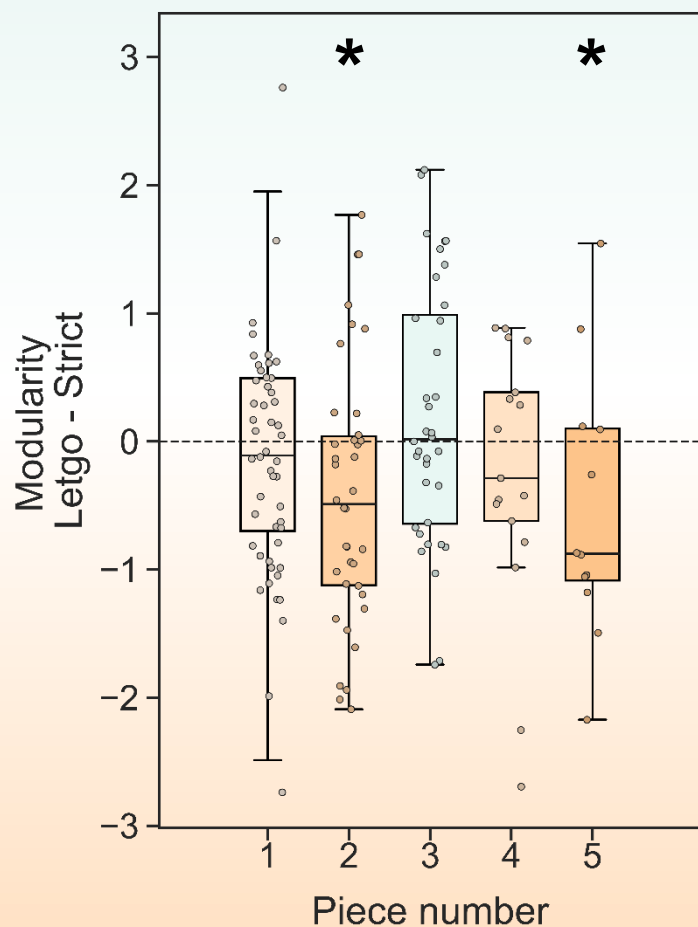
More modular
in **strict**



Results – Clusters



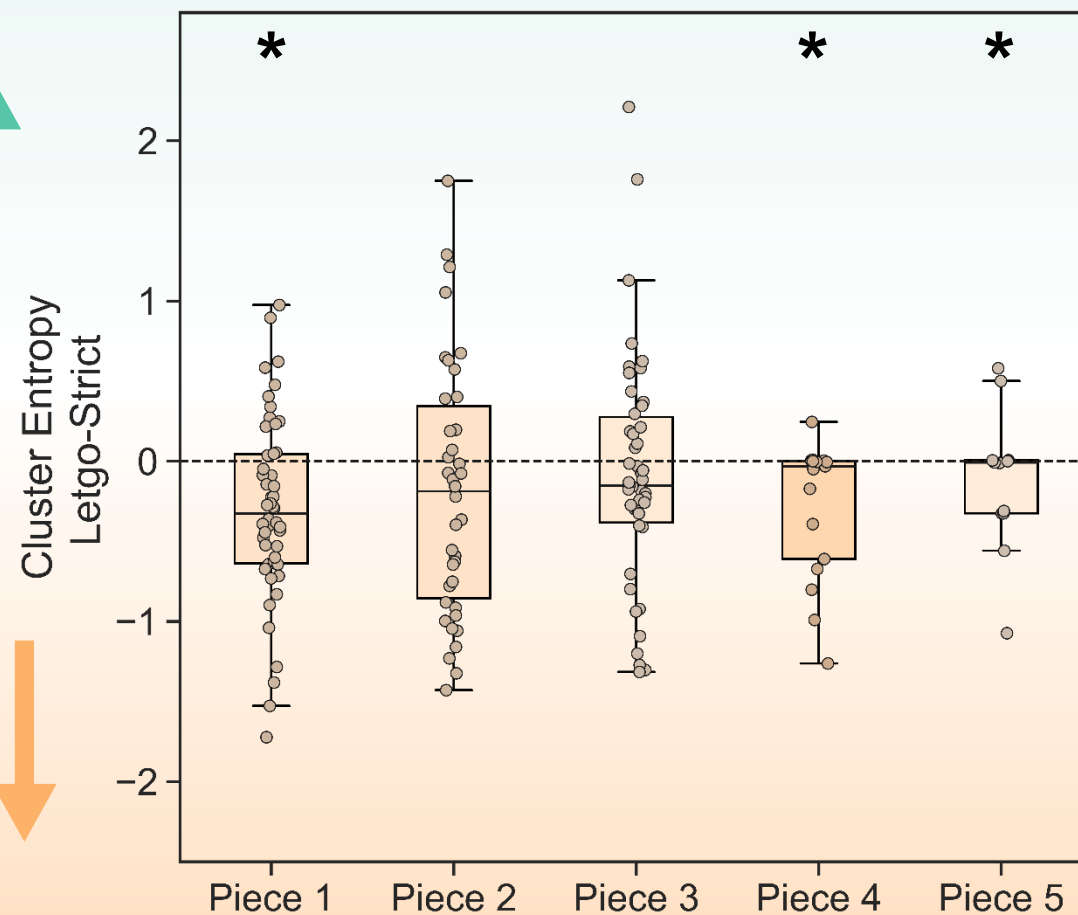
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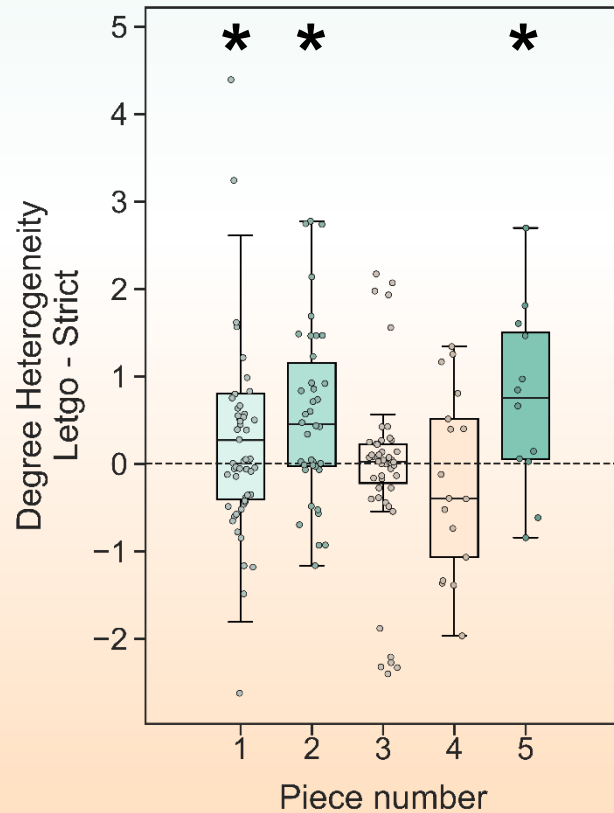
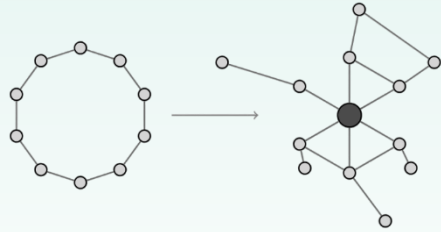
- Increased regional segregation in **strict** modes

