



# Cognitive Neuroimaging, Predictive Coding, and Unifying Theories of the Brain

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*Edinburgh – 16 June 2010*





**3T – MRI**  
Siemens Tim  
32 channel

**TMS - EEG**  
128 channel  
MR compatible

**MEG –**  
**Biomag 4D**  
248-channel  
magnetometer



## people

### Principle investigators:

Pascal Belin

Roberto Caldara

Simon C. Garrod

Marie-Hélène Grosbras

Joachim Gross

Klaus Kessler

Hartmut Leuthold

Lars Muckli

Guillaume A. Rousselet

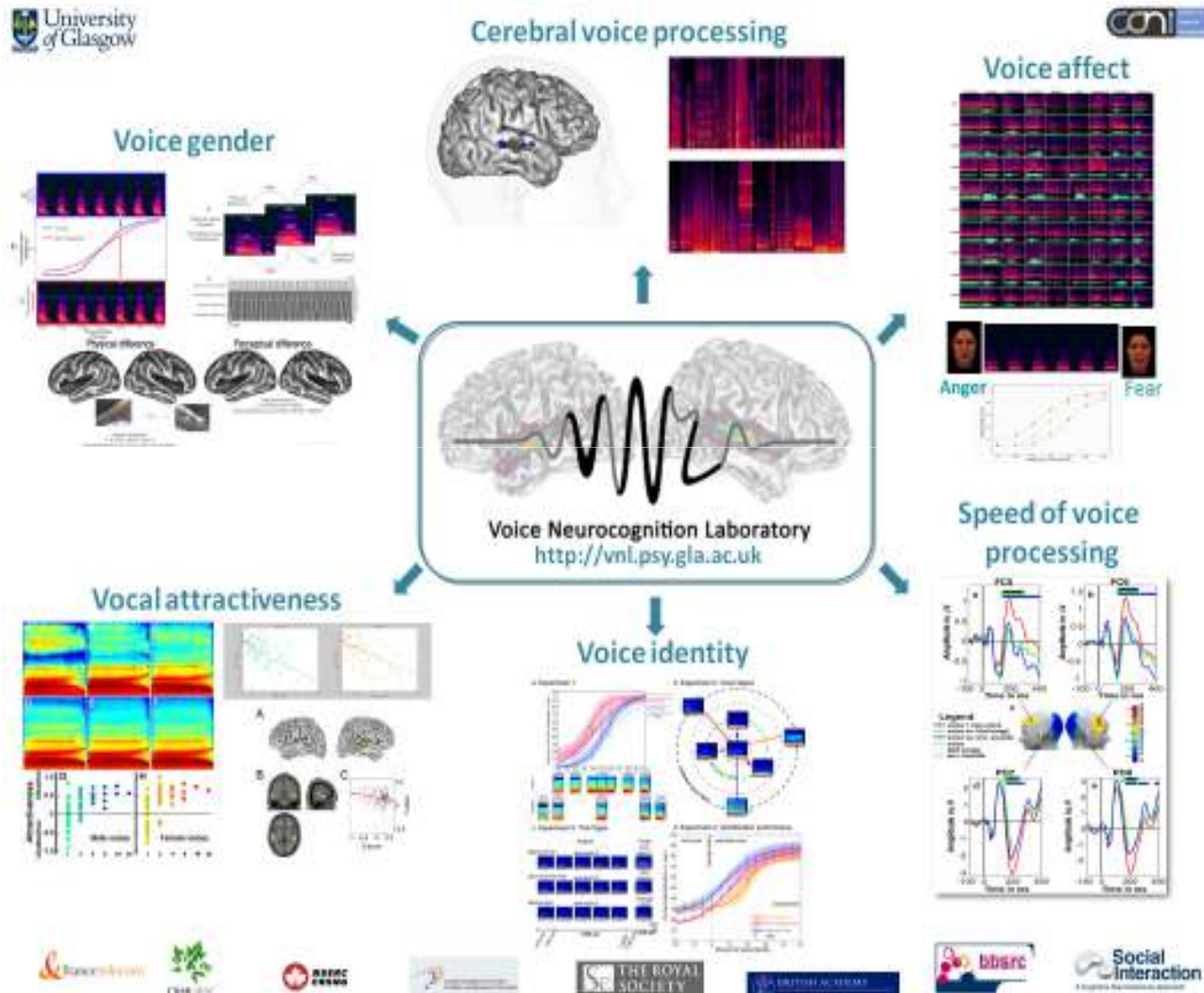
Philippe G. Schyns

Gregor Thut

## mission

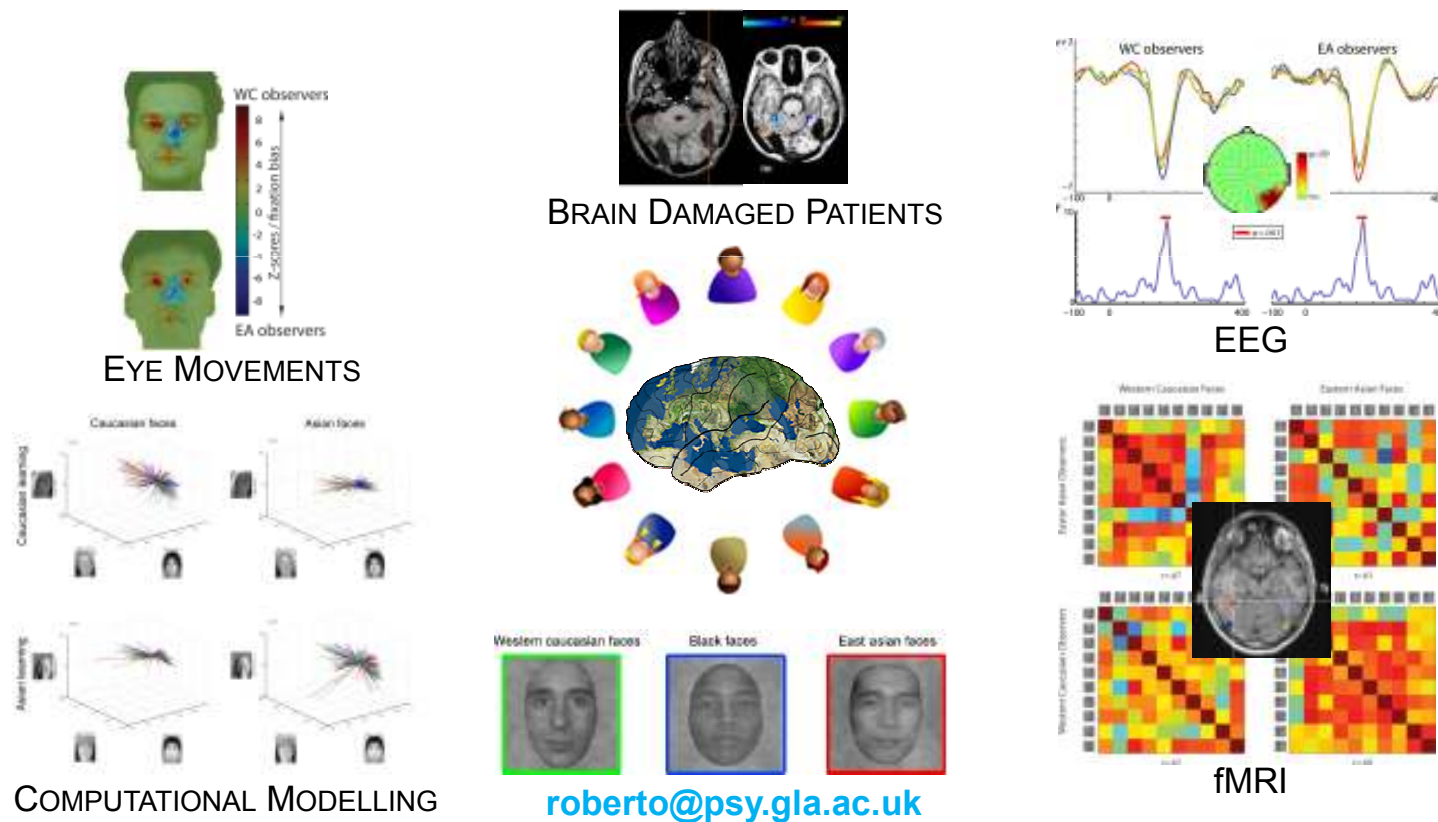
...to advance the understanding of the complex relationship between the brain, cognition and behaviour at multiple levels of analysis







