



Hierarchical Auditory Prediction

I predict, therefore I am

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Background

The Bayesian brain

generates predictions about the sensorium

Is evolutionarily driven to make better and cleverer predictions

Hierarchy of increasing complexity

Each perceptual level makes predictions
And learns from its mistakes (prediction error)

Current thinking

Maybe the brain is *Bayes-optimal*

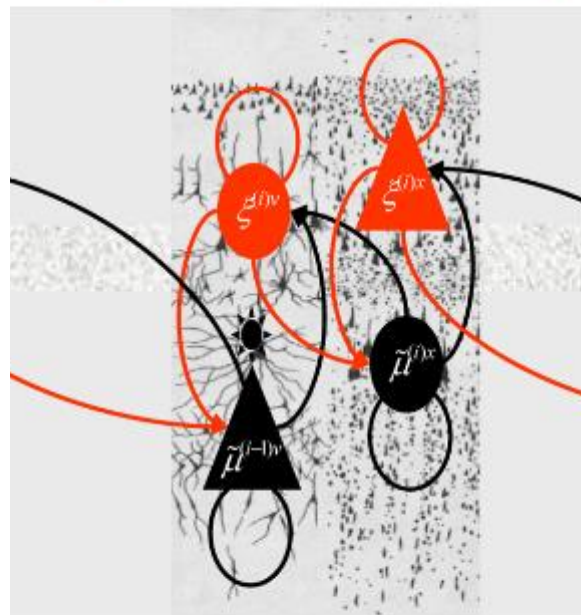


$$p(\text{beliefs}_{new}) = p(\text{data}_{new})$$
$$p(\text{beliefs}_{old})$$



Hierarchical Auditory Prediction

Forward prediction error



Layers I-III: Encode
pred. err. and cause
EEG

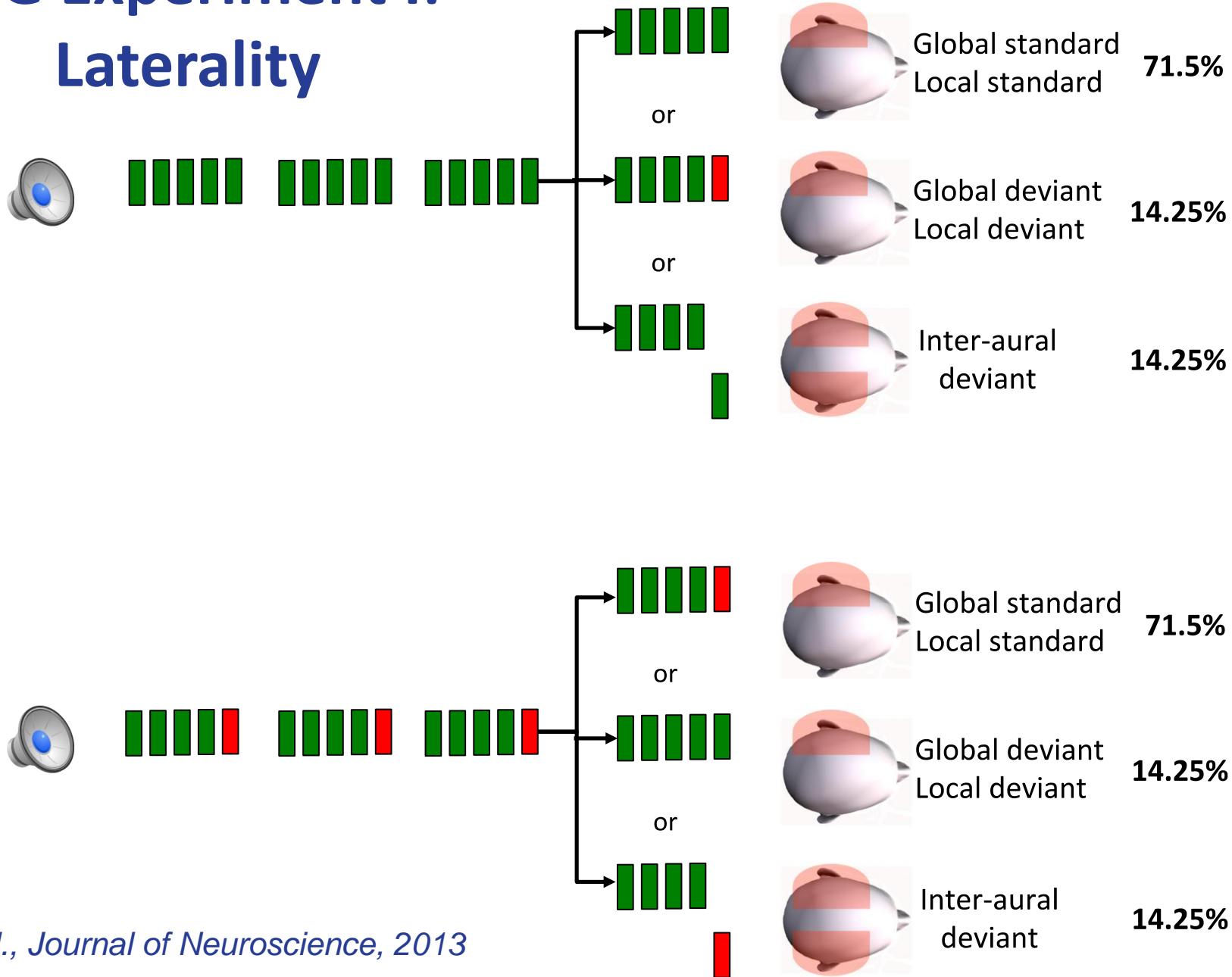
Layers V-VI:
Encode predictions

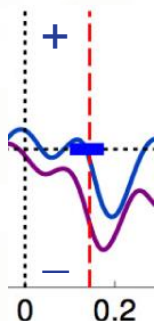
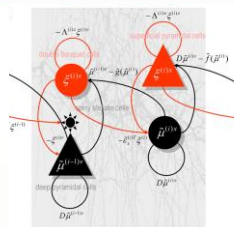
Backward predictions

Attention is the precision of prediction

Friston, 2008

EEG Experiment I: Laterality

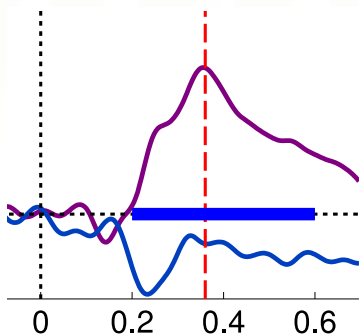
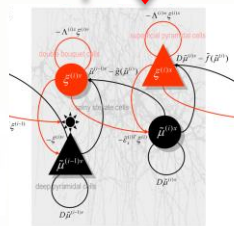