Results – Network topology

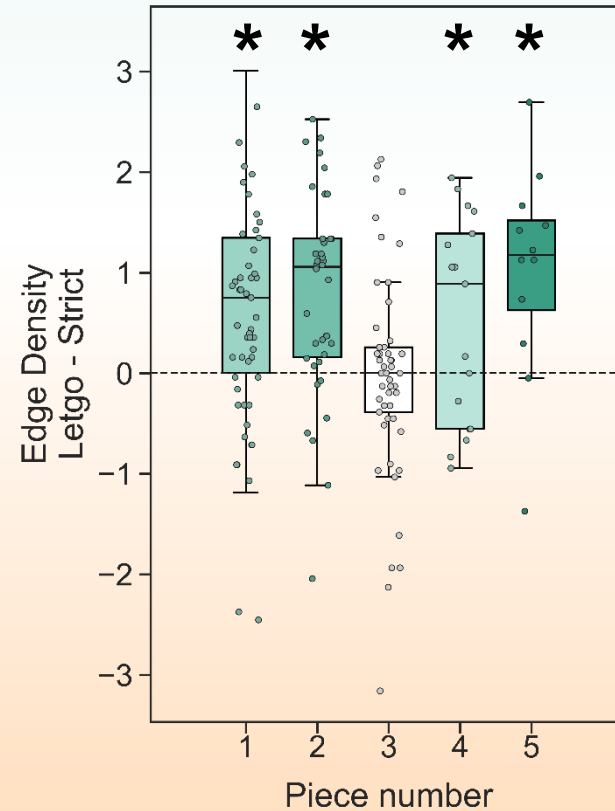
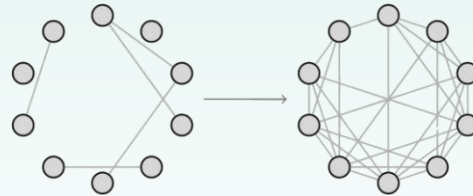
Network topology to explore brain connectivity and organisation

Results – Network topology

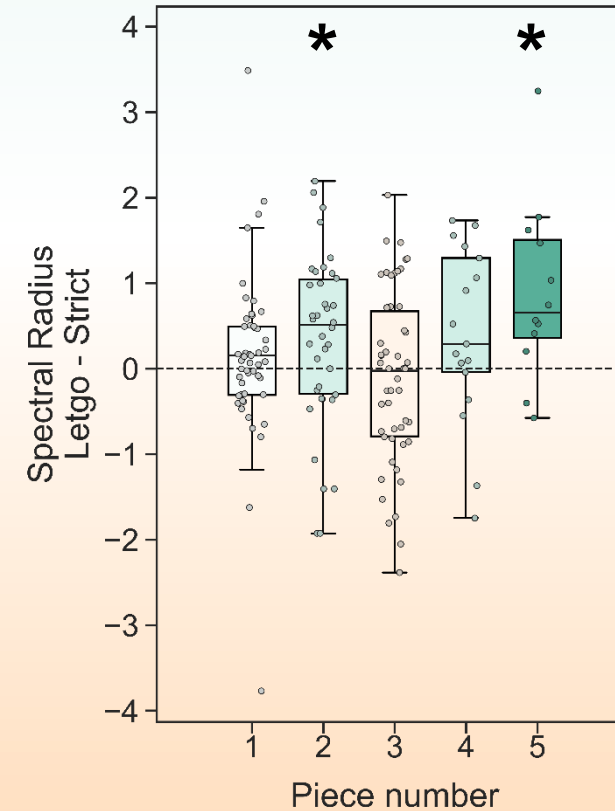
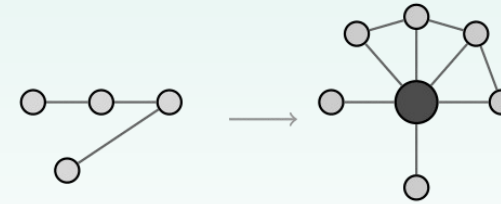
Degree heterogeneity