We aim at mapping human diversity and understanding how **culture** and **race** modulate visual and social cognition, by using a **multidisciplinary approach**



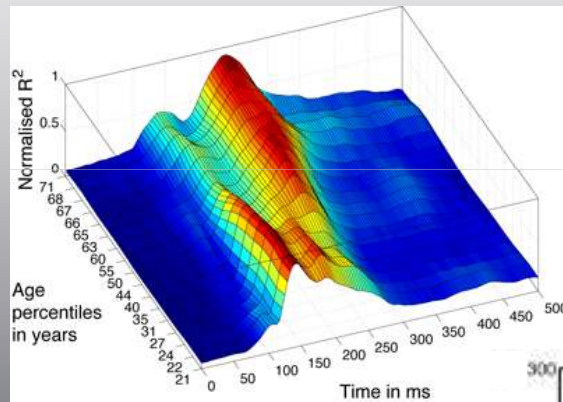


University of Glasgow Department of Psychology

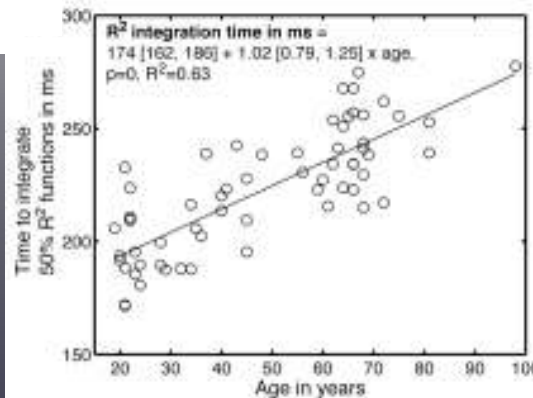


## Single-trial parametric GLM of EEG data

Guillaume A. Rousselet & Cyril R. Pernet



**age-related delay in  
EEG sensitivity to  
phase noise**



Rousselet, Pernet et al.

*BMC Neuroscience* 2008

*BMC Neuroscience* 2009

*Frontiers in Perception Science* 2010

[g.rousselet@psy.gla.ac.uk](mailto:g.rousselet@psy.gla.ac.uk)

**Research Interest:**

Large-scale neural communication

Role of neural oscillations in cognition

Conscious perception

**Methods:**

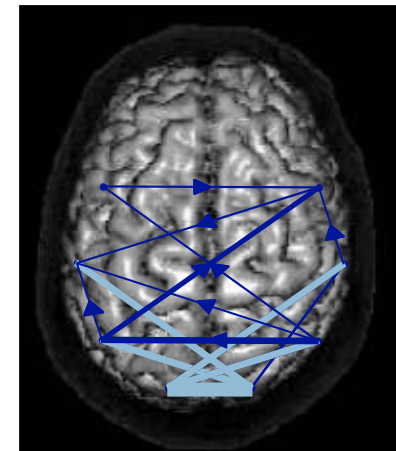
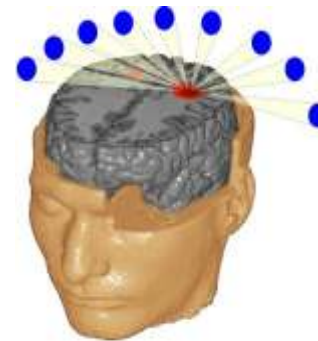
Magnetoencephalography (MEG)