MMN (100-300ms)

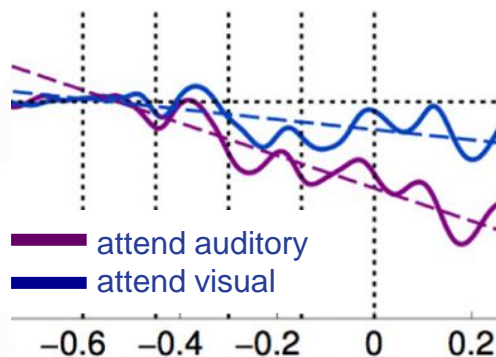
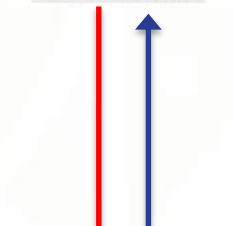
- Negativity indexing early prediction error
- Pre-attentual
- **Diminished** by top-down attention

— attend auditory
— attend visual



P300 (300-600ms)

- Positivity indexing late prediction error
- Accompanies conscious perception
- **Sharpened** by top-down attention



CNV (-600-0ms)

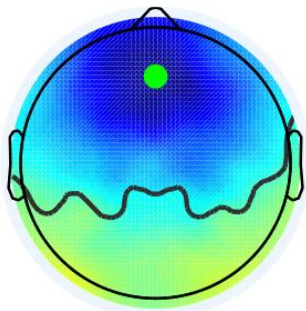
- Slow drift that indexes **expectation**
- Modulates attentional focus to facilitate perception

Chennu et al., 2013

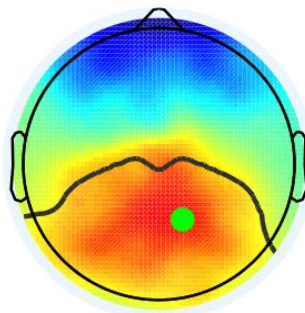


Topography

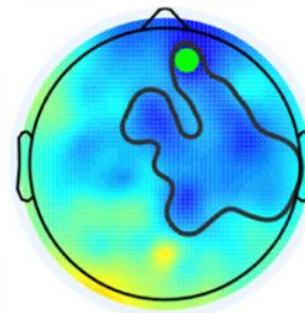
Local MMN



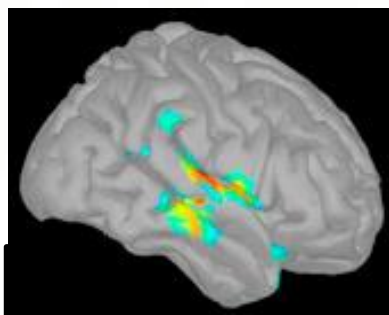
Global P300



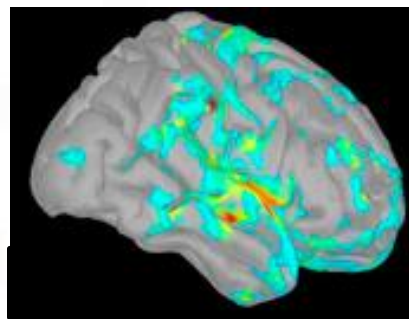
Expectation CNV



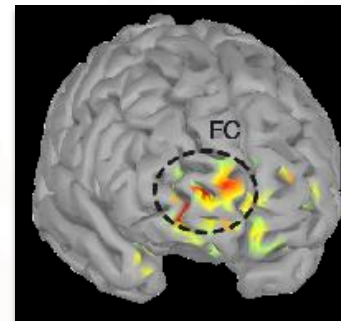
Sources



STG, TPJ, IFG

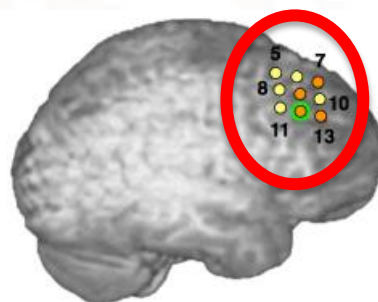
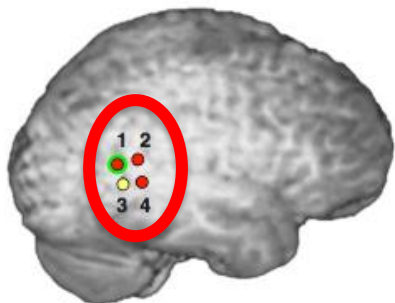