Edge density



Spectral Radius



Higher
letgo

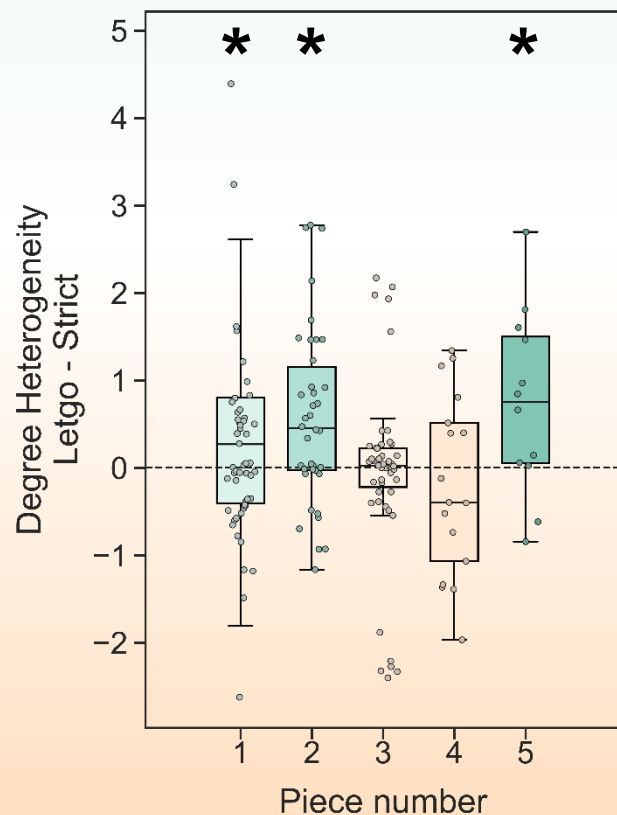
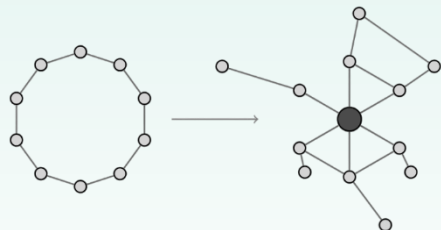


Higher
strict

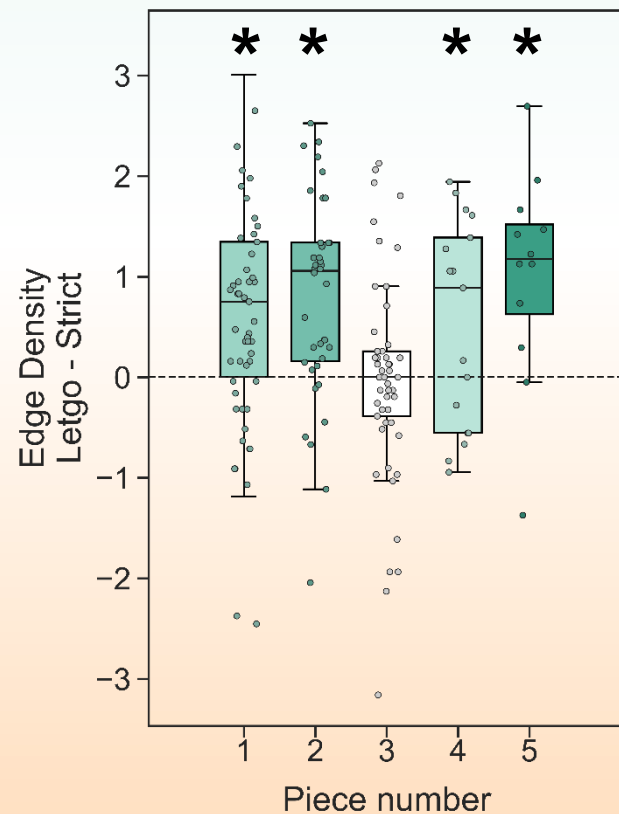
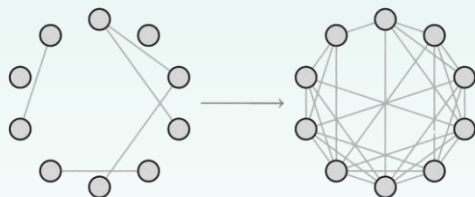


Results – Network topology

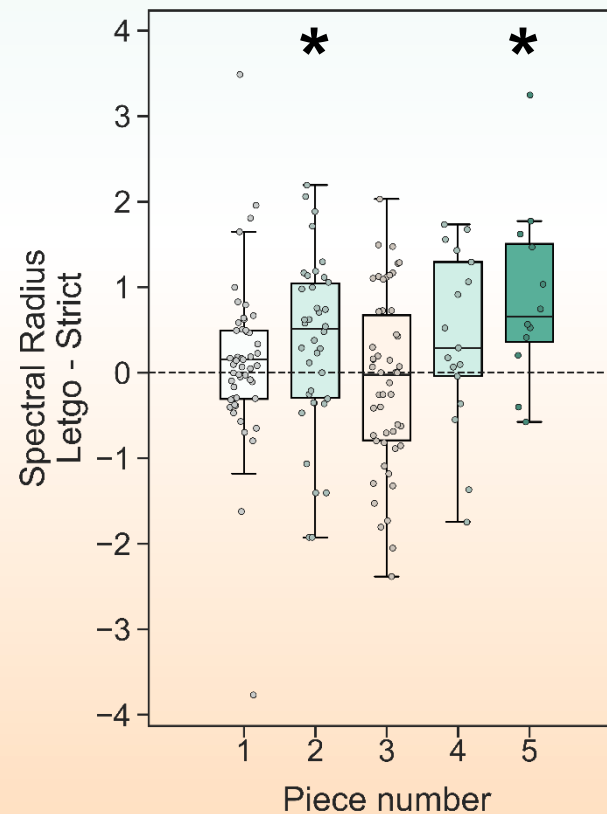
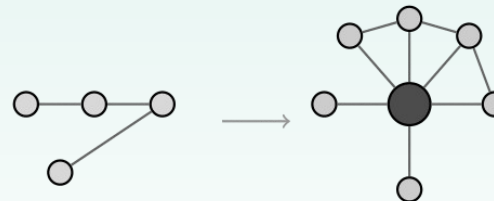
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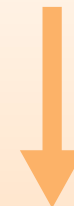
Spectral Radius



Higher
letgo



Higher
strict



- Increased connectivity and more integrated organisation in letgo

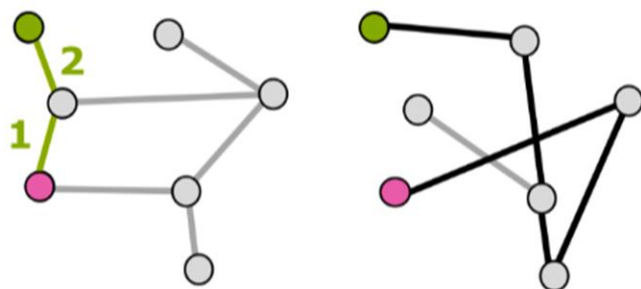
Results – Communication efficiency

Partial Network Decomposition to analyse shortest paths across multilayer networks

