

# Instrumentation for Medical Imaging

IV - Magnetic Resonance Imaging (MRI)  
Ressonância magnética, ressonância magnética funcional e  
neurofeedback

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- Background
- NMR signal (*overview/reminder*)
  - Relaxation (longitudinal and transverse)
  - Contrast
- functional image
  - BOLD
- project BrainTrain
  - Neurofeedback (*rt-fMRI-NF*)
    - ROI
    - connectivity (presented by Joao Pereira)

# Short Bio

**(2013-today)** Post-doc with the Visual Neuroscience Lab at IBILI |  
Faculty of Medicine of the University of Coimbra  
Project: "*BrainTrain*"

**(2008-2013)** PhD degree in Information Science and Technology |  
Faculty of Science and Technology of the University of Coimbra  
Thesis: "*Development of classification methods for real-time seizure prediction*"

**(2007-2008)** M.Sc. degree in Biomedical engineering | Faculty of  
Science and Technology of the University of Coimbra

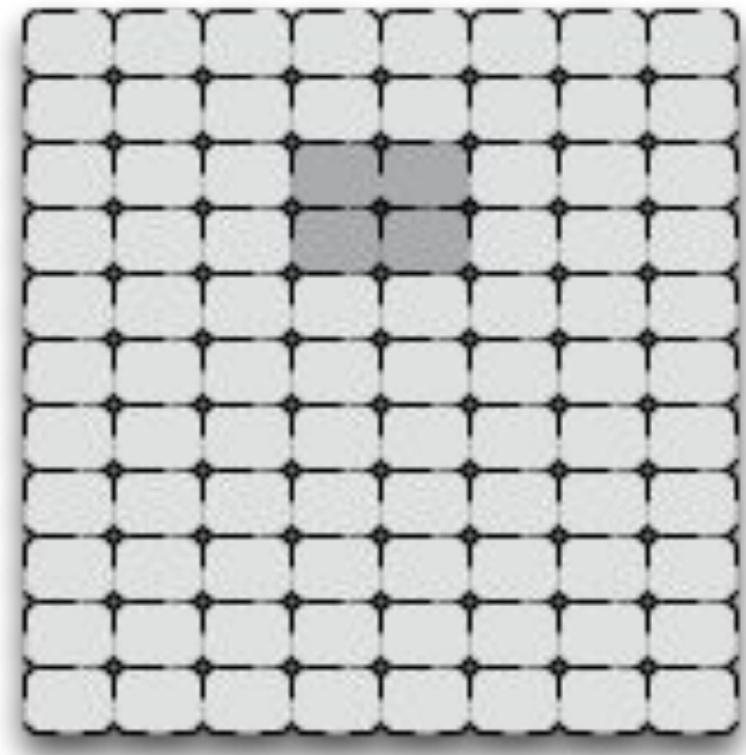
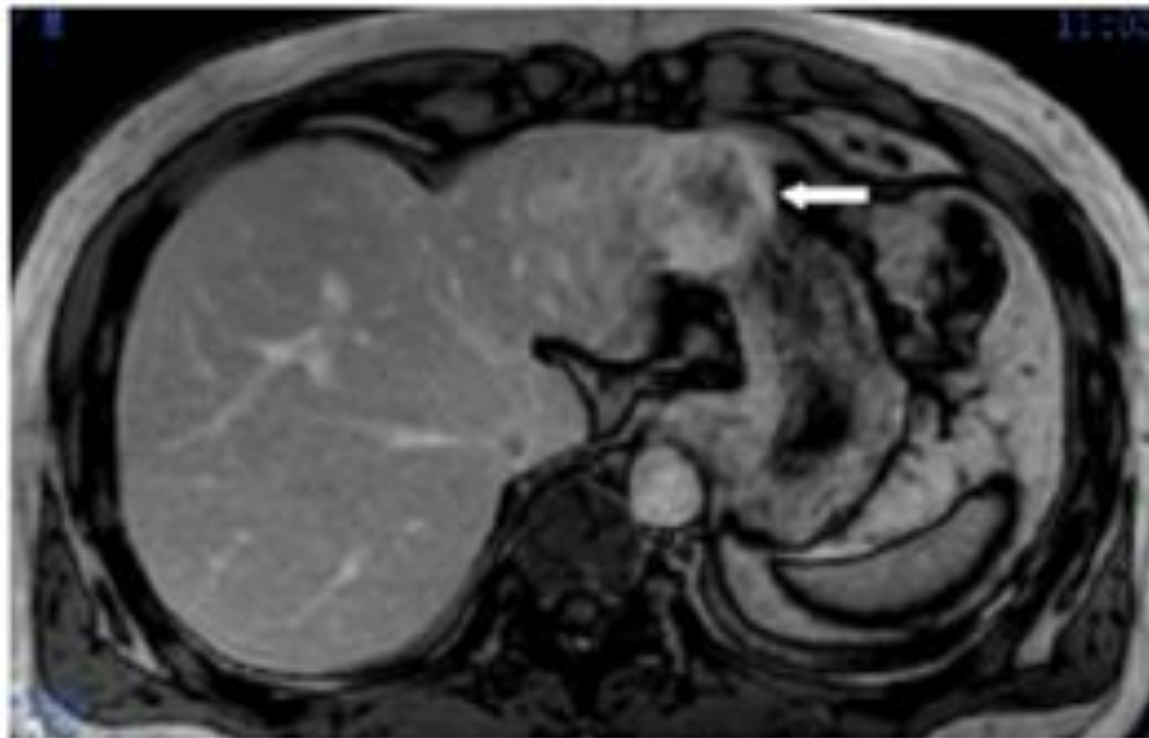
**(2002-2007)** Licentiate degree in Biomedical engineering | Faculty of  
Science and Technology of the University of Coimbra

# Overview

*A 46-year-old male with hepatocellular carcinoma of the left lobe of liver. Contrast enhanced MR image shows a periphery enhanced mass invading the stomach and mimicking a gastric subepithelial mass  
(<http://qims.amegroups.com/article/viewFile/1317/1773/4537>)*

*Contrast resolution*

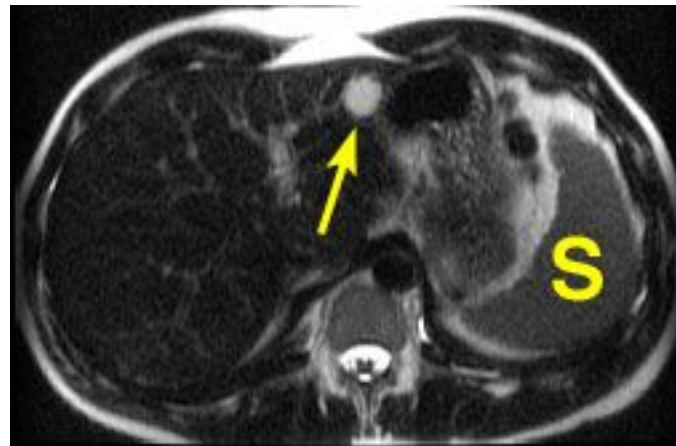
*Spatial resolution*



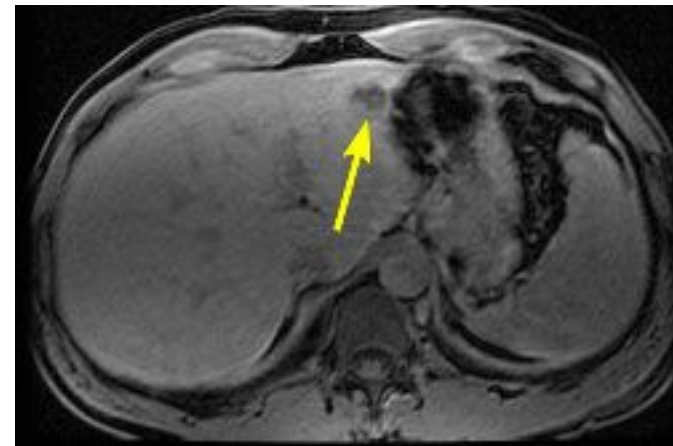
# Overview

- We can change the nature of the image, changing specific parameters of MRI to improve the *contrast resolution* and *spatial resolution* of the image