PFC, PPC



Frontal Pole

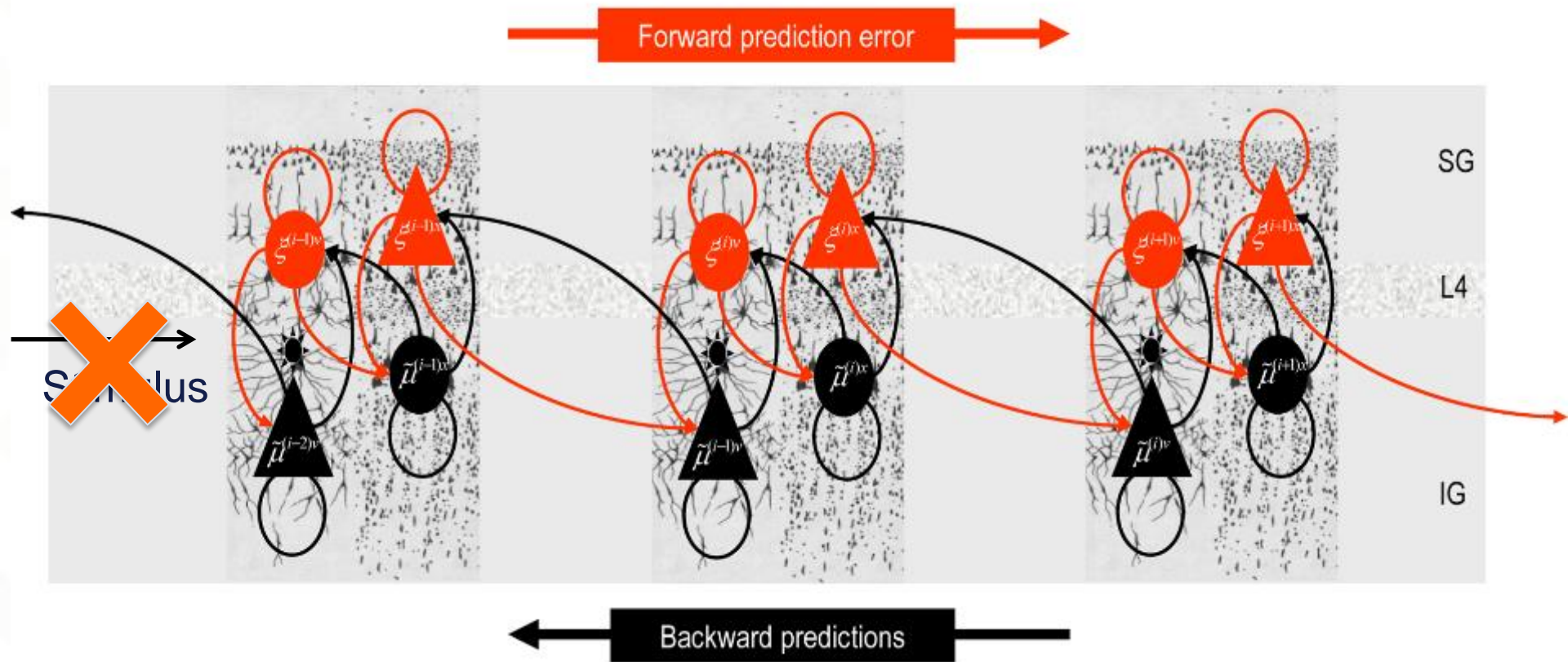
Intracranial



* Dehaene et al., 1998; Wacongne et al., 2011; Chennu et al., 2013



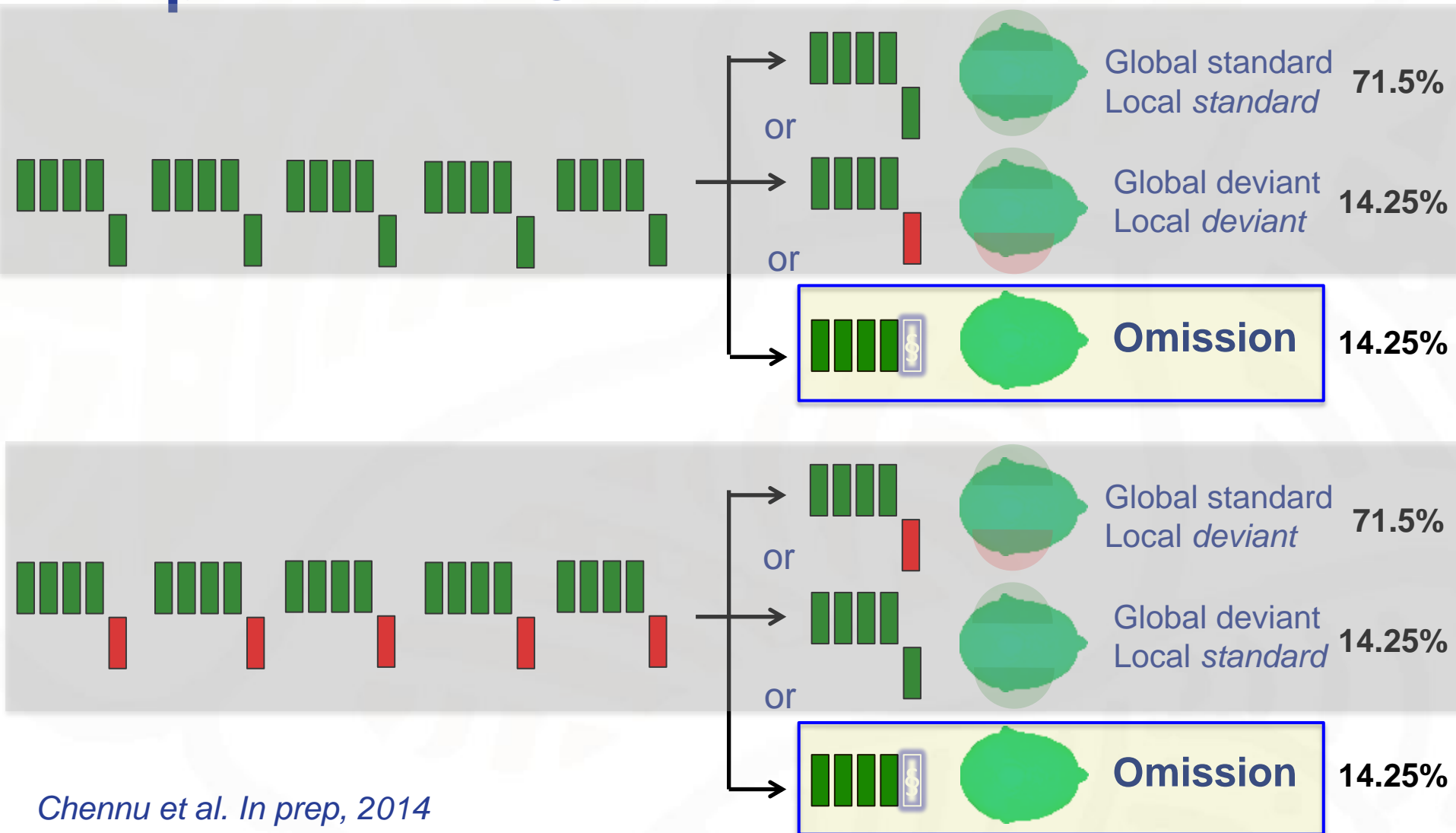
Hierarchical Auditory Prediction



Friston, 2008



Experiment II: Omissions

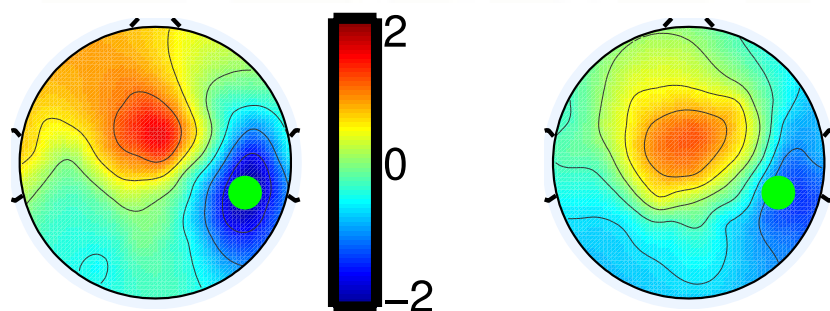


Chennu et al. In prep, 2014

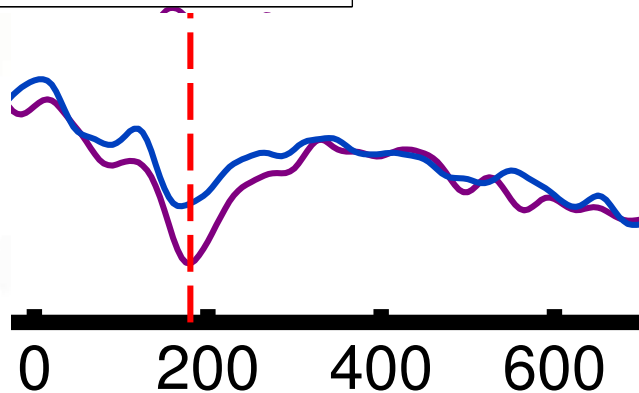


Omission-evoked Responses

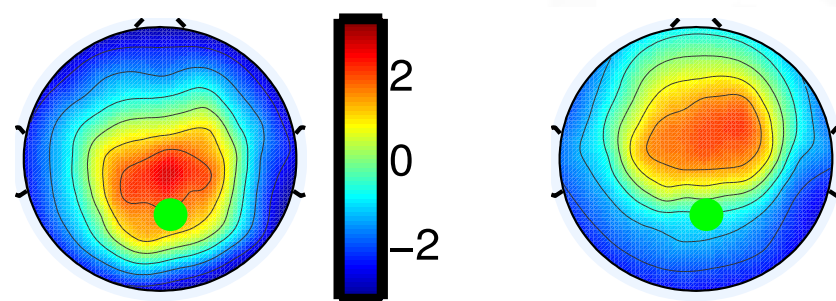
Modulating Attention



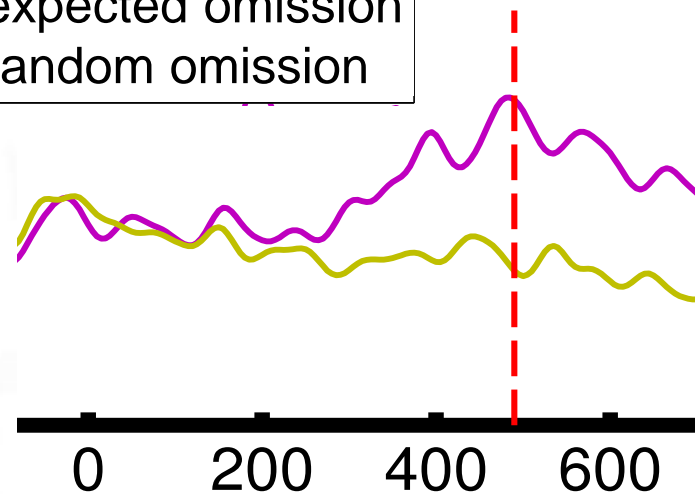
— attend auditory
— attend visual



Modulating Expectation