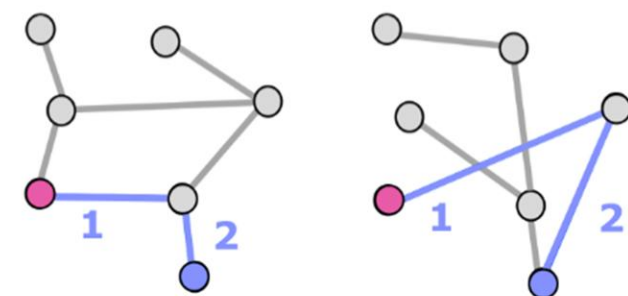
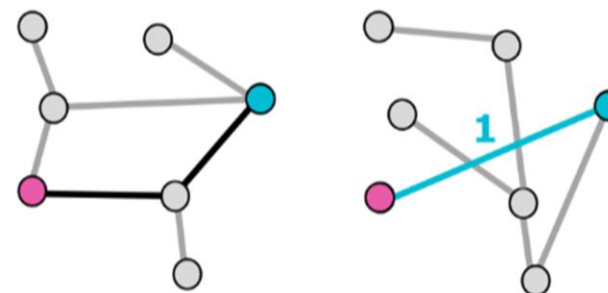
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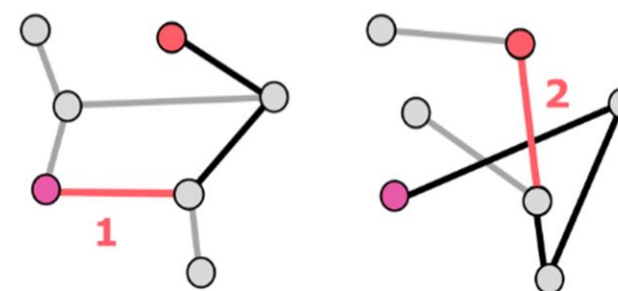
(A) Shortest path unique to Network A