Spectral analysis

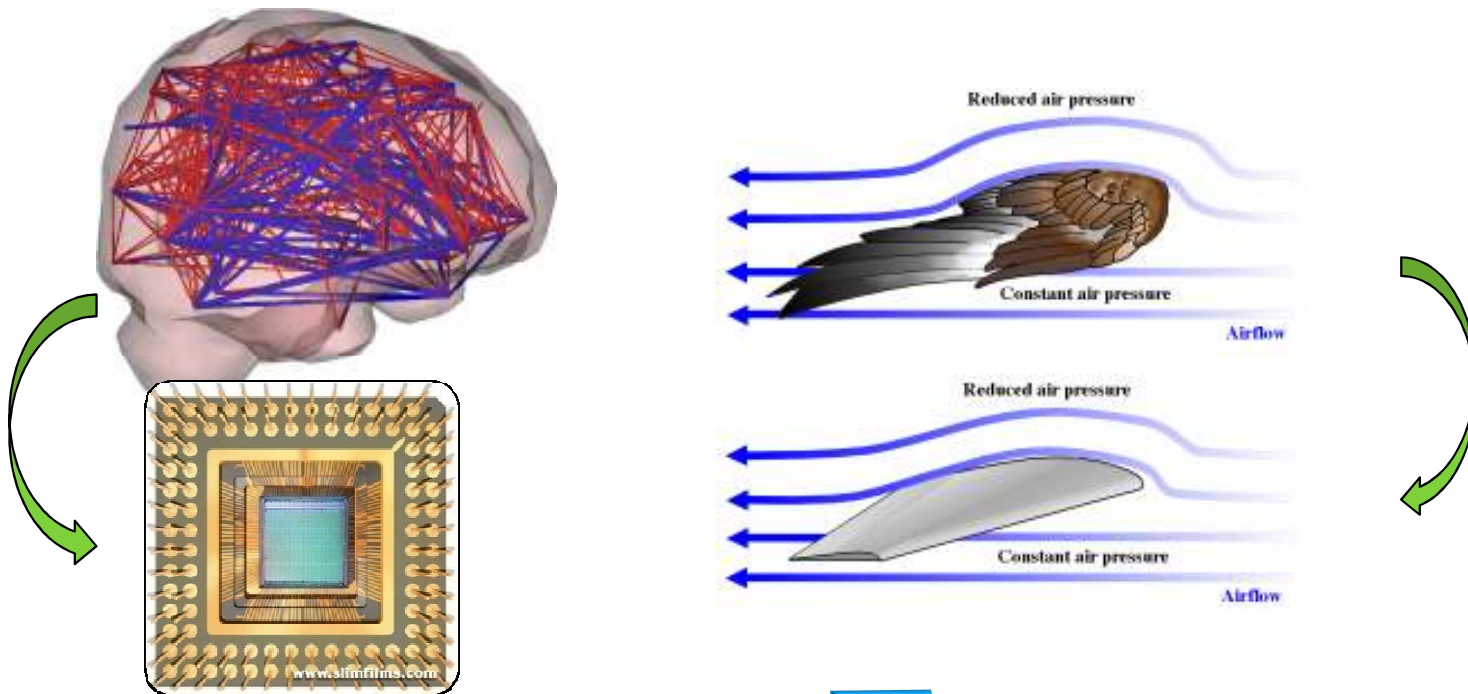
Granger causality

Graph Theory

Synchronisation analysis



# cortical coding principles



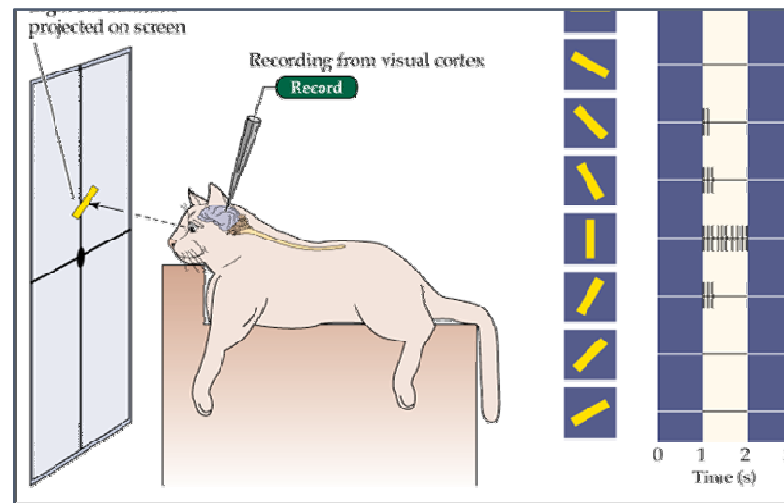
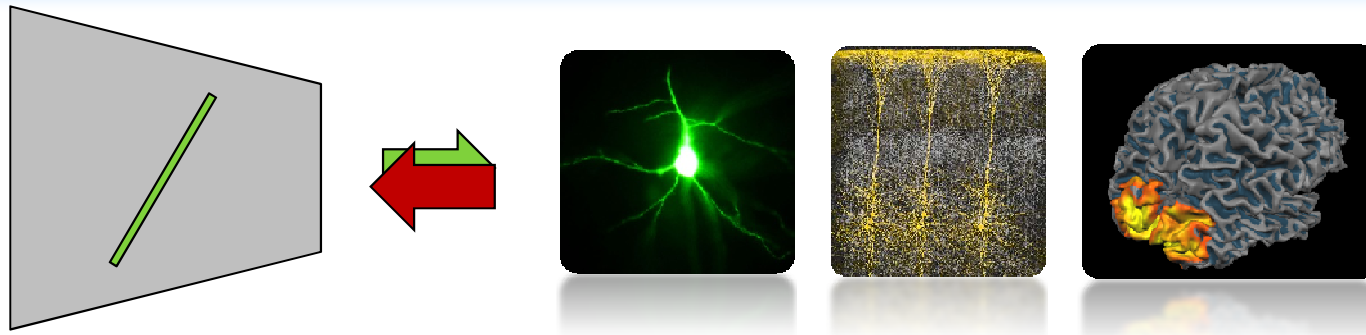
i.e. cortical predictions



Friston, K.  
free energy principle



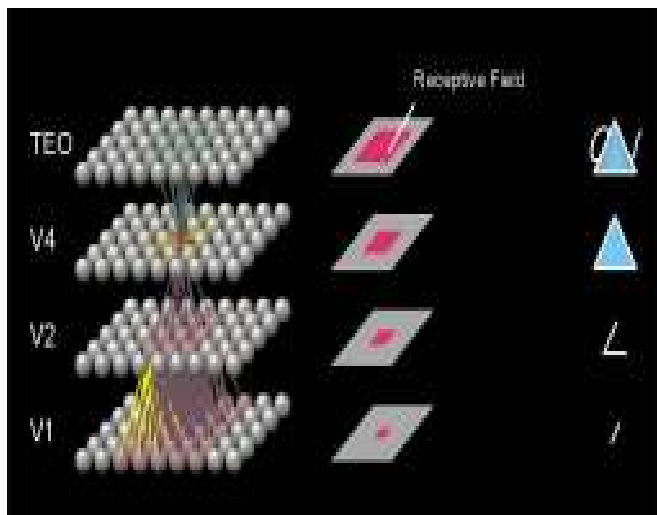
## Lars Muckli – Predictive coding



## Neurophysiological models for economic neural encoding

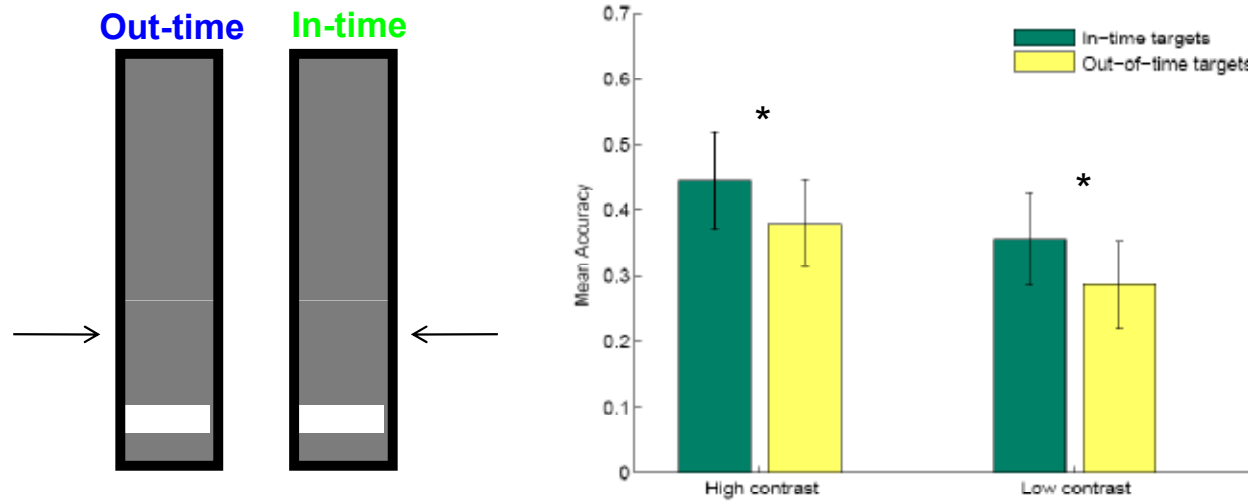
Attneave 1954:

*“It appears likely that a major function of the perceptual machinery is to strip away some of the redundancy of stimulation, to describe or encode incoming information in a form more economical than that in which it impinges on the receptors”*



- **Mumford 1992: *On the computational architecture of the neocortex***
  - Higher cortical areas try to predict information that is present in lower cortical areas based on abstract information about the world.
  - Lower areas signal only the information that they contain which is not predicted by higher areas.
  - Predictions and error signals are transmitted via a thalamo-cortical loop

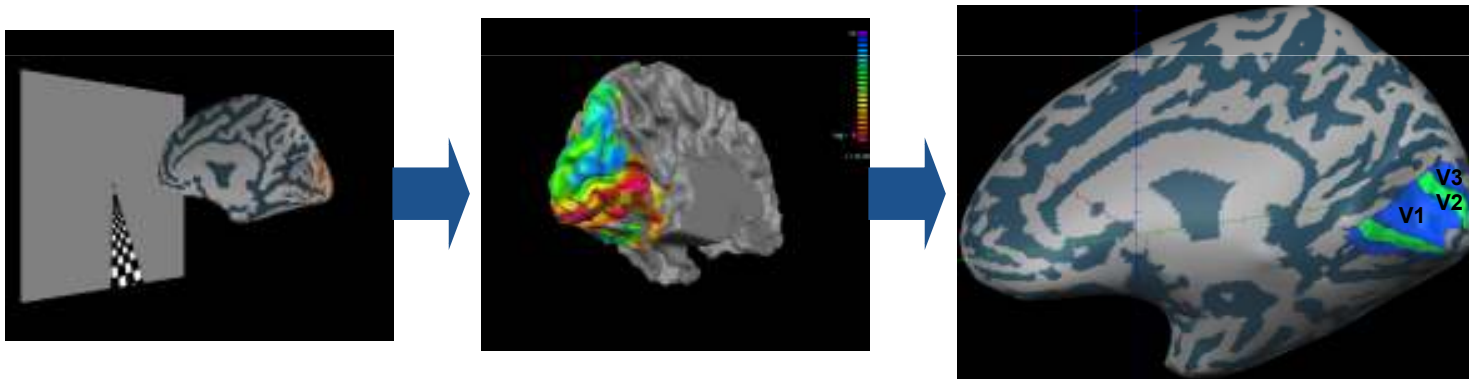
## Extension: V5 is sending a spatial-temporal precise prediction to V1