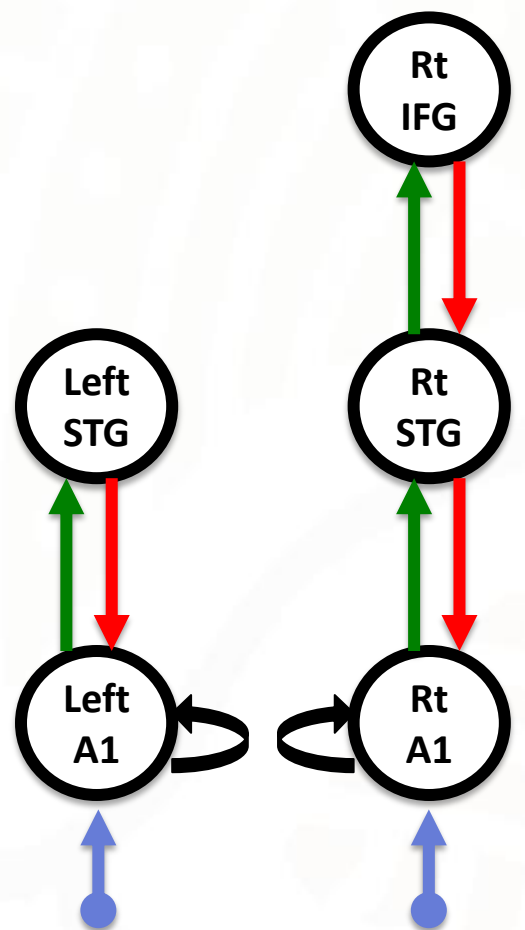


— expected omission
— random omission



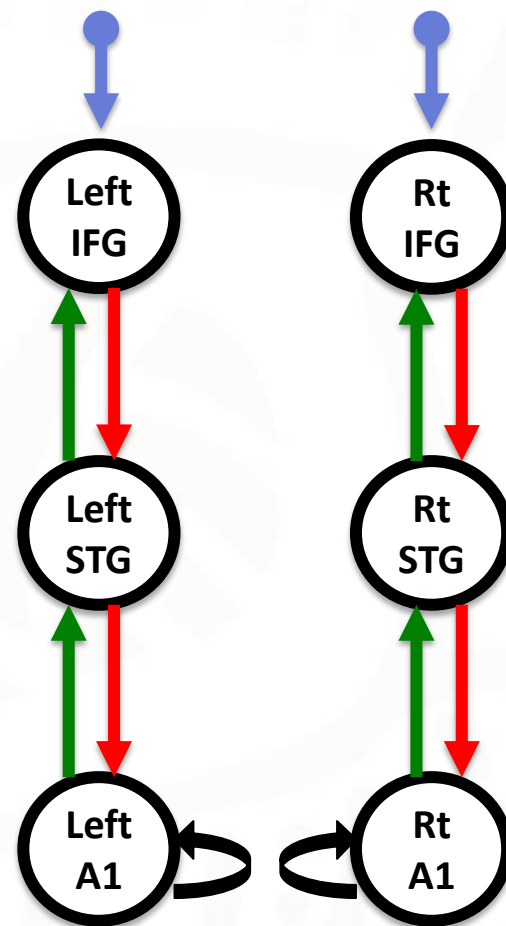


Dynamic Causal Modelling



Mismatch Negativity

Omission





Interim Summary

Hierarchical predictive coding theory

- **Prediction errors** flow upward
- **Predictions** (shaped by expectations) flow downward
- **Attention** as the precision of prediction

Integrating common ERP components

- The **MMN** is pre-attentional and *diminished* by expectation
- The **P300** is attention-dependant and *enhanced* by expectation
- The **CNV** is a fine-grained marker of this top-down expectation