T2-weighted image



Un-enhanced T1-weighted



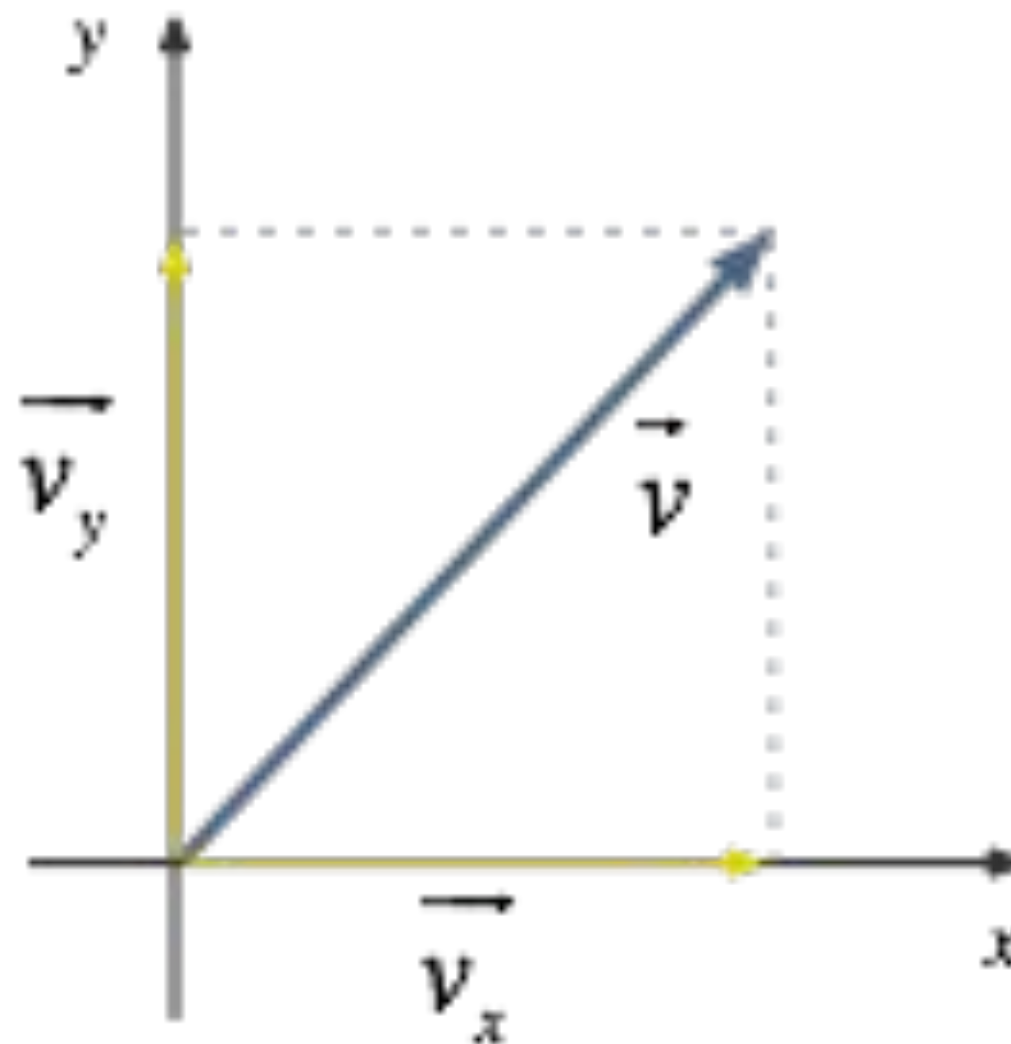
w/ contrast agent



# Remember

Vector *amplitude* and *direction*

Vector *decomposition* into components (longitudinal and transverse)

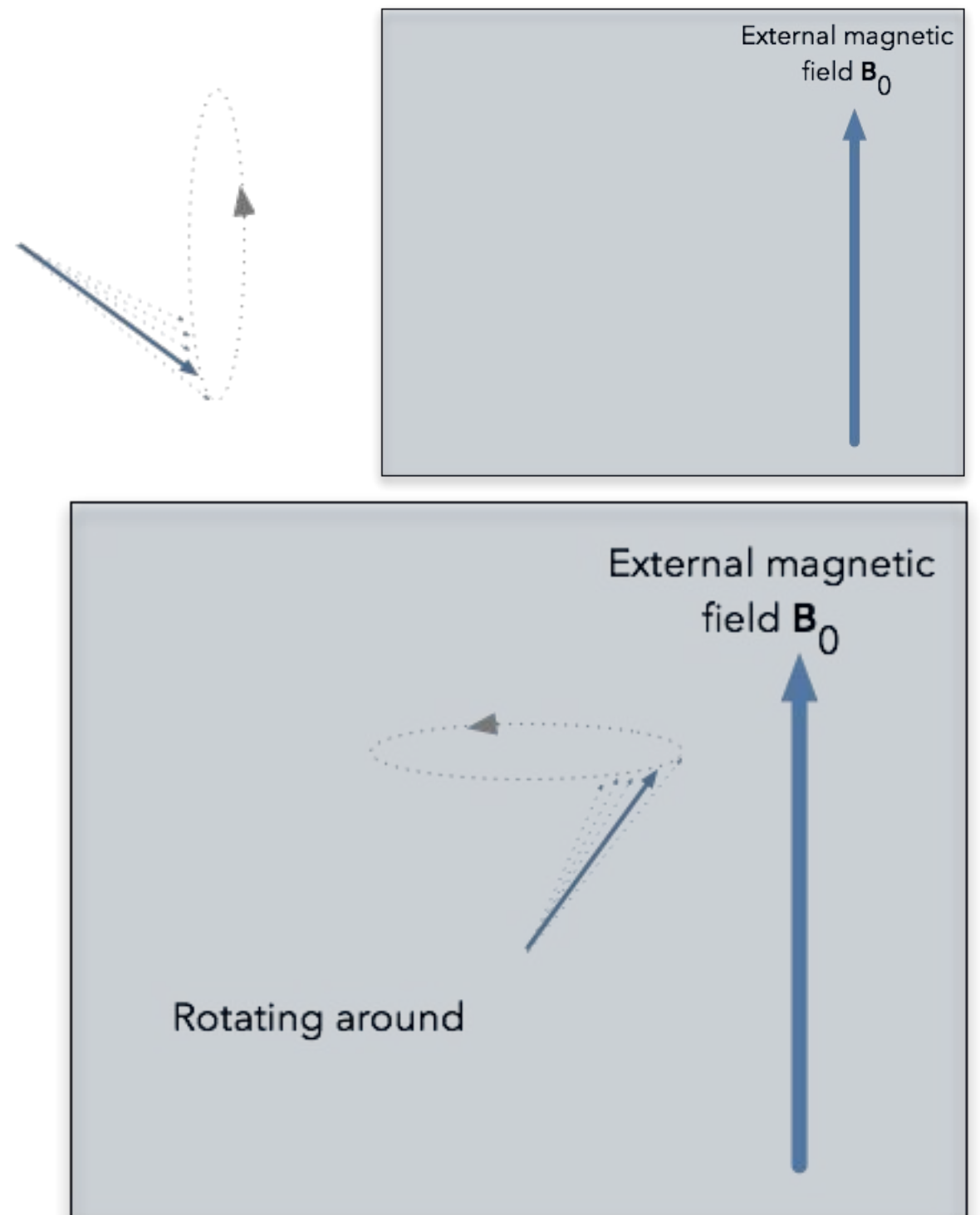


Magnetic susceptibility is a natural property of all tissues

- Measure of how magnetised the tissue becomes when it is placed in a strong magnetic field (*depends on the arrangement of electrons in the tissue*)
- *Diamagnetic* materials have a very weak susceptibility
  - Produces an internal field in the opposite direction to the applied field. *Most body tissues are diamagnetic*
- *Paramagnetic* materials have a stronger susceptibility and produce a field in the same direction as the main field
  - examples include gadolinium (used as an MR contrast agent), deoxy-haemoglobin and met-haemoglobin.
- *Superparamagnetic*
- *Ferromagnetic*

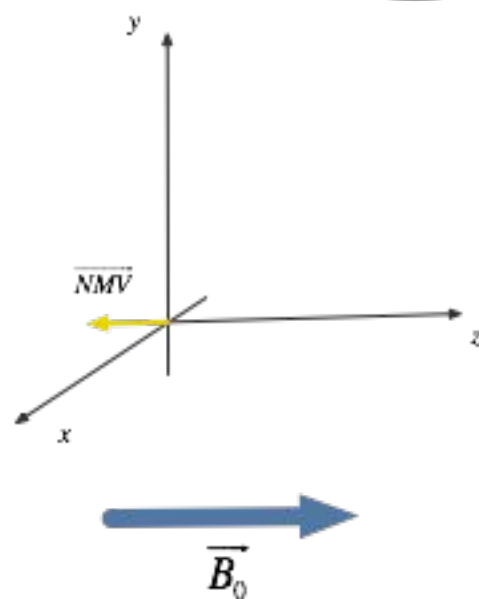
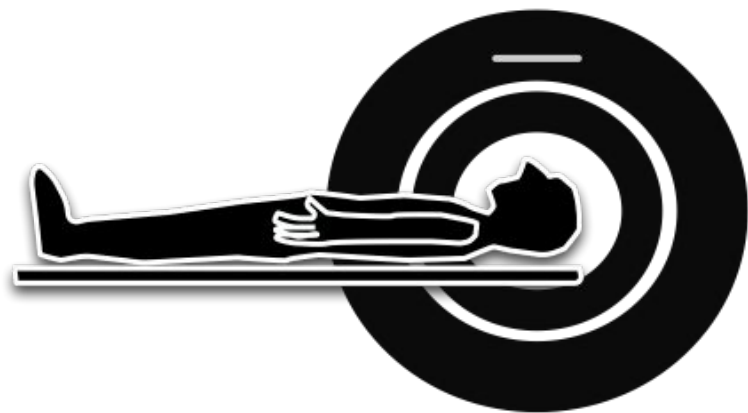
# Generating the NMR signal