*Alink, Schwiedrzik, Kohler, Singer & Muckli (2010) J Neurosci.*

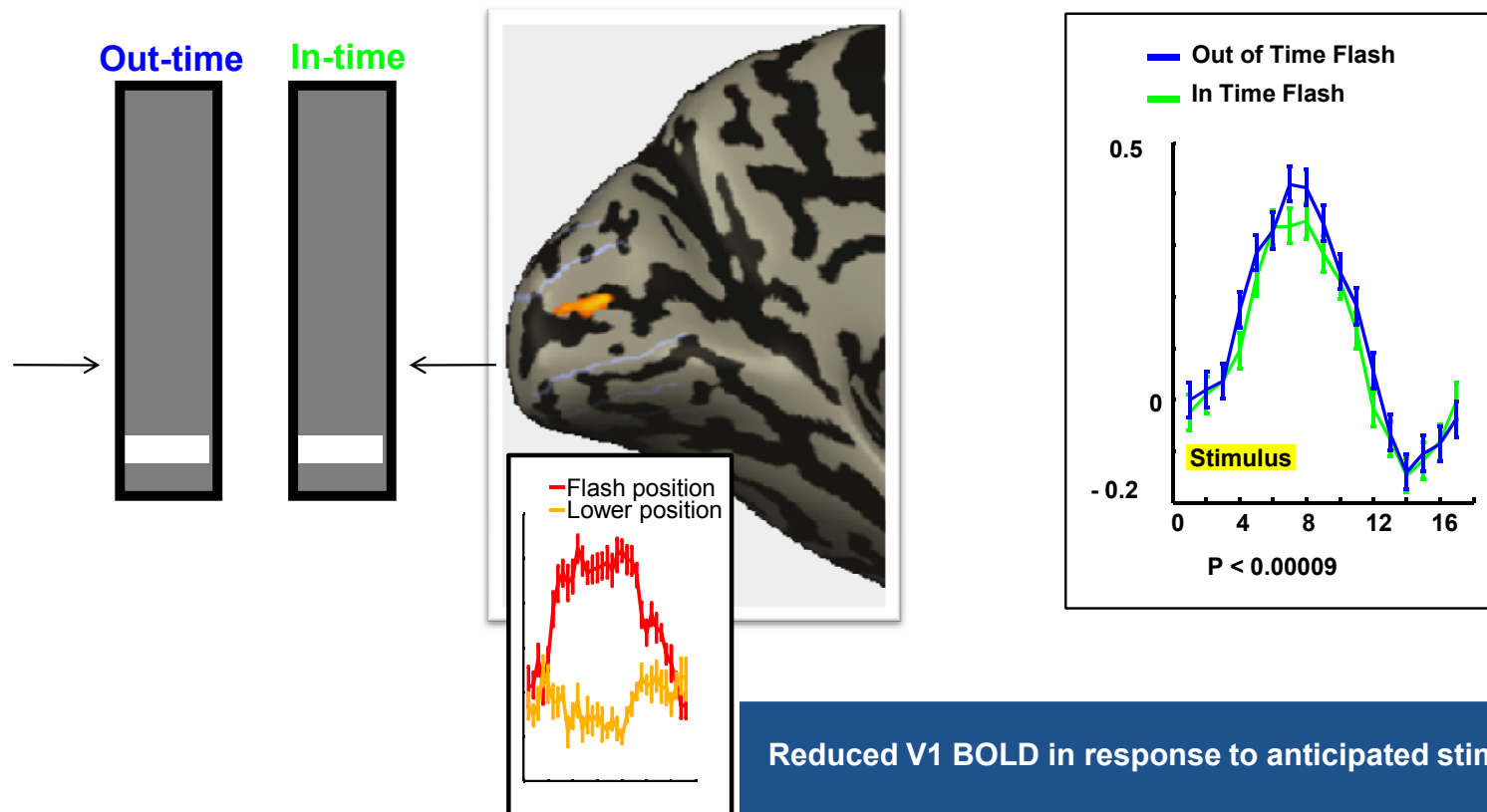
# Lars Muckli – Predictive Coding in Vision

1. ongoing activity before stimulus onset..
2. non stimulated regions
  - during motion illusion
  - during scene processing





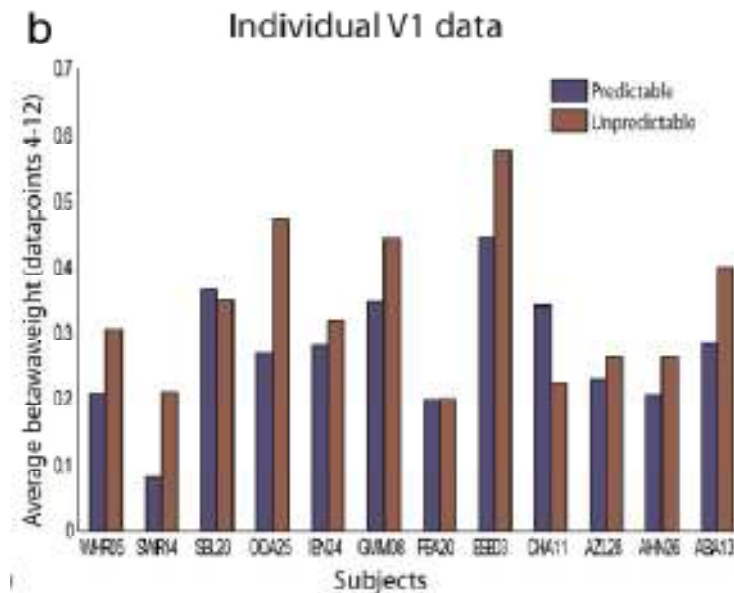
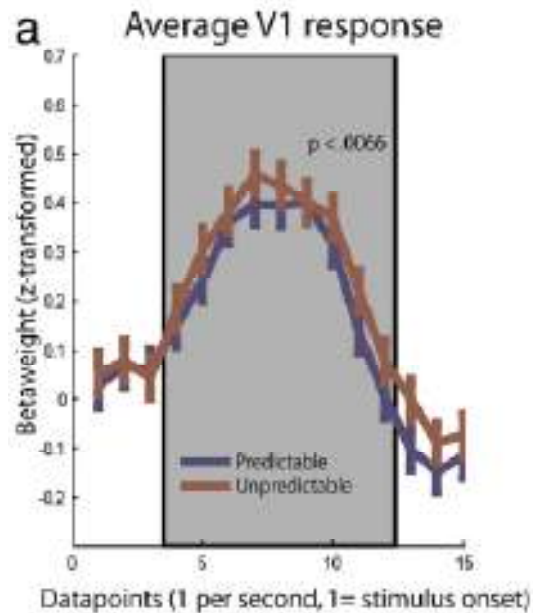
## spatial-temporal precise prediction in V1



Alink, Schwiedrzik, Kohler, Singer & Muckli (2010) *J Neurosci*.