Within this framework

- The omission is a response to the *absence* of an expected stimulus
- Hence a pure index of the expectation-driven prediction signal
- Which projects *downward* and interacts with attention

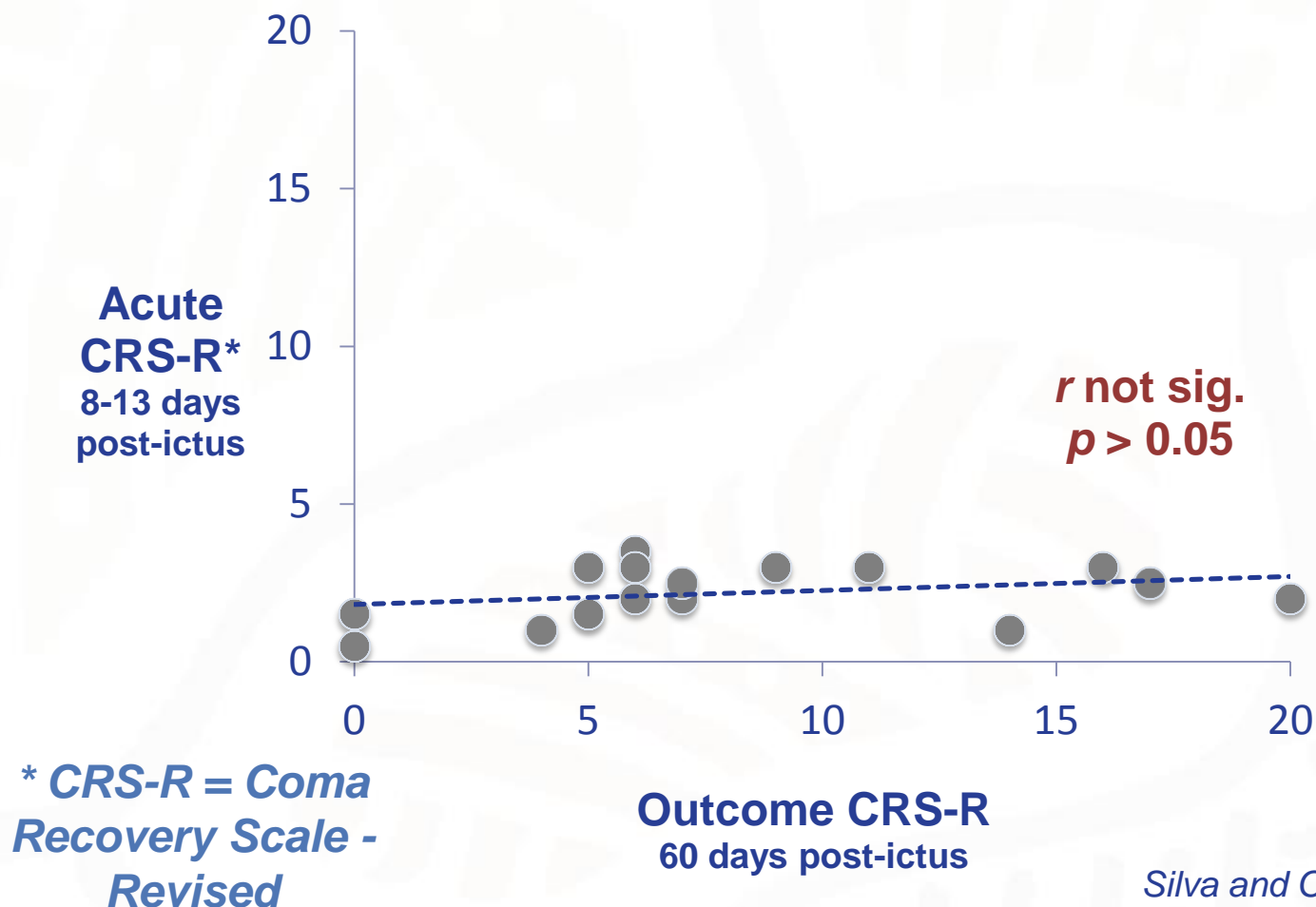


Applications in brain injury

- Prognosis
- Diagnosis



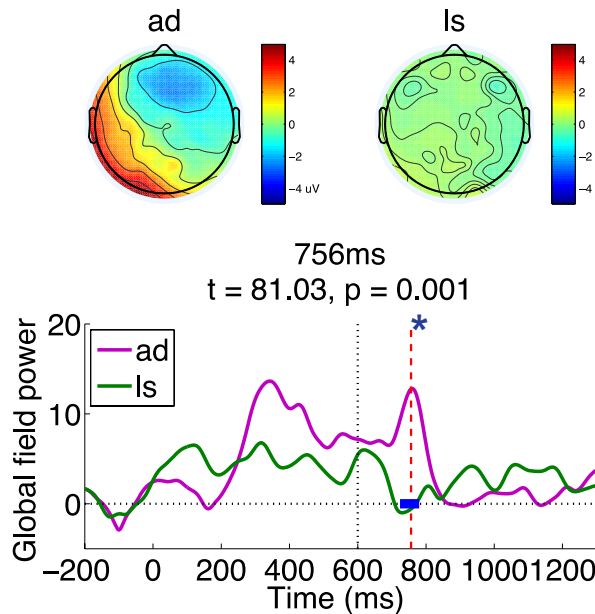
The Challenge



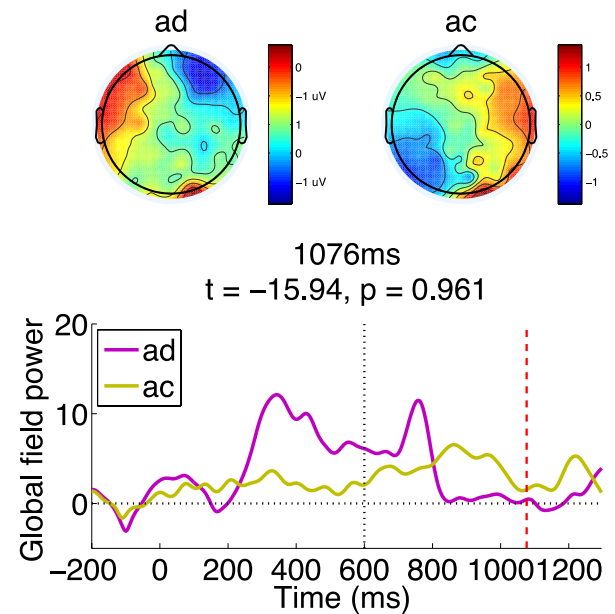
Silva and Chennu et al., in prep

Plum and Posner, 1982; Braakman et al., 1988; Choi et al., 1988; Yingling et al., 1990