(B) Shortest path unique to Network B



(C) Redundant shortest paths

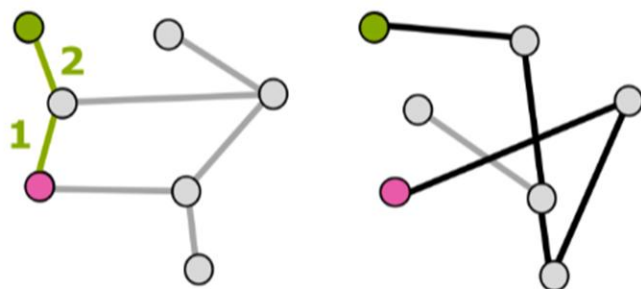


(D) Synergistic shortest path

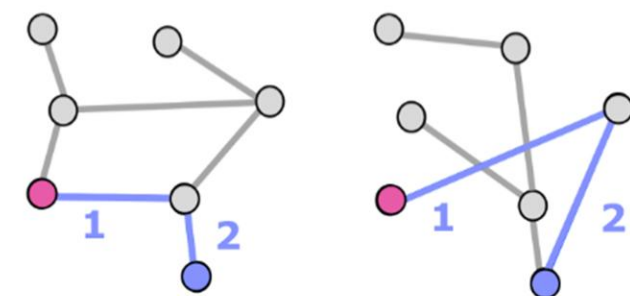
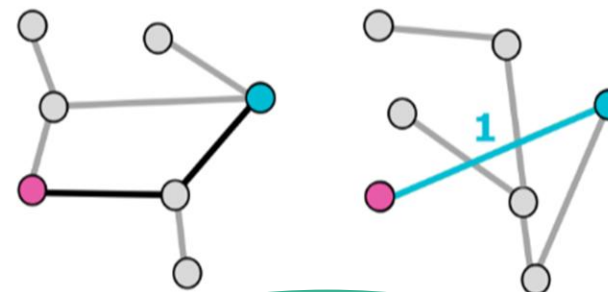
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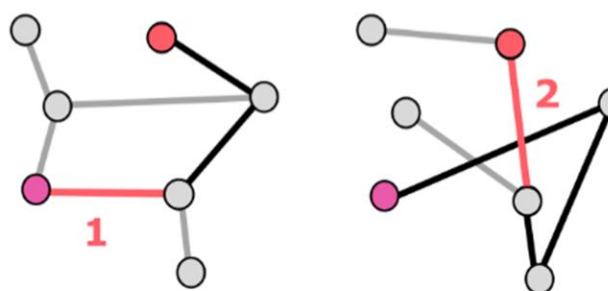
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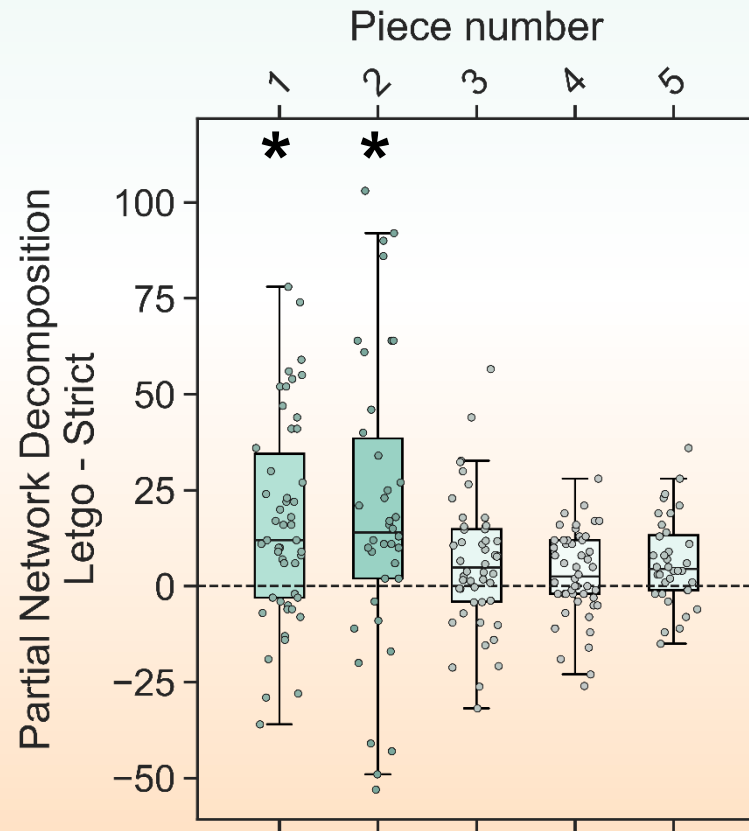
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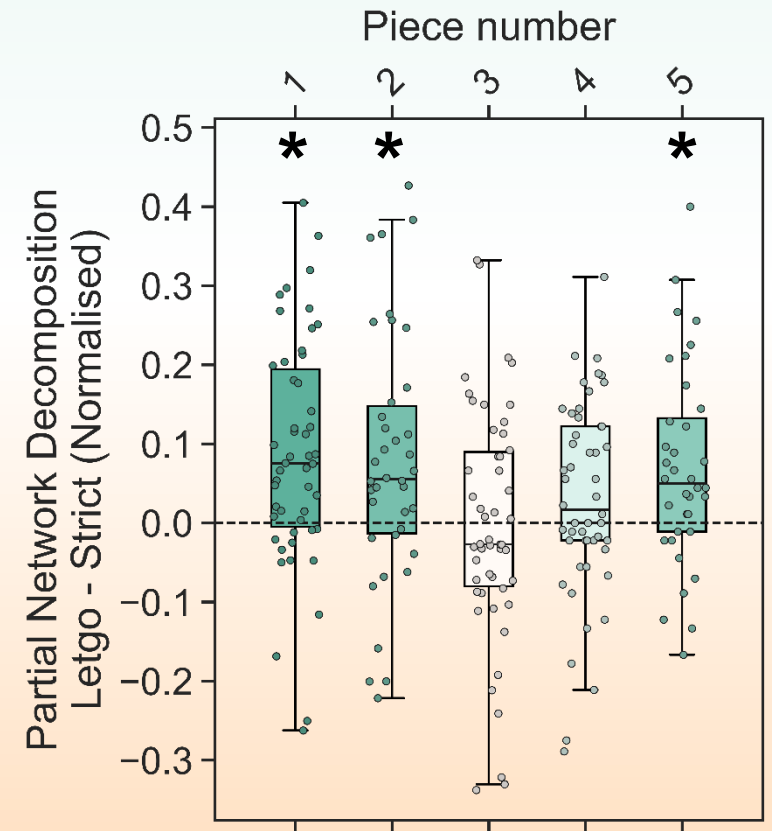
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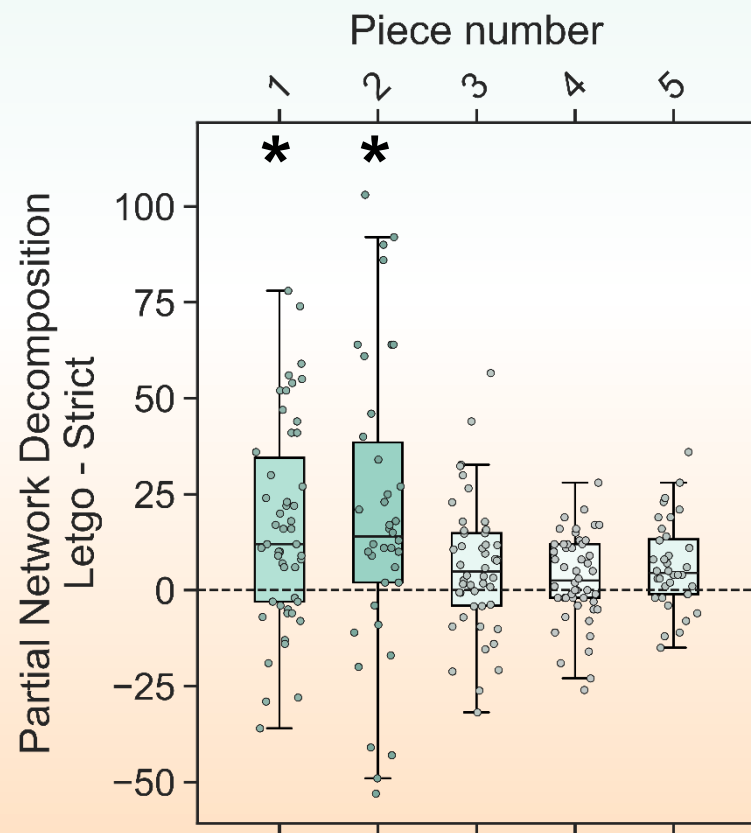
**More synergy
in letgo**

**More synergy
in strict**



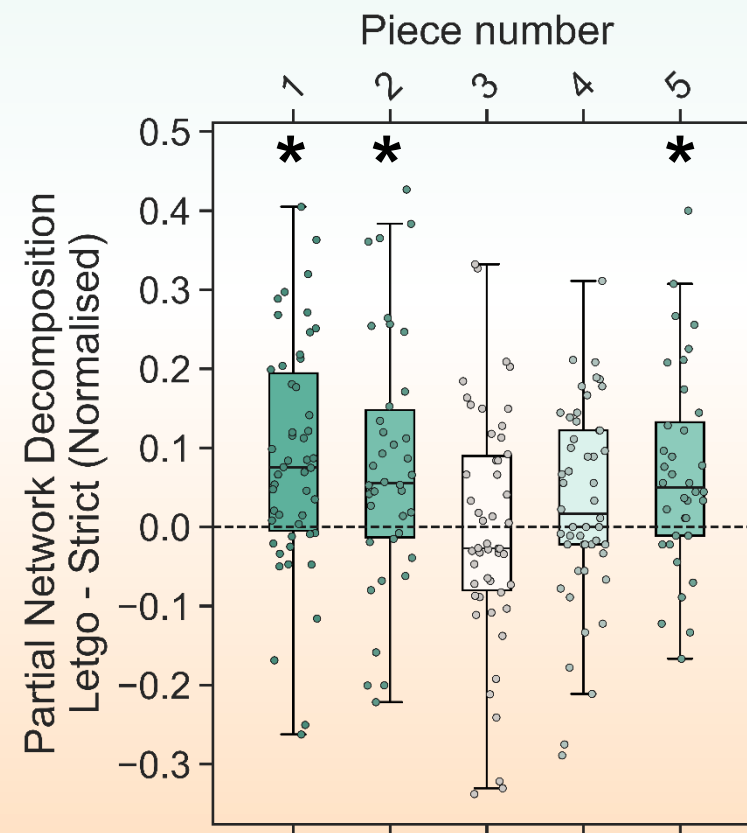
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**More synergy
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- **Letgo** states enhance synergistic information transmission