- What would happen if an external magnetic  $B_0$  field was applied to this particle?
- We would *probably* expect an alignment with  $B_0$
- Reality, because of the *spin angular momentum*, it will rotate around  $B_0$ 
  - Precession





# Generating the NMR signal



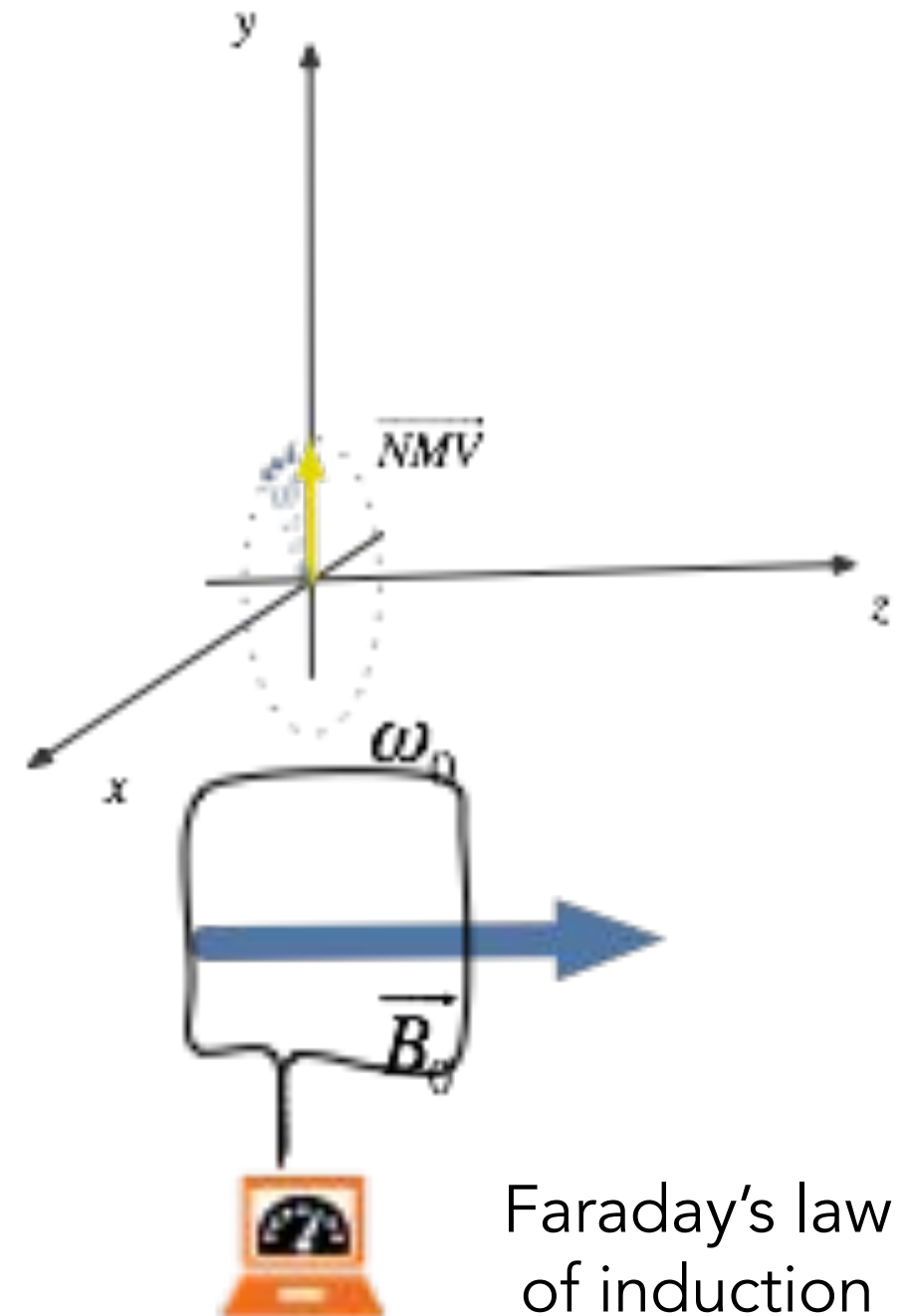
Net Magnetization Vector



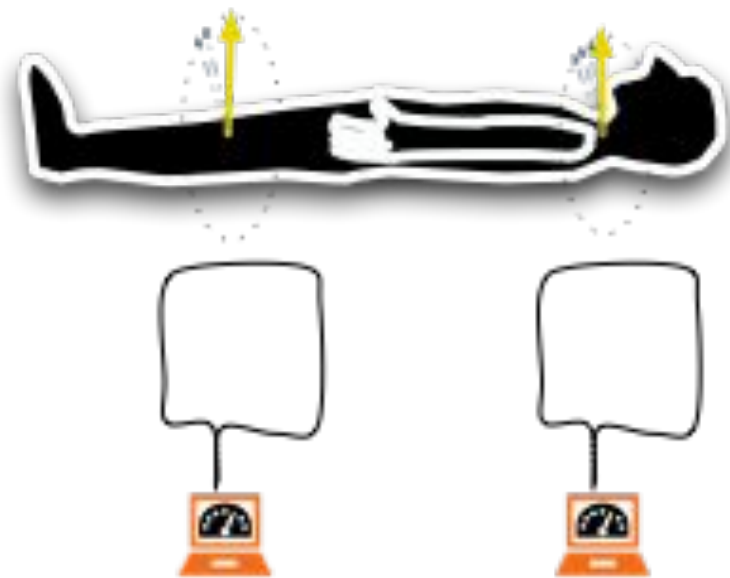
- We have a NMV, antiparallel to  $B_0$
- we cannot detect it along the same direction of  $B_0$  because of  $B_0$  strength
- What we want to do is to *change the orientation of the NMV*
  - *perpendicular* to the  $B_0$
- Is it static (e.g. always pointing to the y-axis) ?

# Generating the NMR signal

- Longitudinal
  - 'canceled', i.e. sum of all individuals is  $\sim 0$
- Transverse
  - static?
  - If we have some coherent phase, the NMV is *rotating / precessing!* around z-axis/ $B_0$
  - Larmor freq.
  - Now the NMV can be detected!

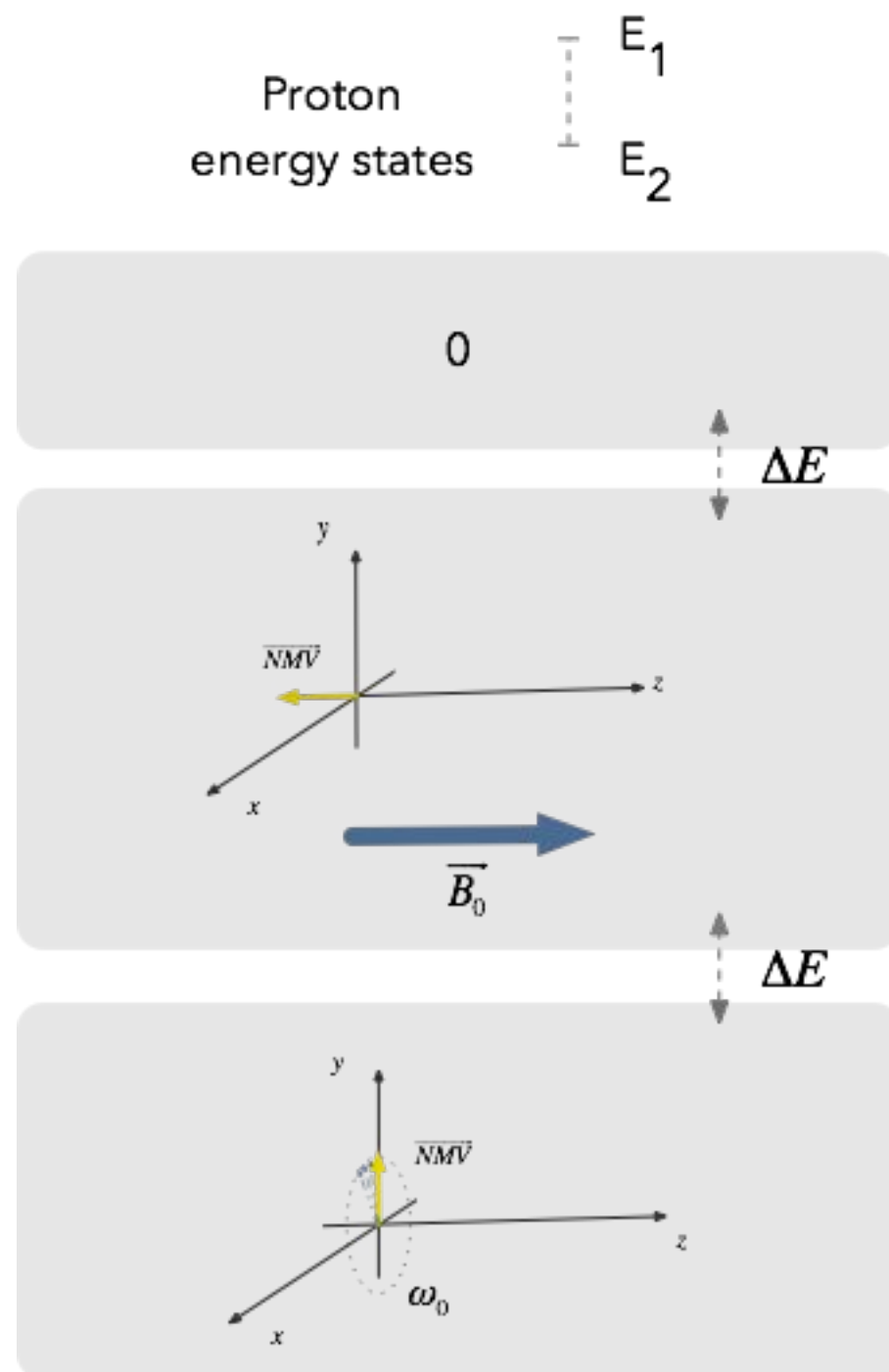


# Generating the NMR signal



- Transverse
  - NMV is *rotating* around z-axis/ $B_0$
  - Larmor freq.
  - The electrical induction (voltage generation) is proportional to the NMV
  - Signal Intensity (as a measure of transverse magnetization)
  - Different location with different NMV (transverse)