**Coma Patient
Session 1
(CRS-R = 2)**

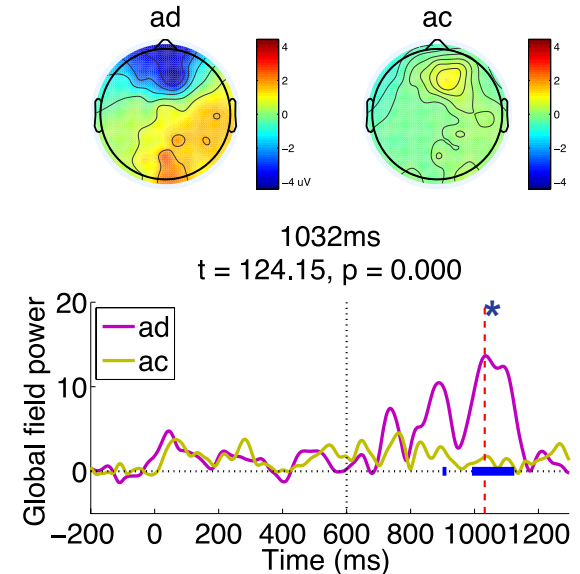
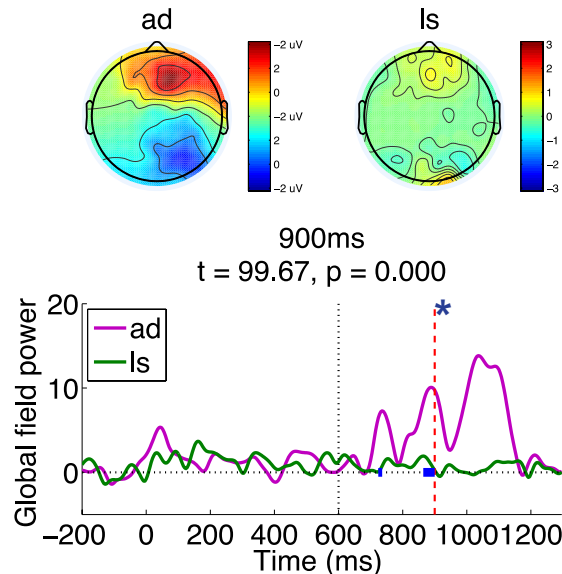


Local Effect (100-300ms)



Global Effect (300-600ms)

**Coma Patient
Session 2
(CRS-R = 2)**

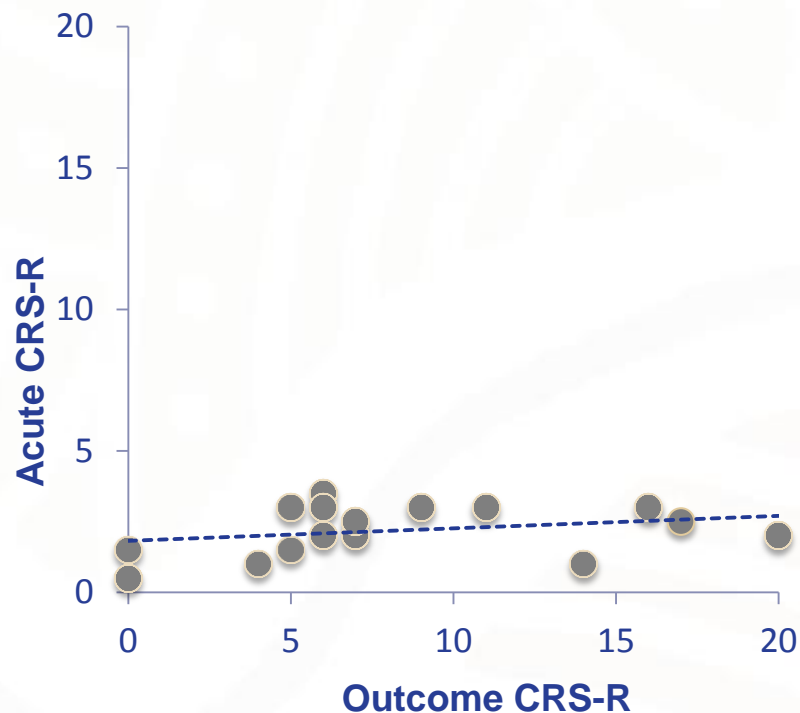


* Statistically significant with single-subject non-parametric **global field power (GFP)** analysis