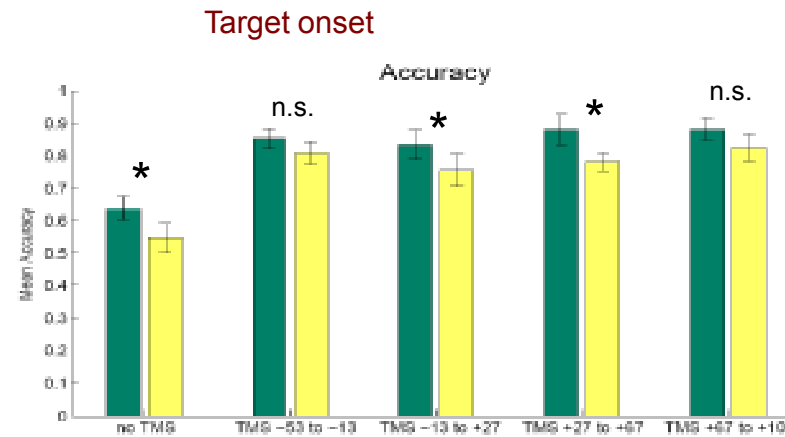
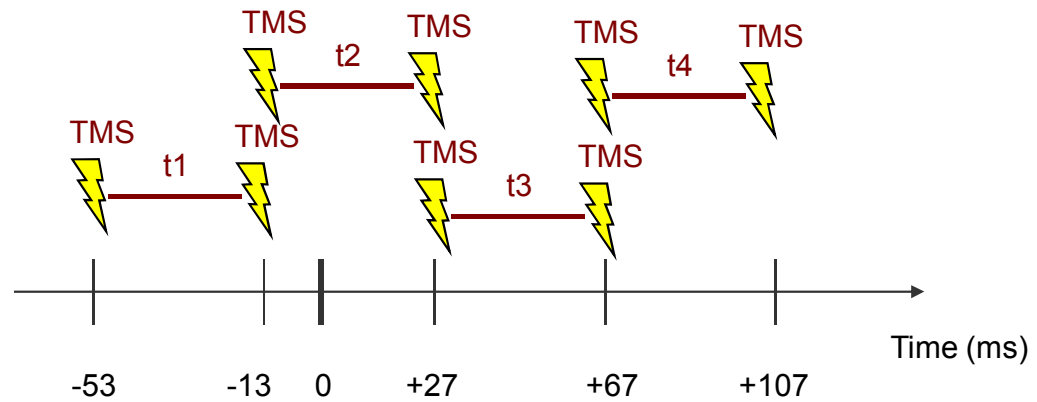
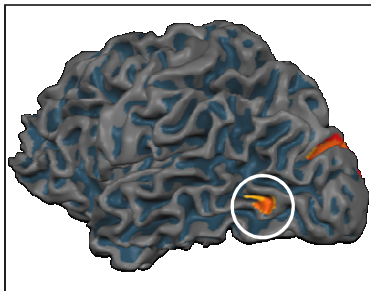
# Our experiment, Part 1

## Region-Of-Interest based Analysis Results: Primary visual cortex 12 subjects



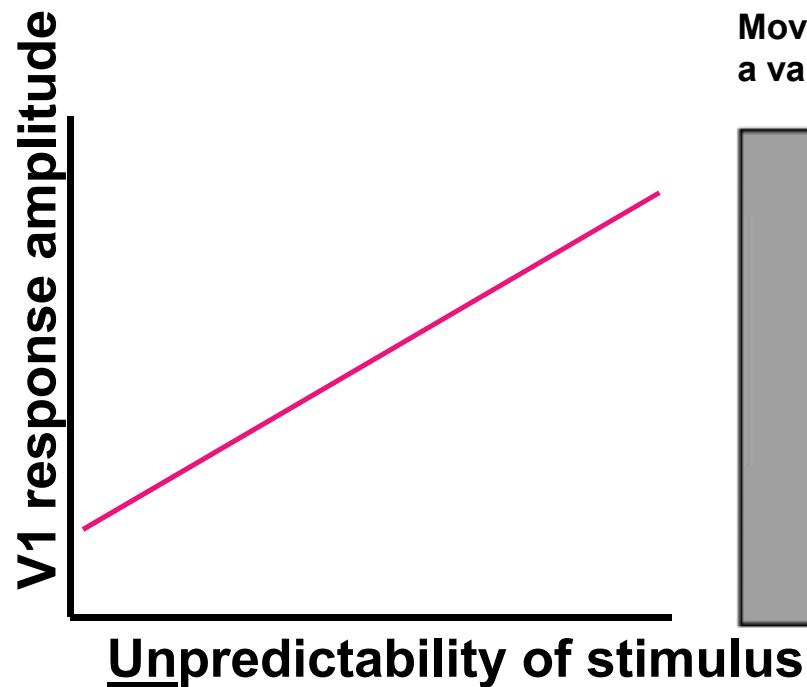
# Disruption of feedback from V5 to V1 with TMS

Vetter, Grosbras, & Muckli (in prep.)

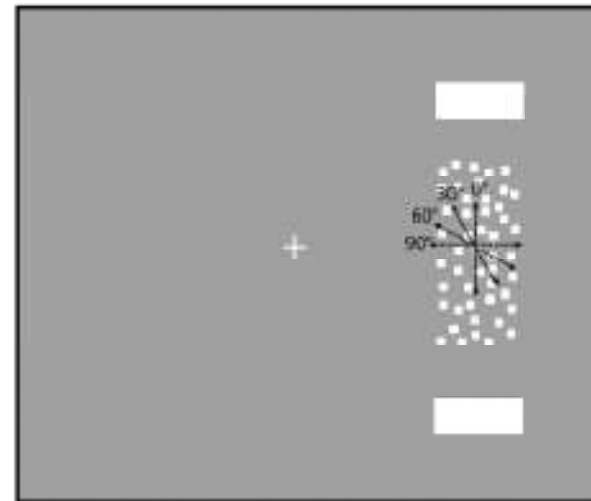


## Our experiment, Part 2

*The more predictable a visual stimulus is the less early visual areas will respond to that stimulus*

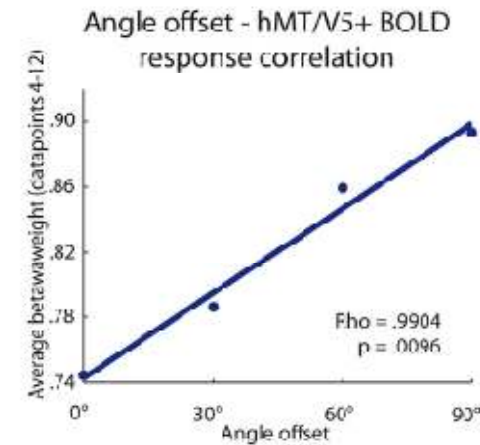
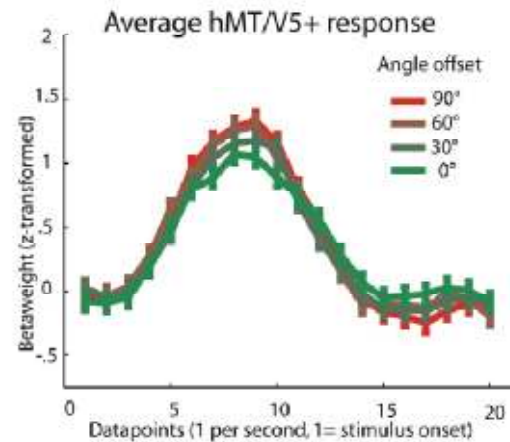
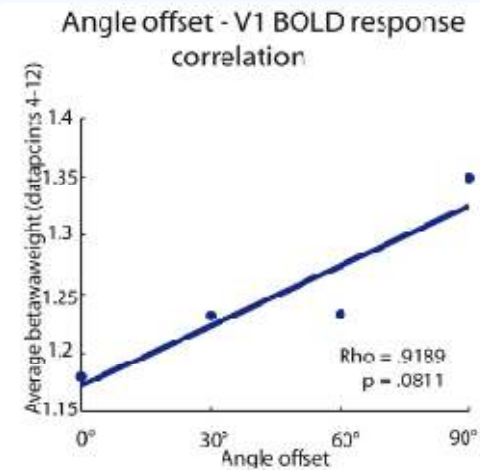
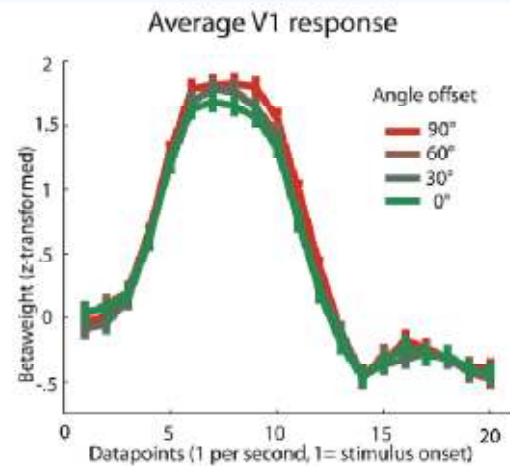