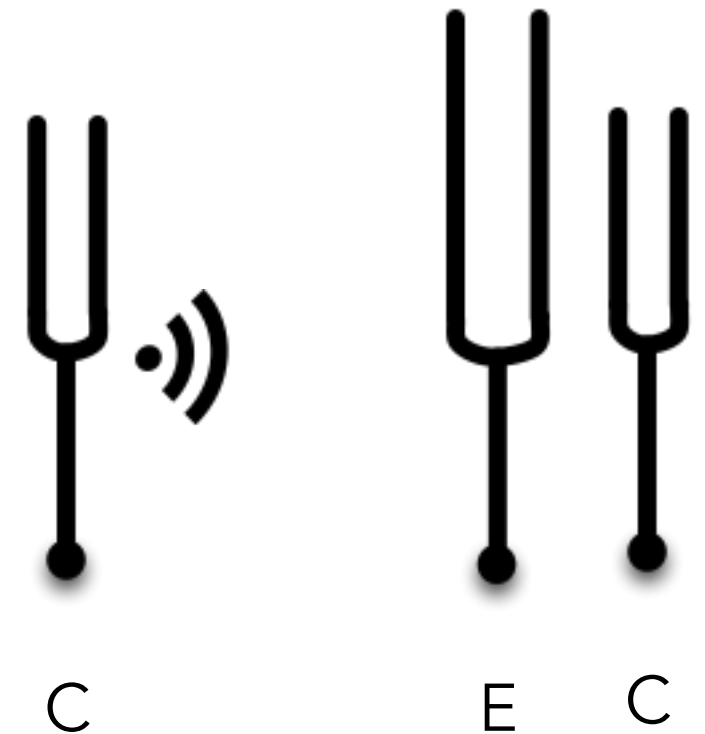
# Generating the NMR signal



- How do we do this?
- We need an additional 'system'
- to get enough energy to provoke a change in NMV orientation

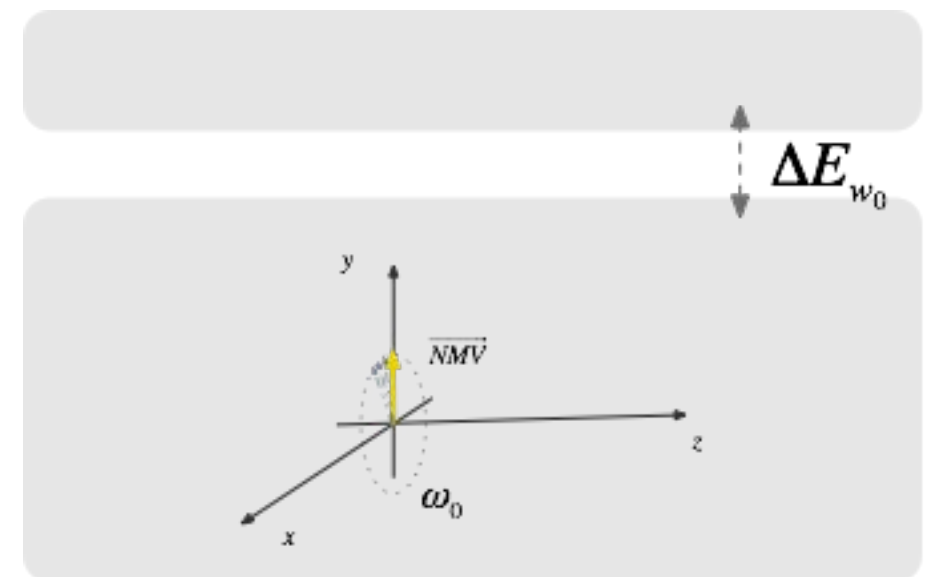
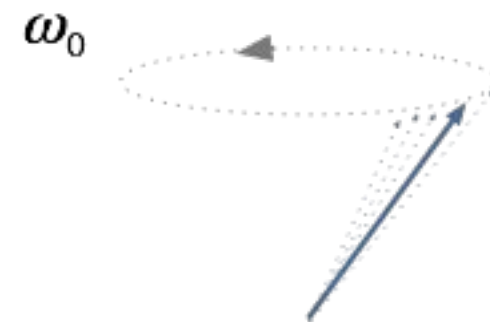
# Generating the NMR signal

- Explore a feature named Resonance
  - Let us consider tuning forks (C or Dó and E or Mi)
  - If we hit the first C (on the left) it will start to oscillate/vibrate and the second C (on the right) will start to oscillate and the E will not!
  - due to the natural frequency at which the tuning fork oscillates
    - there is an efficient transfer of energy between both C's
    - with the E tuning fork we don't have the same freq. and do not observe resonance



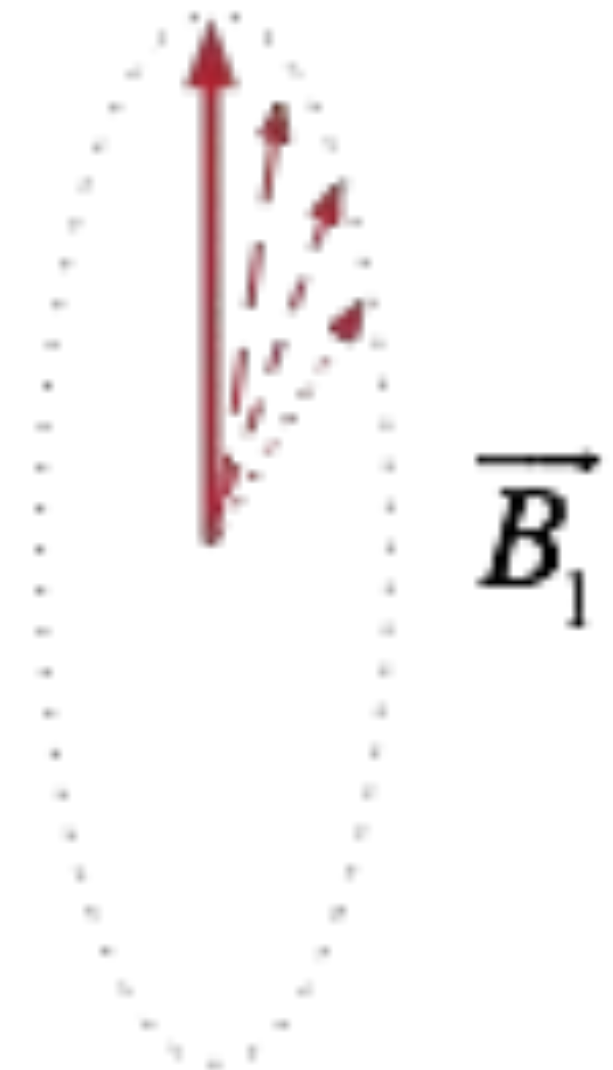
# Generating the NMR signal

- Resonance in NMR
  - Precession, with frequency  $\omega_0$ , computed using the Larmor equation
  - If we apply energy in the system at this specific frequency
    - we should have an efficient transfer of energy to the system