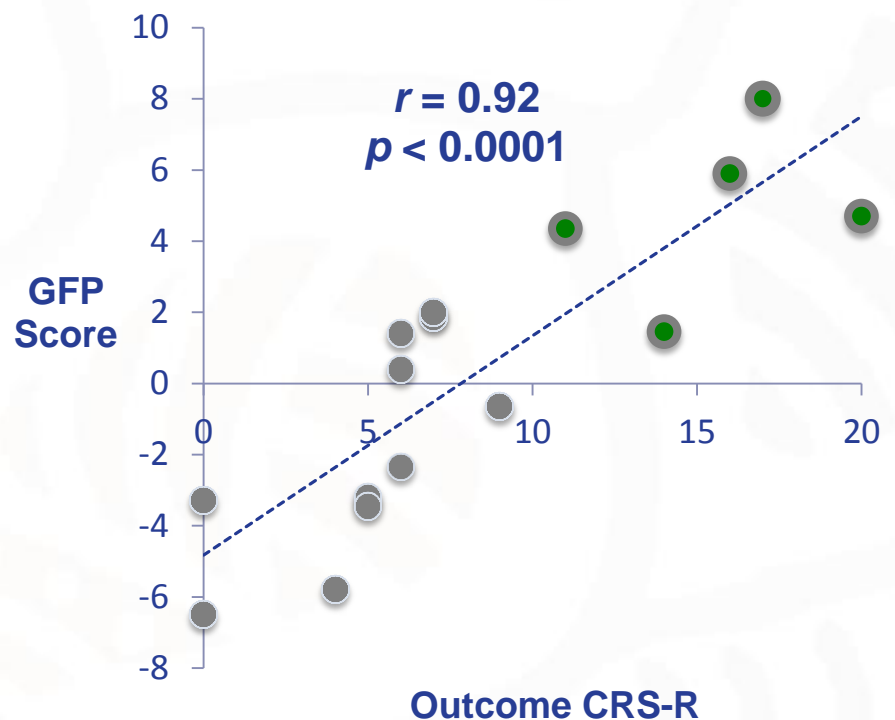


Acute Prognosis

Behaviour



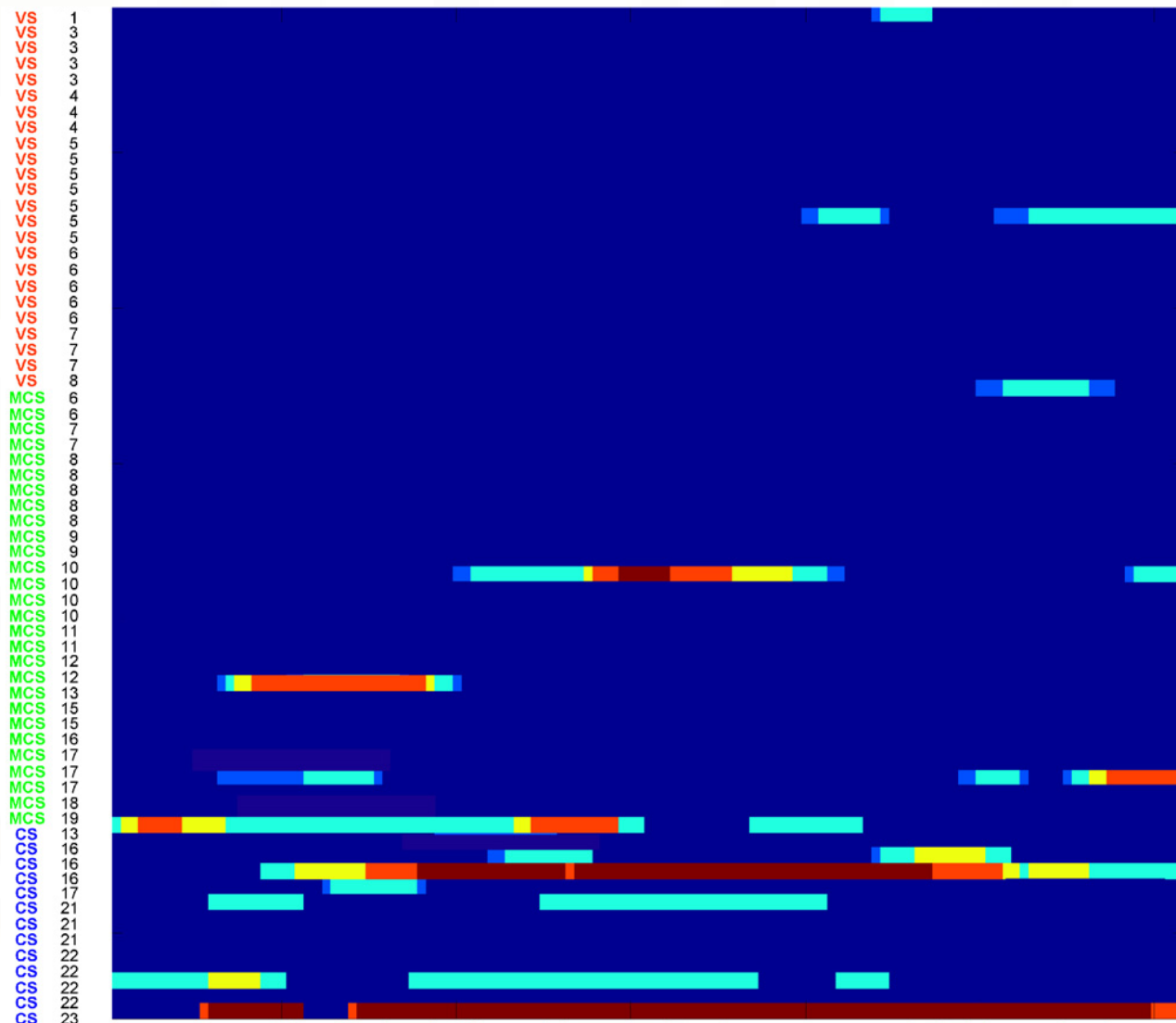
Local Effect



○ Statistically significant with single-subject non-parametric **global field power (GFP)** analysis



Chronic Diagnosis



Bekinschtein et al., 2009; Faugeras et al., 2012



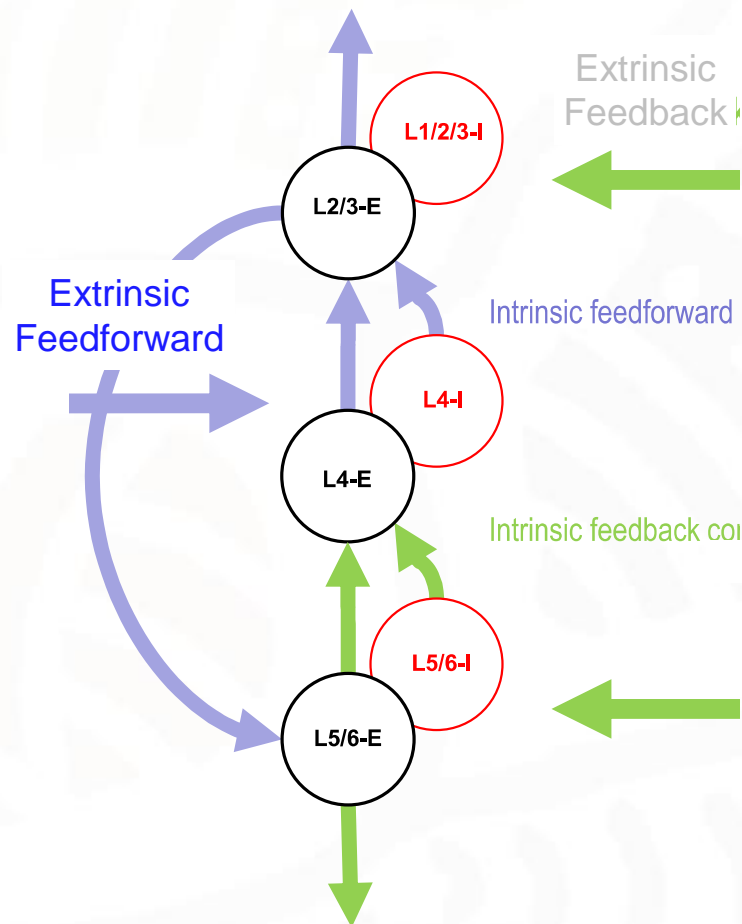
Why Does Prediction Matter?

For prognosis

Early prediction is temporally and spatially localised
Requires few cortical microcircuits
Presages the reestablishment of many more...