Parametric Design:  
**Moving dots on the AM path with  
a variable angle**





## Our experiment, Part 2

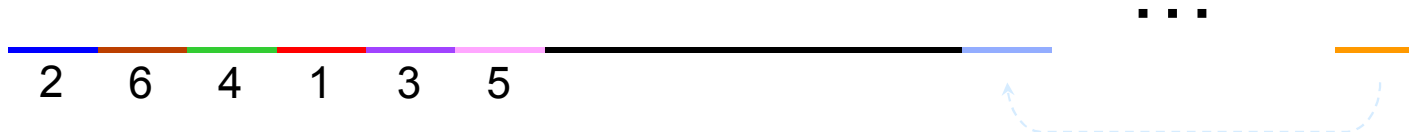
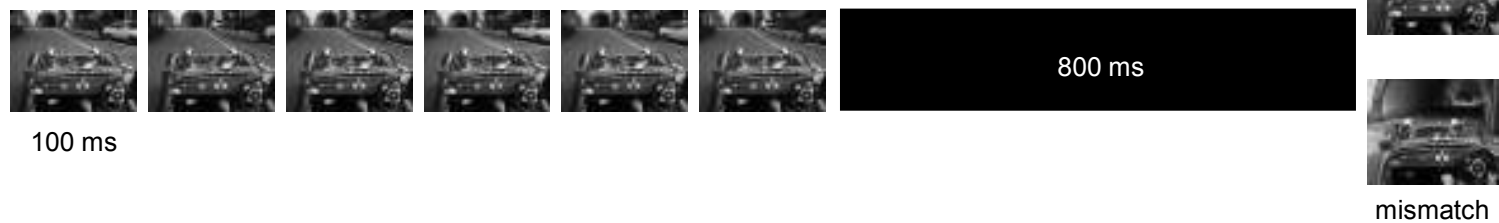


# Apparent motion in natural visual scenes

## Expectancy



## Non - Expectancy



*Carvalho, Smith & Muckli (2009) HBM Meeting, in prep*

# Visual Stimulation

expectancy  
match

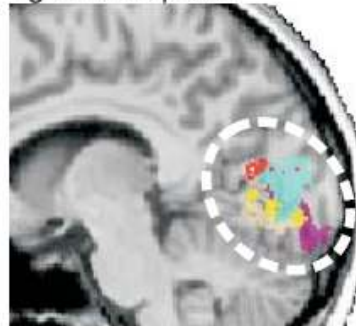
expectancy  
**non**-match

**non**-expectancy  
match

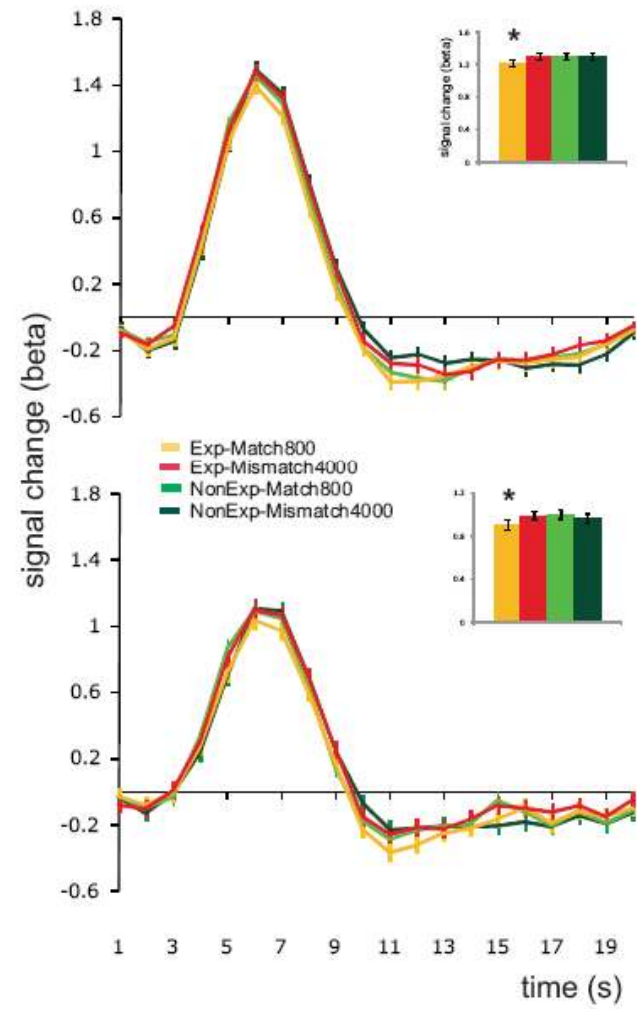
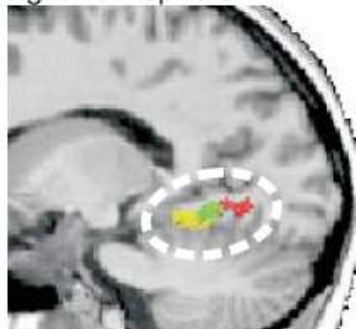
**non**-expectancy  
**non**-match

*Carvalho, Smith & Muckli (2009) HBM Abstract*

**V1**  
right hemisphere

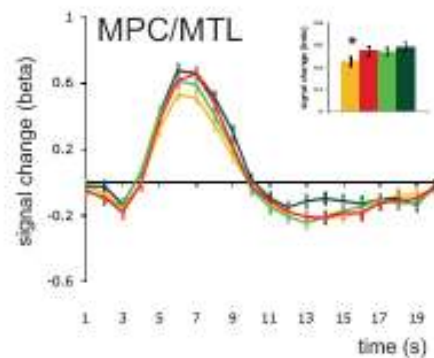
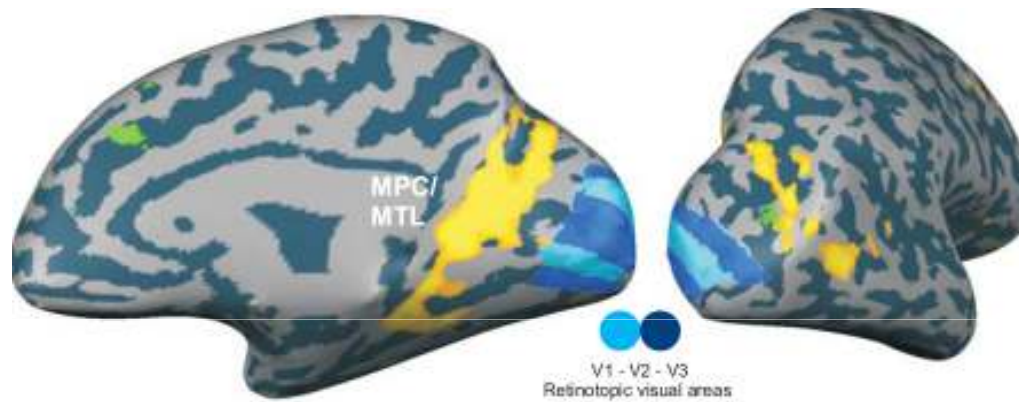


**V3v**  
right hemisphere

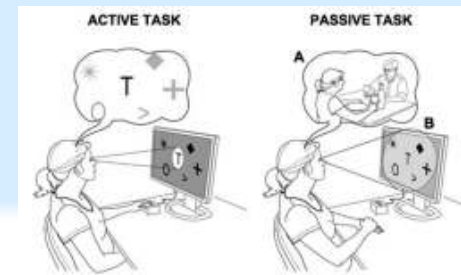




# Predictive coding – default mode network



- Exp Match
- Exp non-match
- Non-exp 'match'
- Non-exp 'non-match'