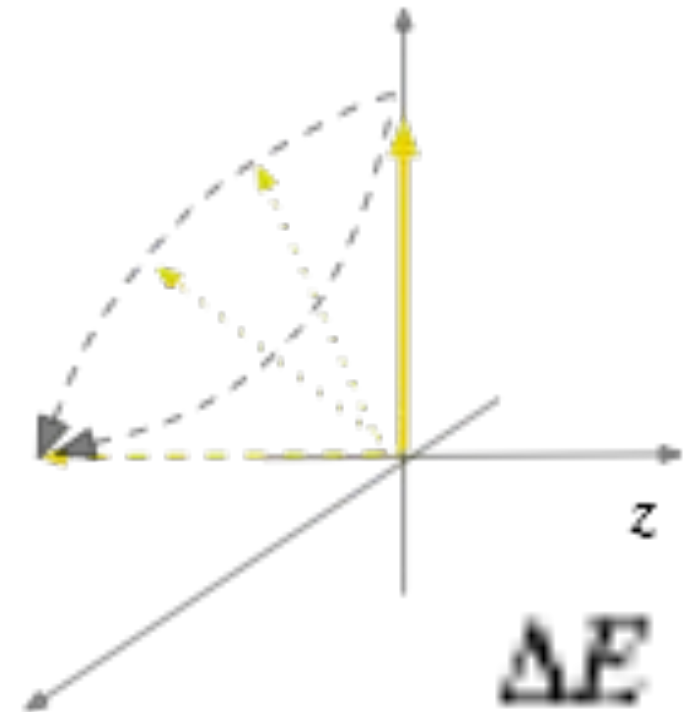
# Generating the NMR signal

- Larmor equation
  - Frequency of rotation is around 64MHz ( $B_0=1.5T$ )
- $B_1$  is applied at this freq.
  - Also known as RF pulse
    - range of MHz
    - pulse (on-off)



# Relaxation

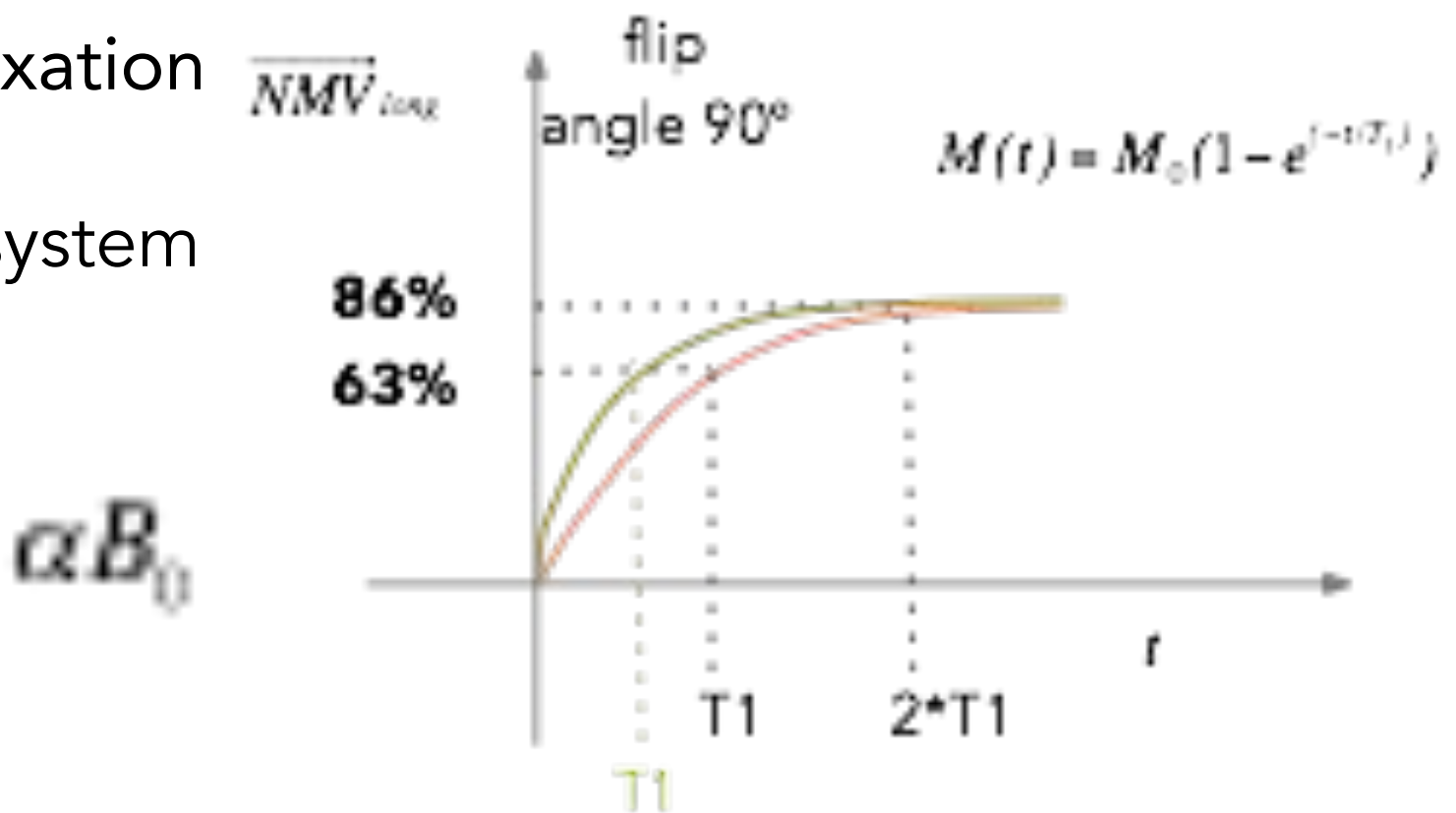
- Let us assume that  $B_1$  is removed
- Evolves to the lowest possible energy state
- end up in the resting state
  - release of energy
    - where does it goes?
- Let's look at each part separately - longitudinal and transversal





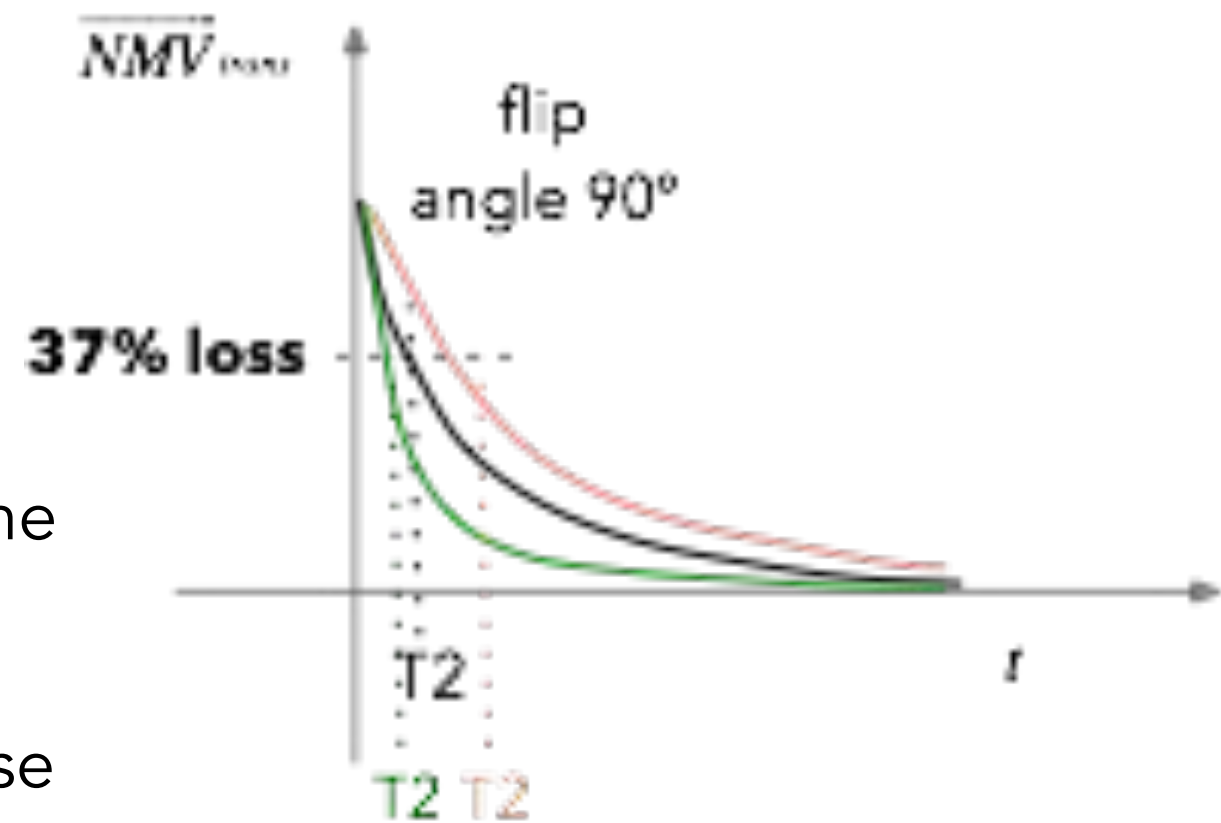
# Longitudinal relaxation

- Longitudinal magnetisation
- a.k.a. spin-lattice relaxation
  - *lattice* - unrelated system elements
- T1 increases with
  - 63% of baseline longitudinal magnetisation