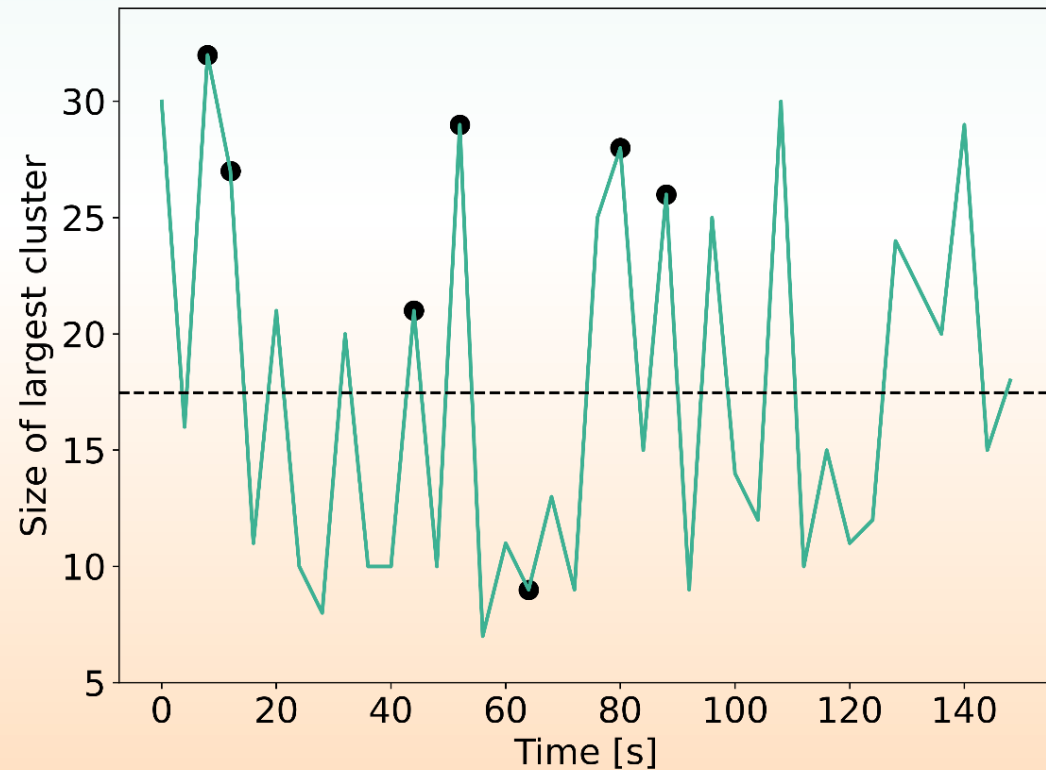
Bonus – Subjective experience

Moments of togetherness: occasions in which the musicians felt a particularly heightened shared musical experience

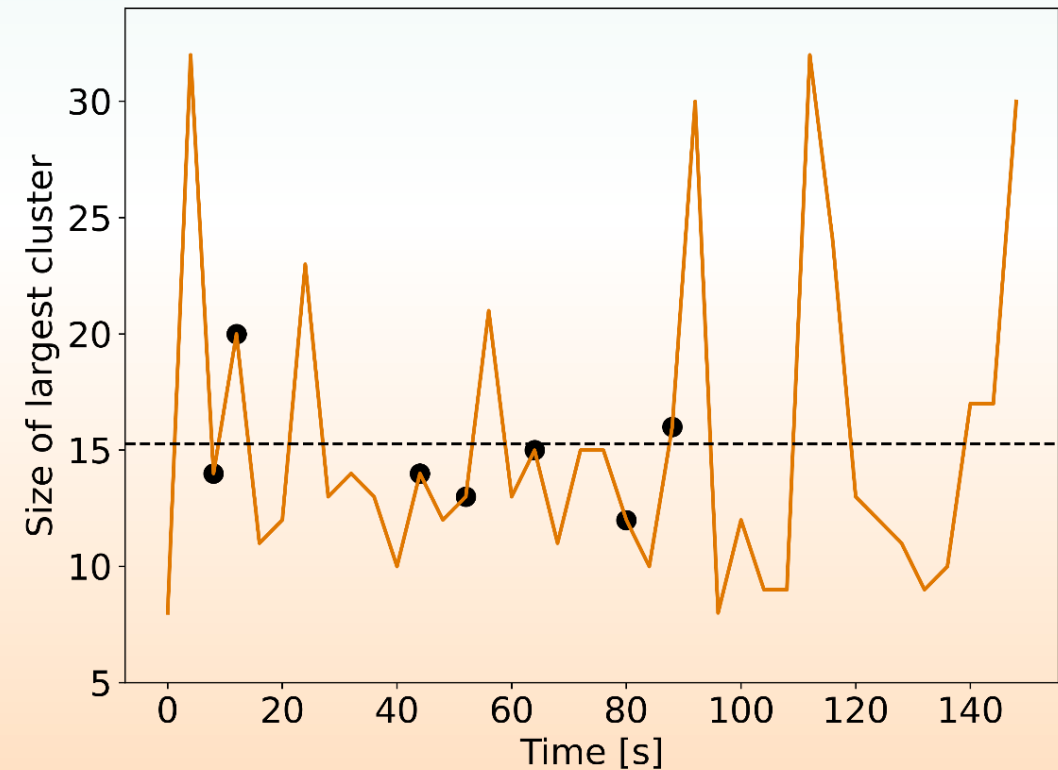
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Letgo