For diagnosis

Late prediction is temporally and spatially distributed
Engages many disparate microcircuits
Results in *interoceptive* state
externally akin to consciousness



Canonical Microcircuit for Predictive Coding

Bastos et al., 2012



Future Directions

Theoretical

Modeling failures of hierarchical prediction

Detailed understanding of the link between prediction and consciousness

Clinical

Quantitative control of EEG quality

Closed-loop calibration of derived ERP scores

Single-trial decoding, complexity analysis



Thanks!



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**Division of Anaesthesia
University of Cambridge**



Prof. David Menon



Dr. Tristan A. Bekinschtein

**MRC Cognition and Brain Sciences Unit
Cambridge**



Prof. John Pickard

**Division of Neurosurgery
University of Cambridge**



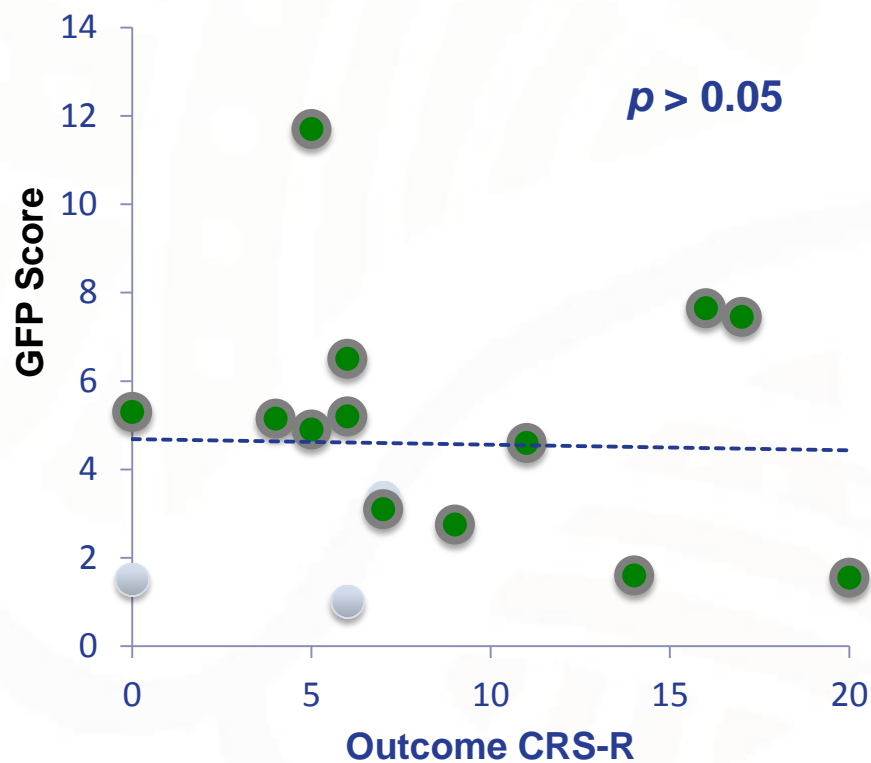
Dr. Adrian M. Owen

**The Brain and Mind Institute
University of Western Ontario**

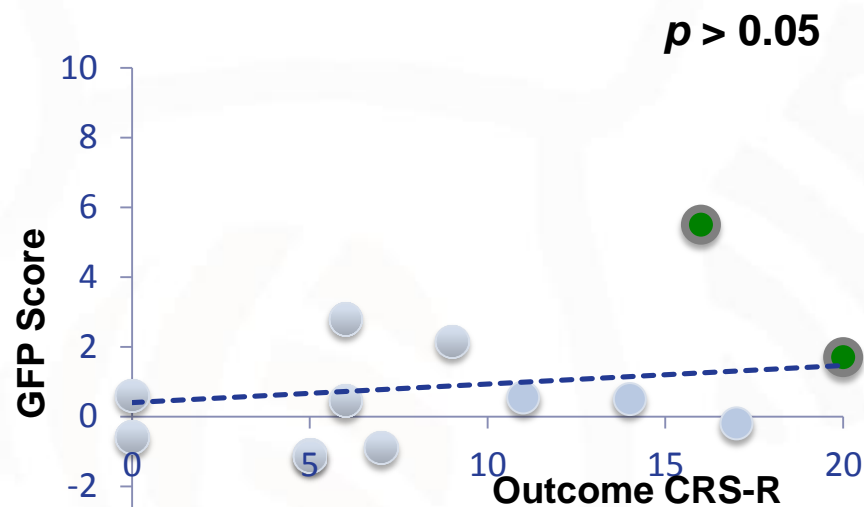


Prognosis

Primary Auditory Effect



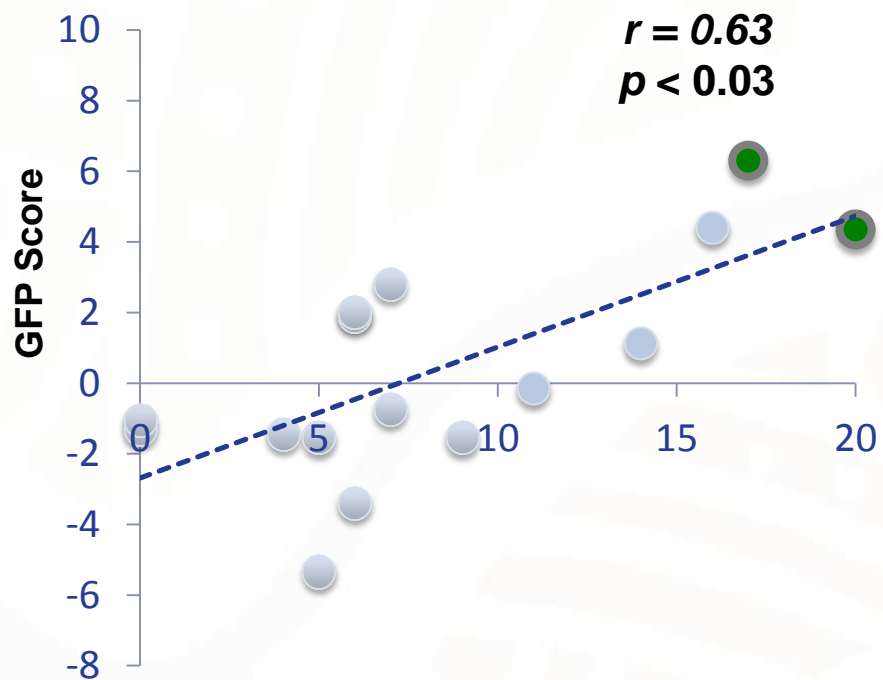
Interaural Global Effect





Prognosis

Monaural Local Effect



Monaural Global Effect