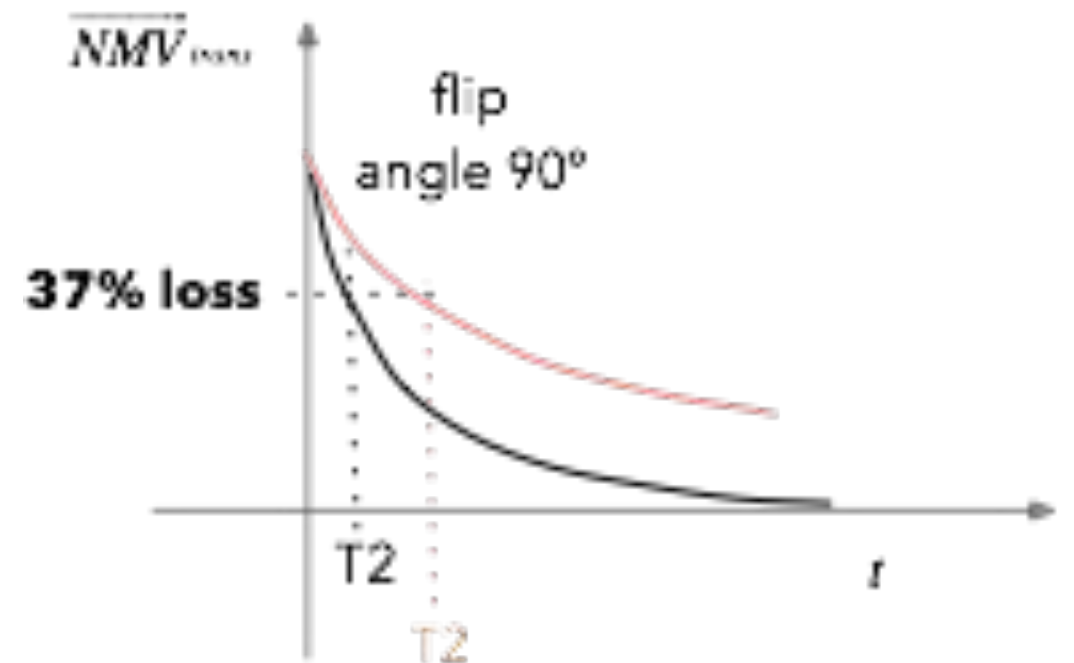
# Transverse relaxation

- Transverse magnetisation
  - exponential decay, max when flip angle is  $90^\circ$
  - how can we measure it?
  - the exponential is described by a time constant called T2
    - amount of time that it takes to lose 37%
  - varies from tissue to tissue



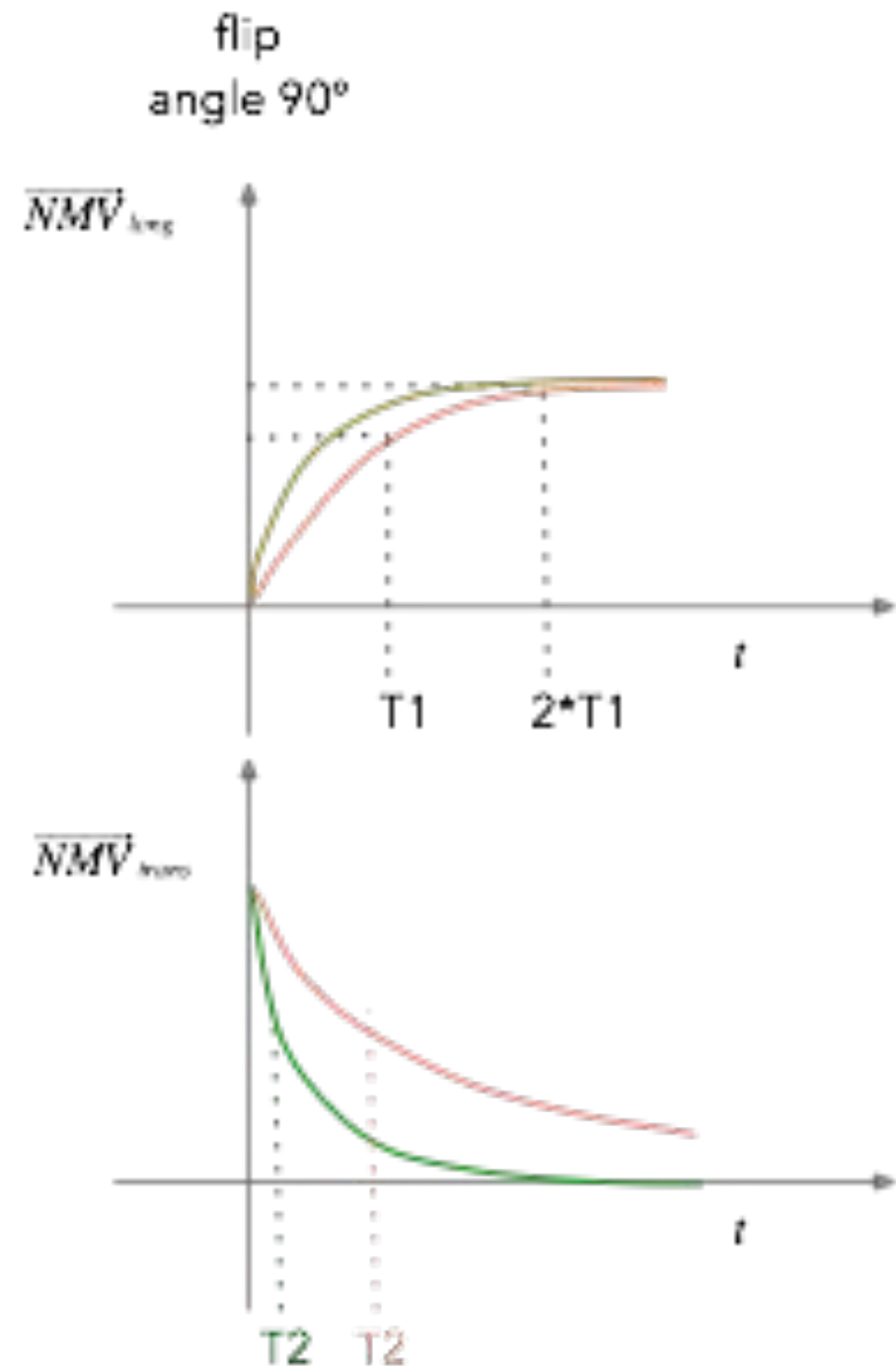
# Transverse relaxation

- Energy transfer
  - from spins (in higher energy state) to other spins
    - a.k.a. Spin-Spin relaxation
  - process depends of energy exchange between spins
- Example
  - (pink) e.g. CSF - longer T2
    - probability of energy exchange occurring is lower - spins are "far apart"