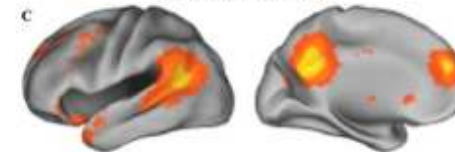
## AUTOBIOGRAPHICAL MEMORY



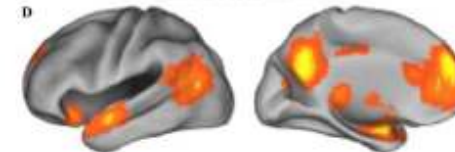
## ENVISIONING THE FUTURE



## THEORY OF MIND



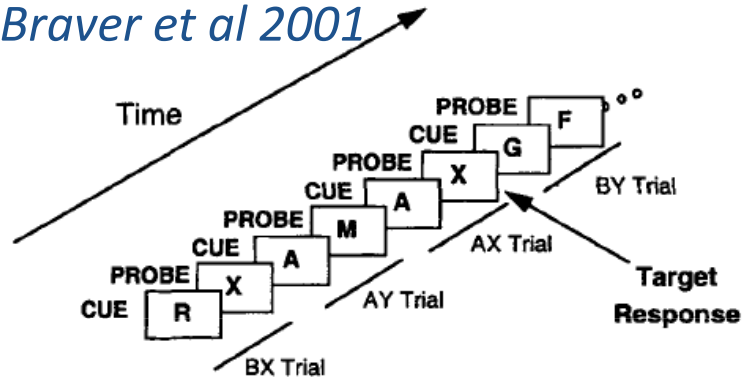
## MORAL DECISION MAKING



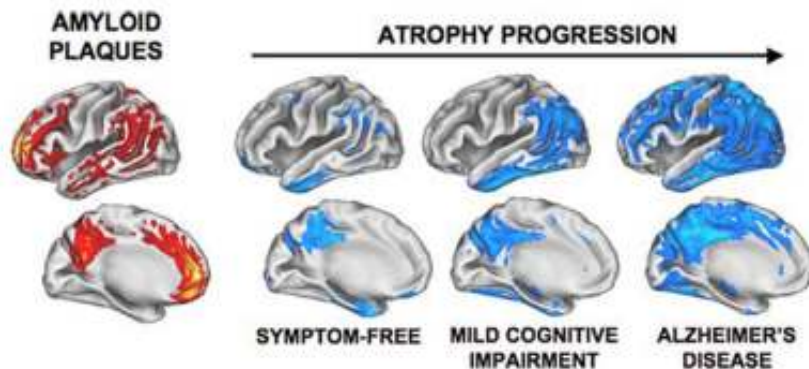
## Processing of Context Information AND Aging

(Paxton et al 2006 Psychology and Aging)

*Braver et al 2001*

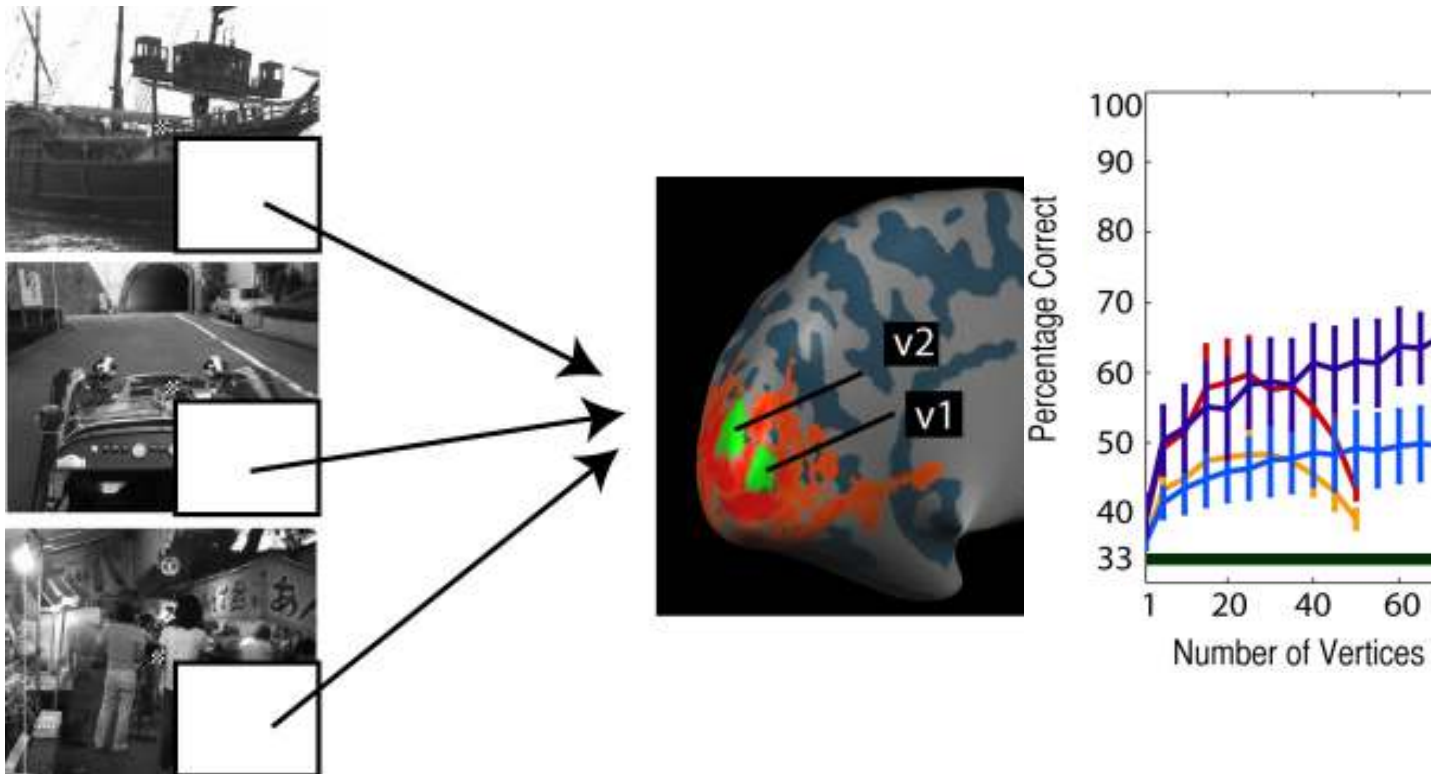


*predictive coding  
In DMN affected  
by aging*



Paxton et al (2006) Psychology and Aging

## Context decoding in V1 (brain reading 1<sup>st</sup>)

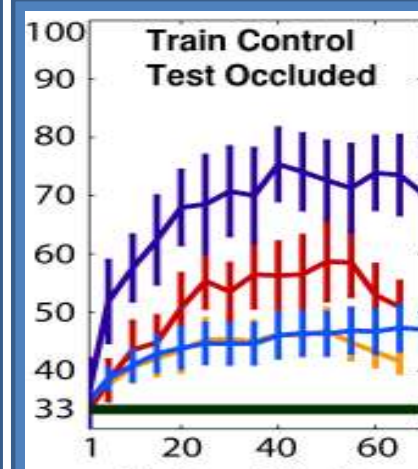
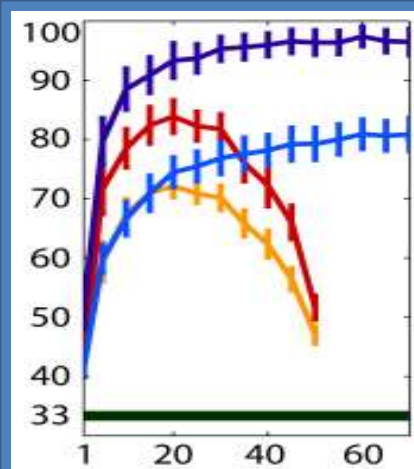