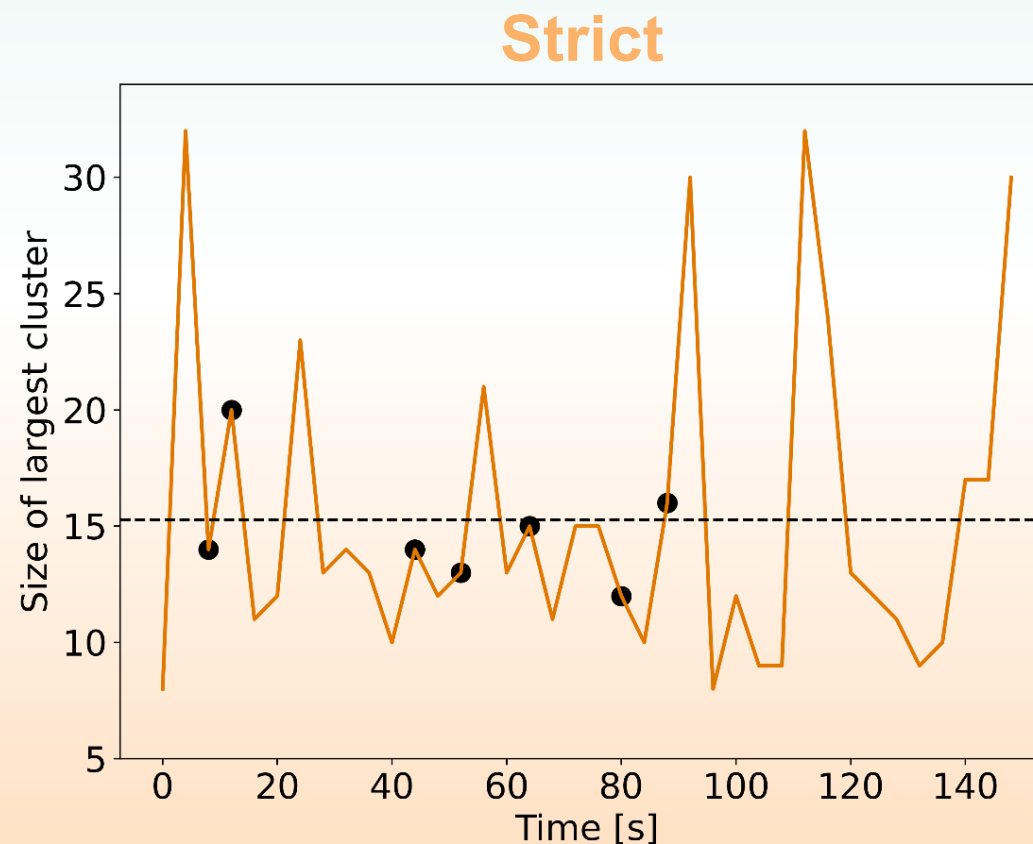
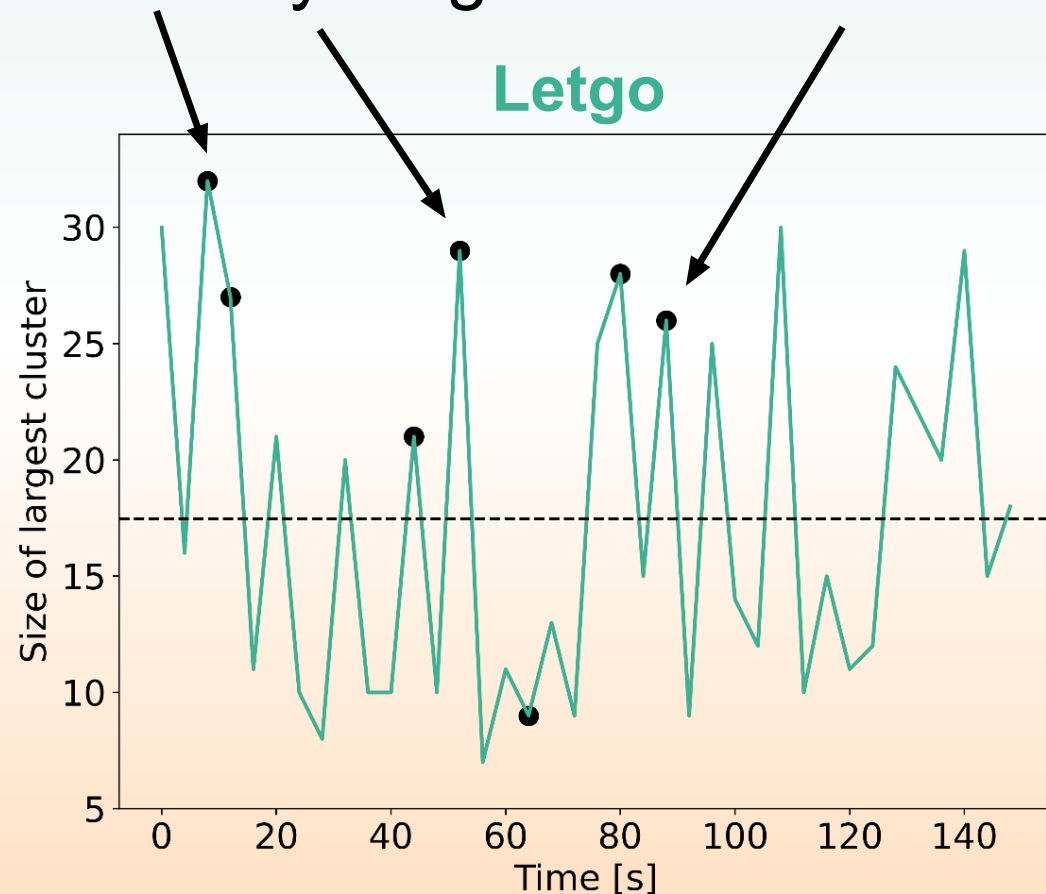