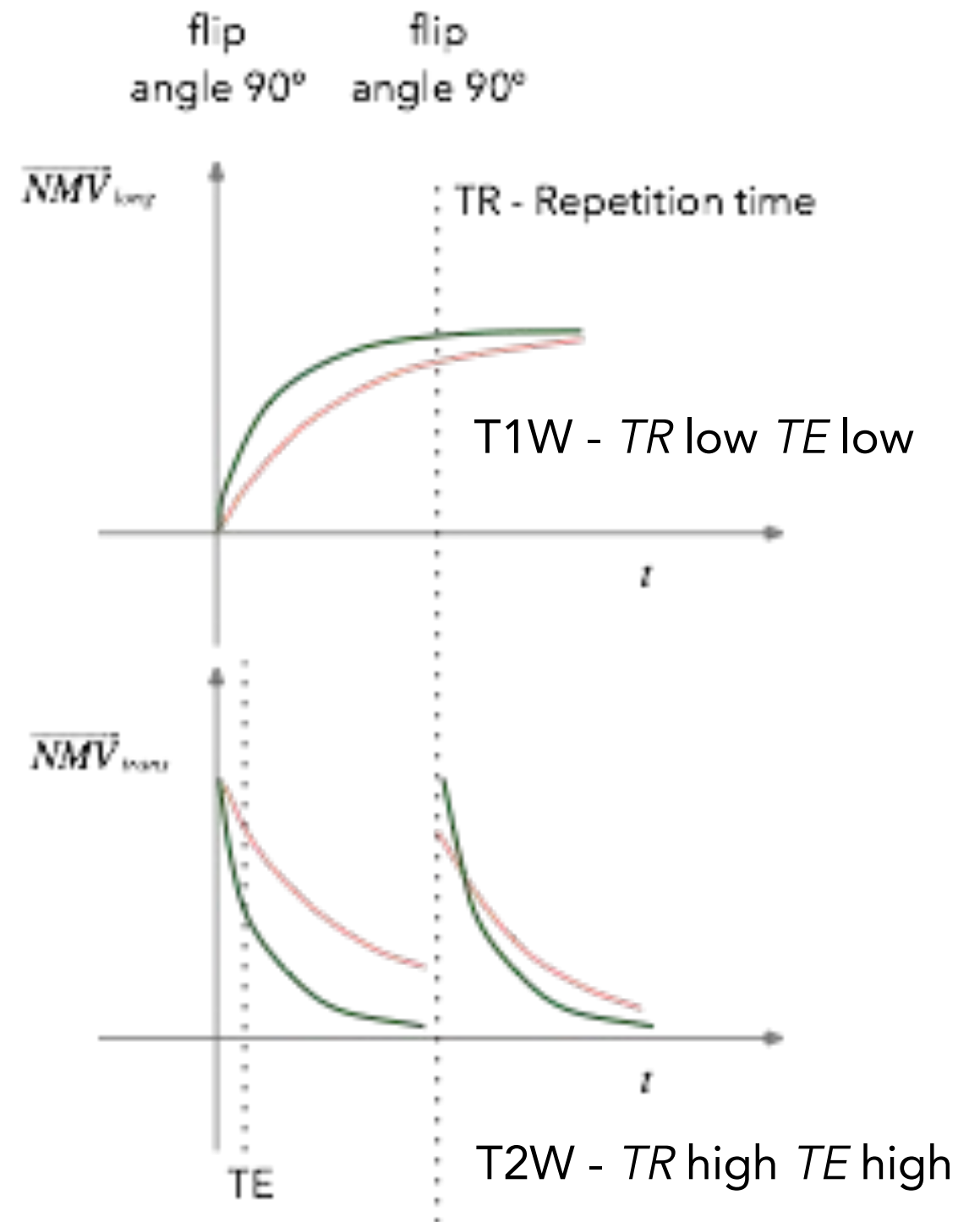
# Contrast

- contrast -
- Let us look closer at the transverse/longitudinal magnetisation

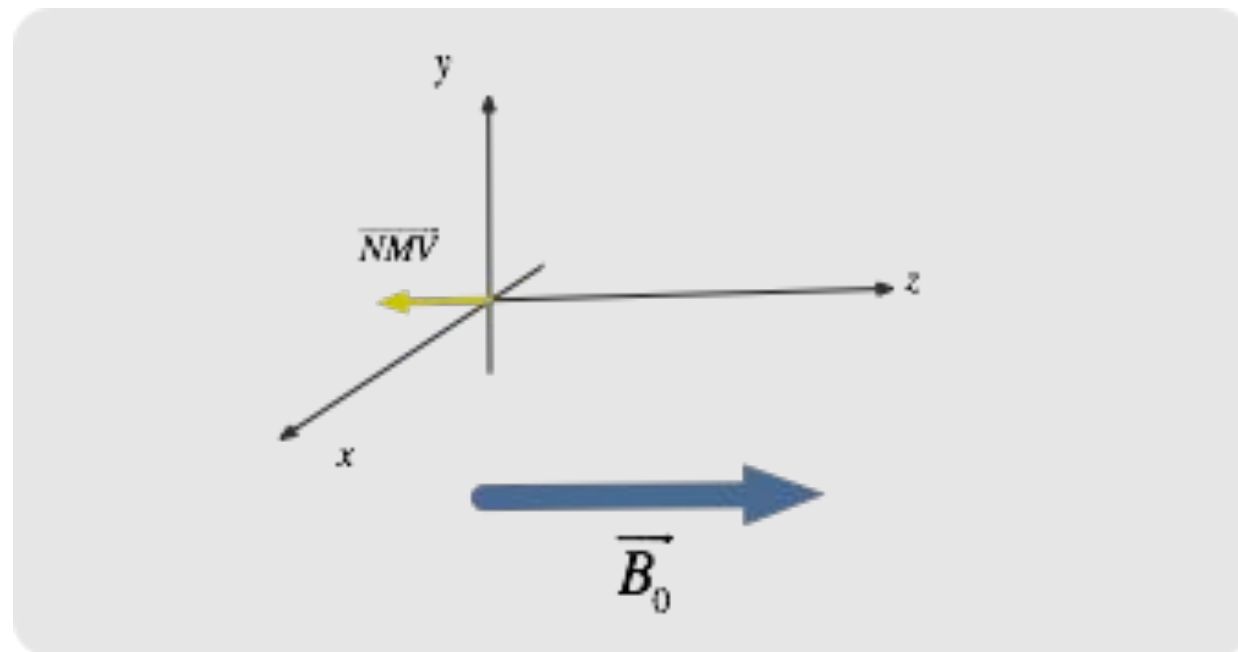


# Contrast

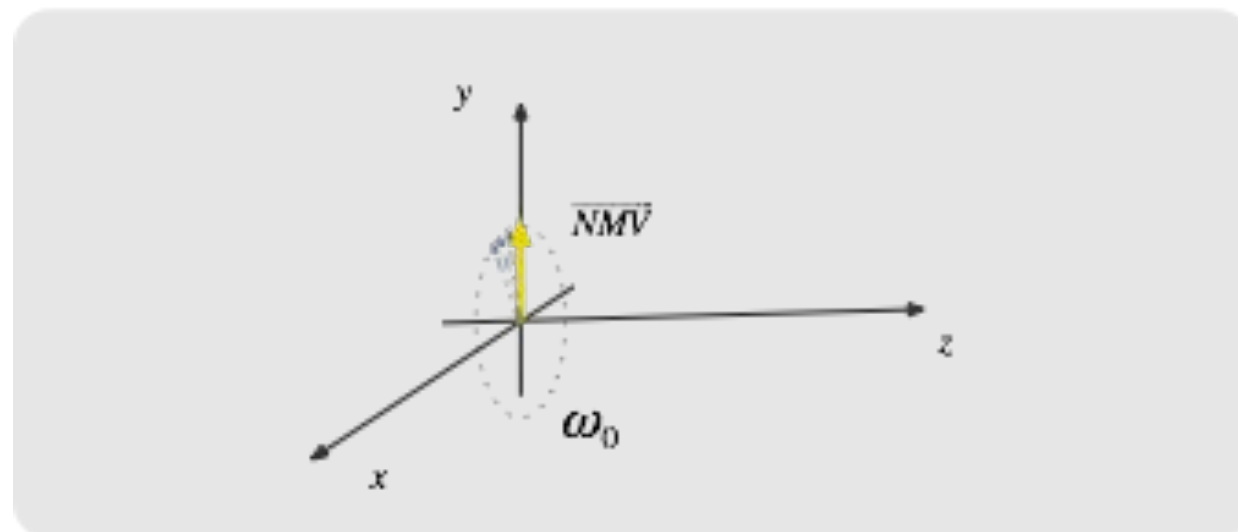
- contrast - transverse/longitudinal magnetisation
- Add a RF pulse TR after the first and look at the NMV components
- image with T1 contribution to the SI,
- image with the T2 contribution



# Magnetic susceptibility



unfortunately,  $B_0$  is not exactly the same throughout the entire body

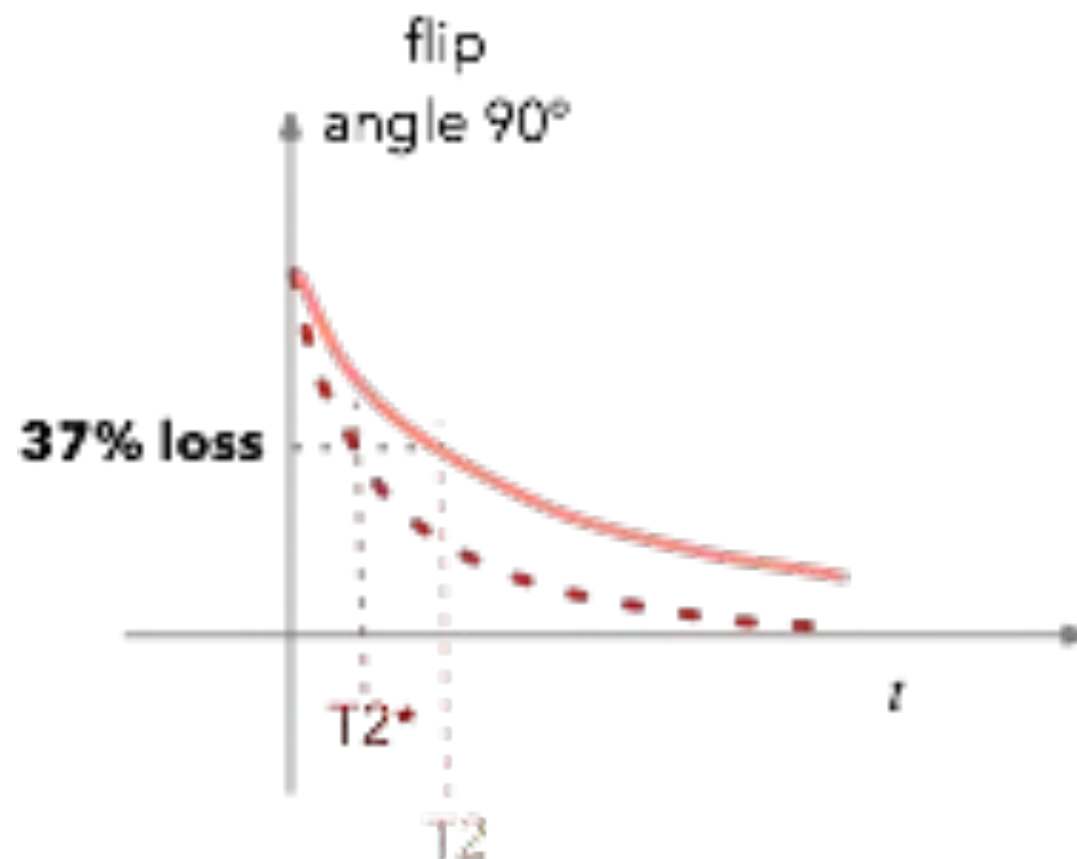


interaction of tissues with the applied magnetic field  $B_0$  causes point-to-point variability - local amount of magnetic field ( $X$ )