*Smith & Muckli (under review)*

TRAIN



TEST



TRAIN



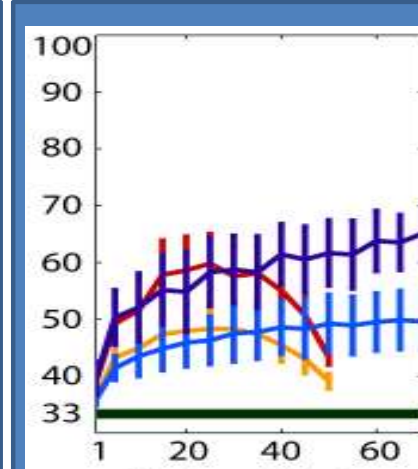
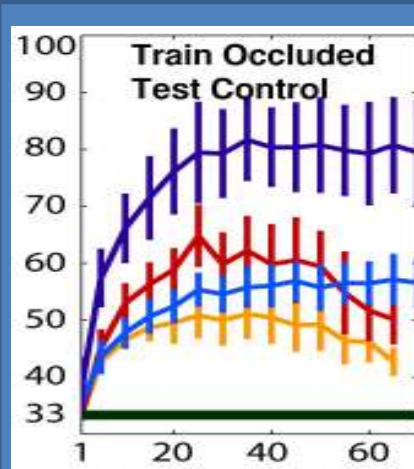
TEST



TRAIN



TEST



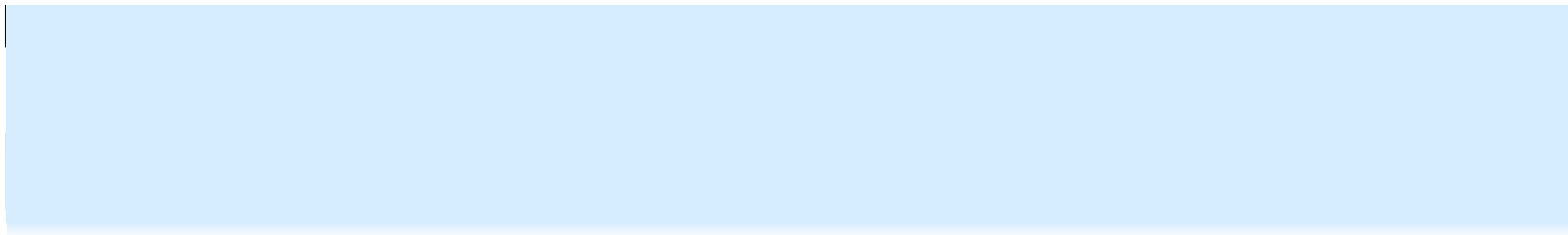
TRAIN



TEST







## Basic Research

Predictive Coding  
Apparent motion  
Complex scenes  
Contextual information



## Models

Unifying theories of the brain  
Free energy principle

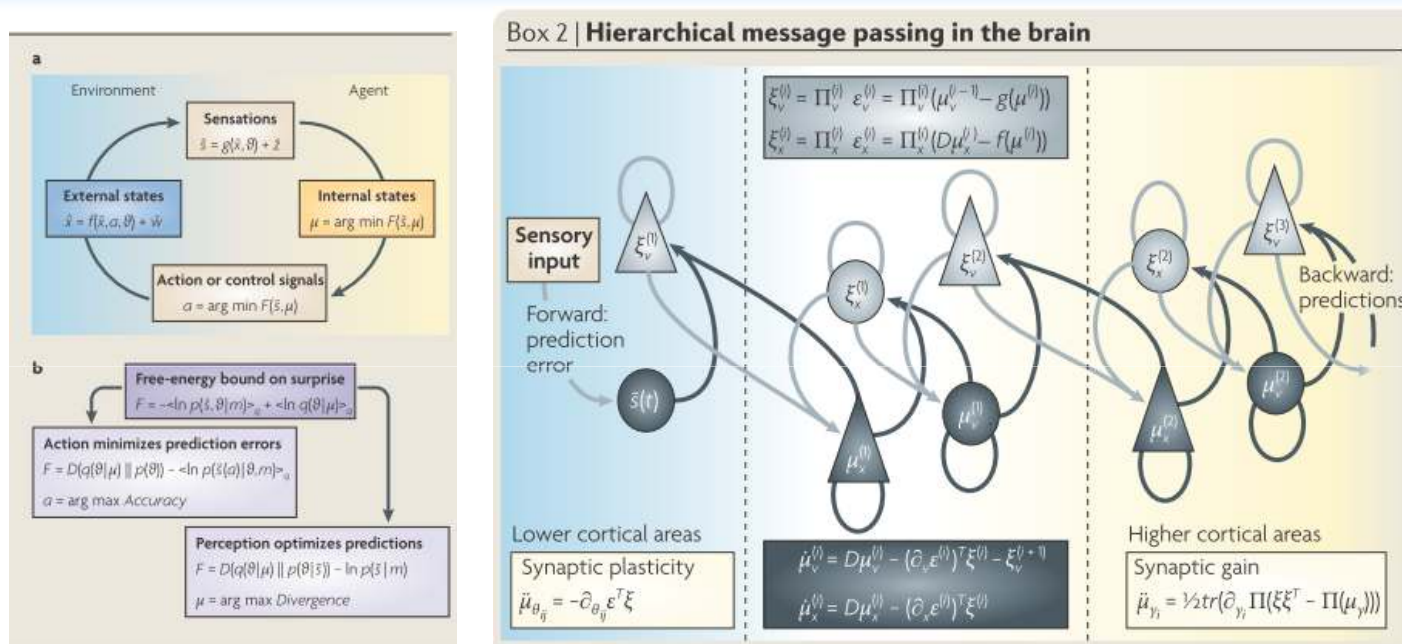
## Clinical applications

Aging  
Mental Disorder

## AI applications

Applications for artificial intelligence  
Face recognition  
Body motion recognition

# ..unifying theories of the brain

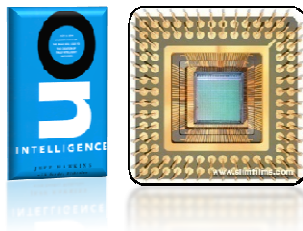


## Friston et al., 2006: A free energy principle for the brain

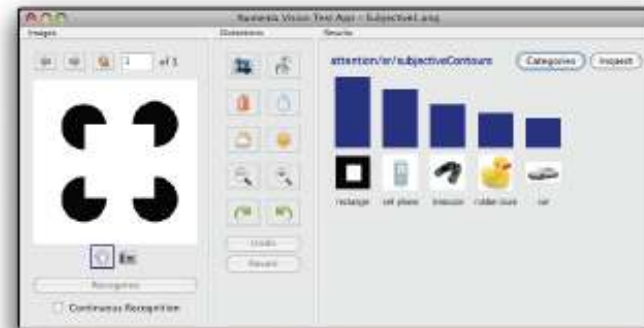
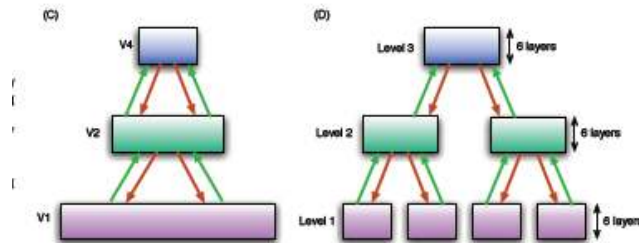
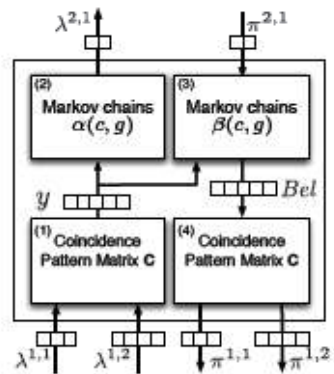
Neural systems attempt to minimize state changes by changing it's sampling of the environment.

This is realized by anticipating upcoming events based on learned rules and the statistics of the environment

# HTM Bayesian believe propagation (Markov chains)



(b)



George & Hawkins (2010)

# thanks to ...



**Dr Fraser W  
Smith**  
MVA-Faces-Scenes



**Dr Petra Vetter**  
(TMS-saccades)



**Dr. Fabiana  
Carvalho**  
(Scenes)

## ***MPI Frankfurt***

- **Arjen Alink**
- **Dr Axel Kohler**
- **Caspar Schwiedrzik**
- **Prof Wolf Singer**
- **Dr Michael Wibral**