Strict



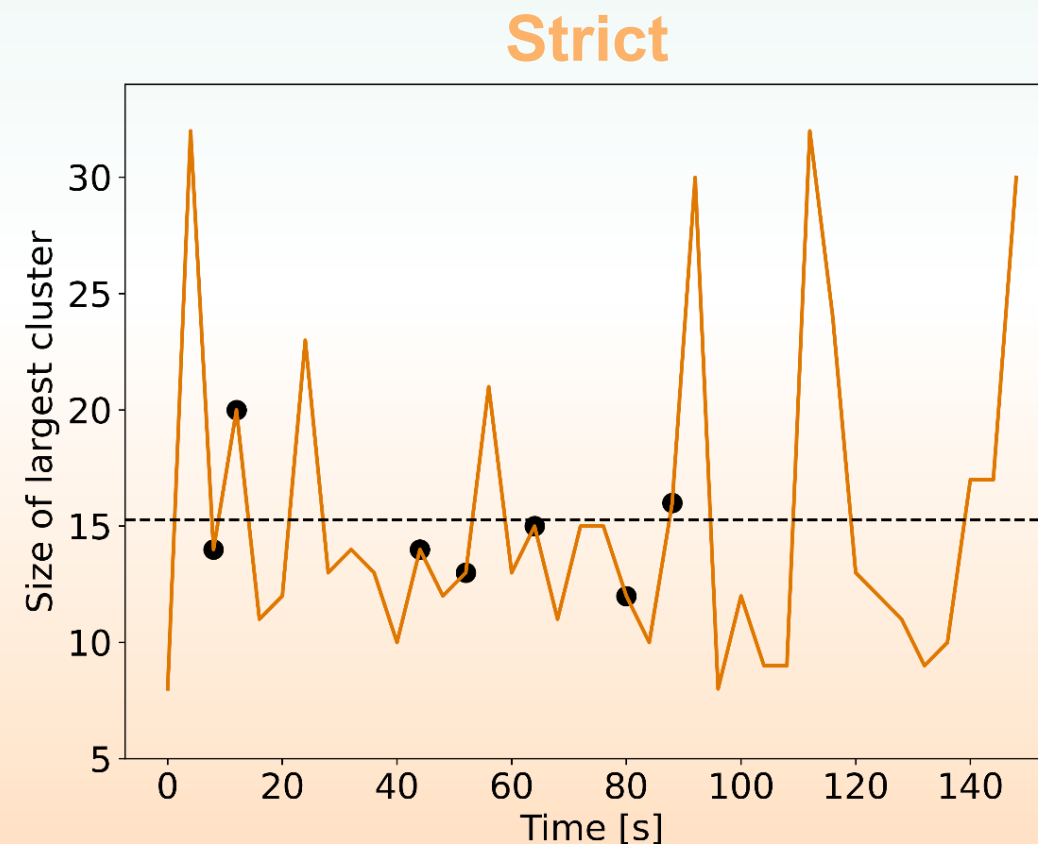
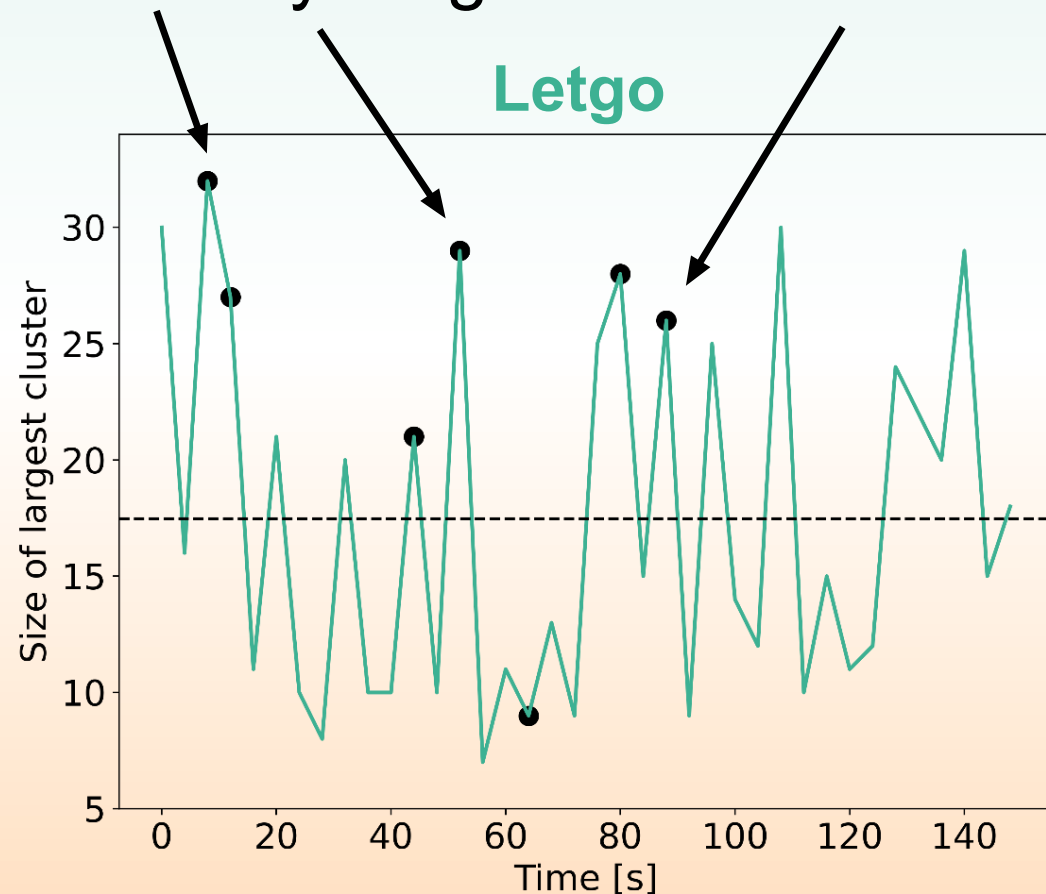
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Moments of togetherness: occasions in which the musicians felt a particularly heightened shared musical experience



- Agreement between clustering structure and subjective experience

Conclusions

Takeaway messages

- Richer dynamical activity during *letgo* performances (complexity)
- Increased brain **cooperation** during **improvisational** performances (community structure, connectivity synergistic paths)
- Correspondence between **community structures** and **subjective experience** (moments of togetherness)

Acknowledgments



Madalina Sas



Hardik Rajpal



Fernando Rosas



Pedro Mediano

Acknowledgments



Madalina Sas



Hardik Rajpal



Fernando Rosas



Pedro Mediano



Henrik Jensen