$$\omega = \gamma(B_0 + X)$$

freq determined by the  $B_0$

# Magnetic susceptibility

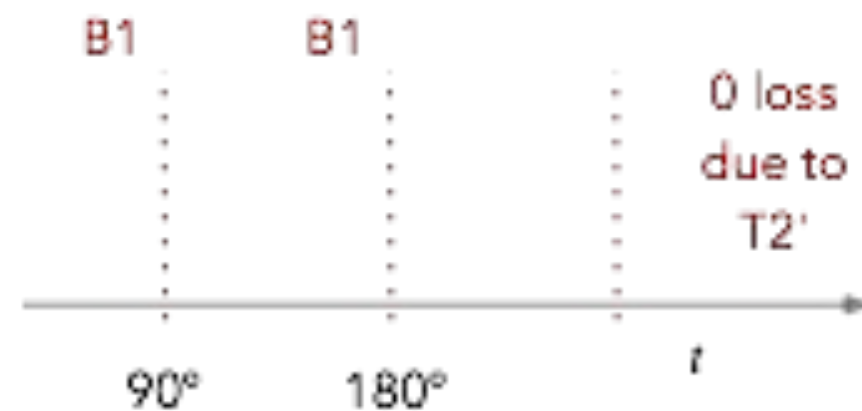
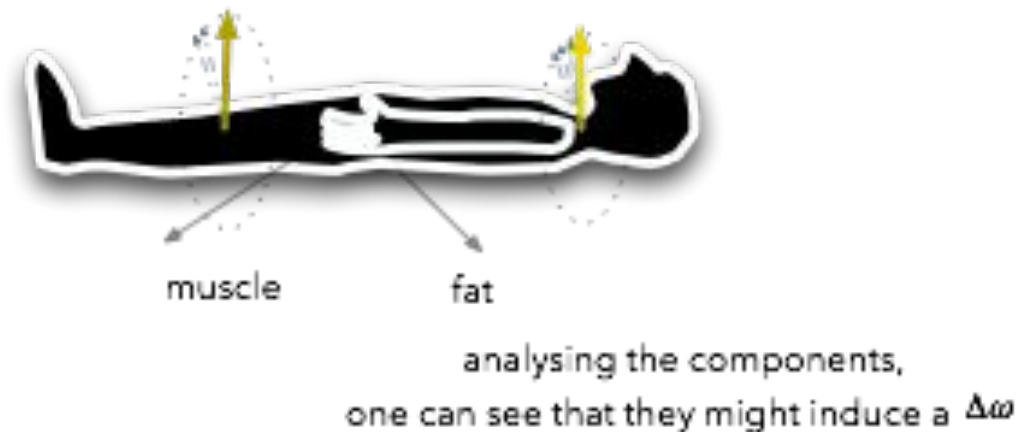


- Interaction of tissues in the magnetic field  $B_0$  causes point-to-point variability
  - local amount of magnetic field (X)
    - two neighbour spins experience two different magnetic field,
    - precess at different rates  $\Delta\omega$
    - de-phase faster
- Real-life relaxation -  $T_2^*$

$$\omega = \gamma(B_0 + T_2')$$

# Spin Echo

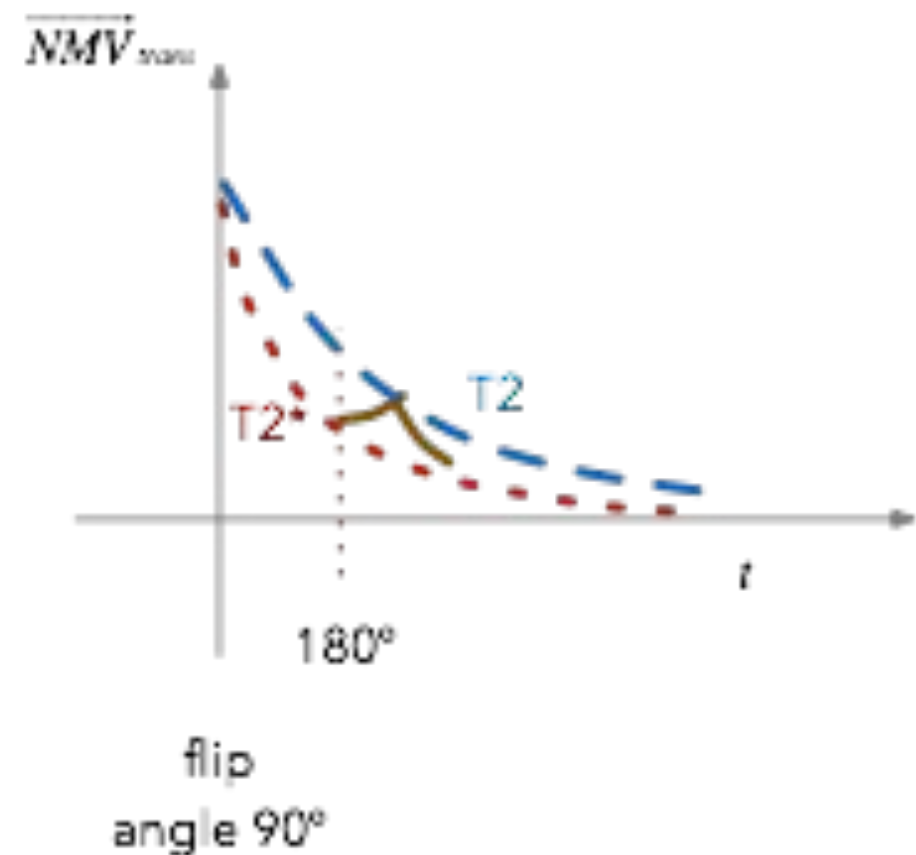
- de-phasing faster due to magnetic susceptibility
- can we correct it?
- Spin-echo
  - loss and recovery of signal





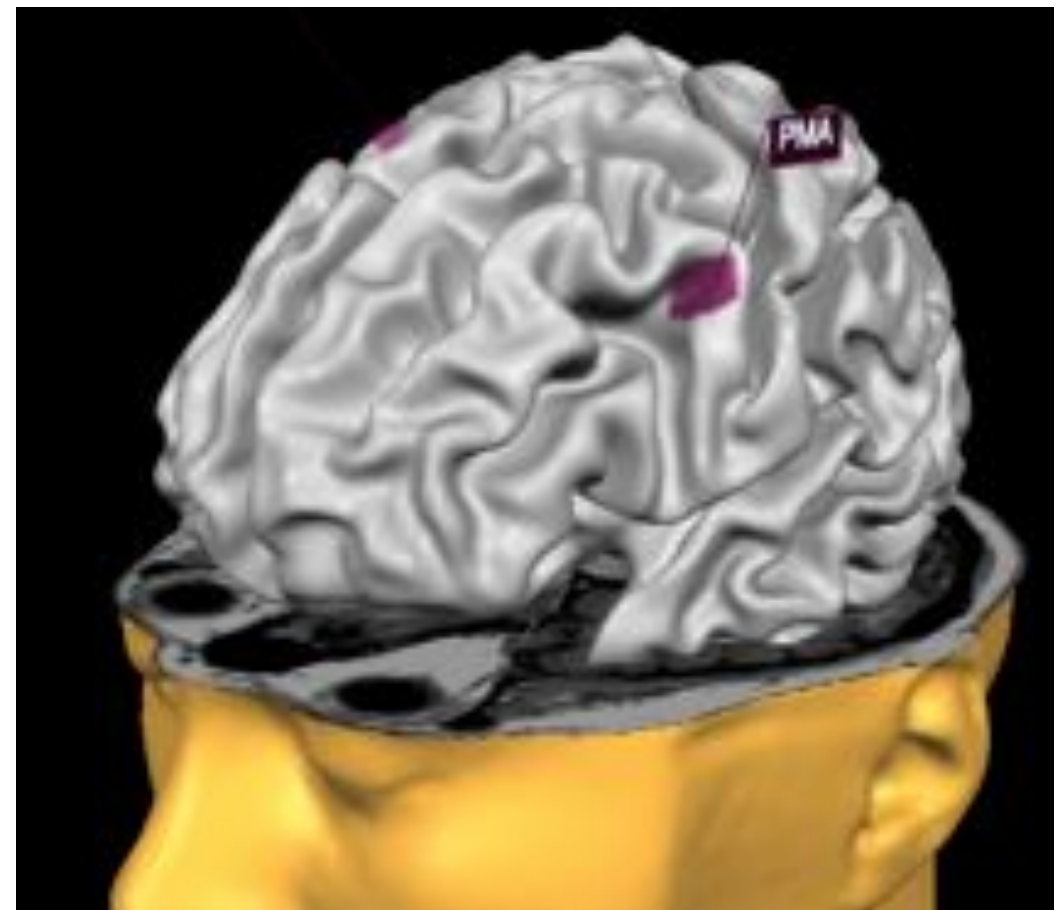
# Spin Echo

- Loss and recovery of signal intensity
- Allows to recover the T2 curve based on the 90 and 180° pulses



# functional MRI

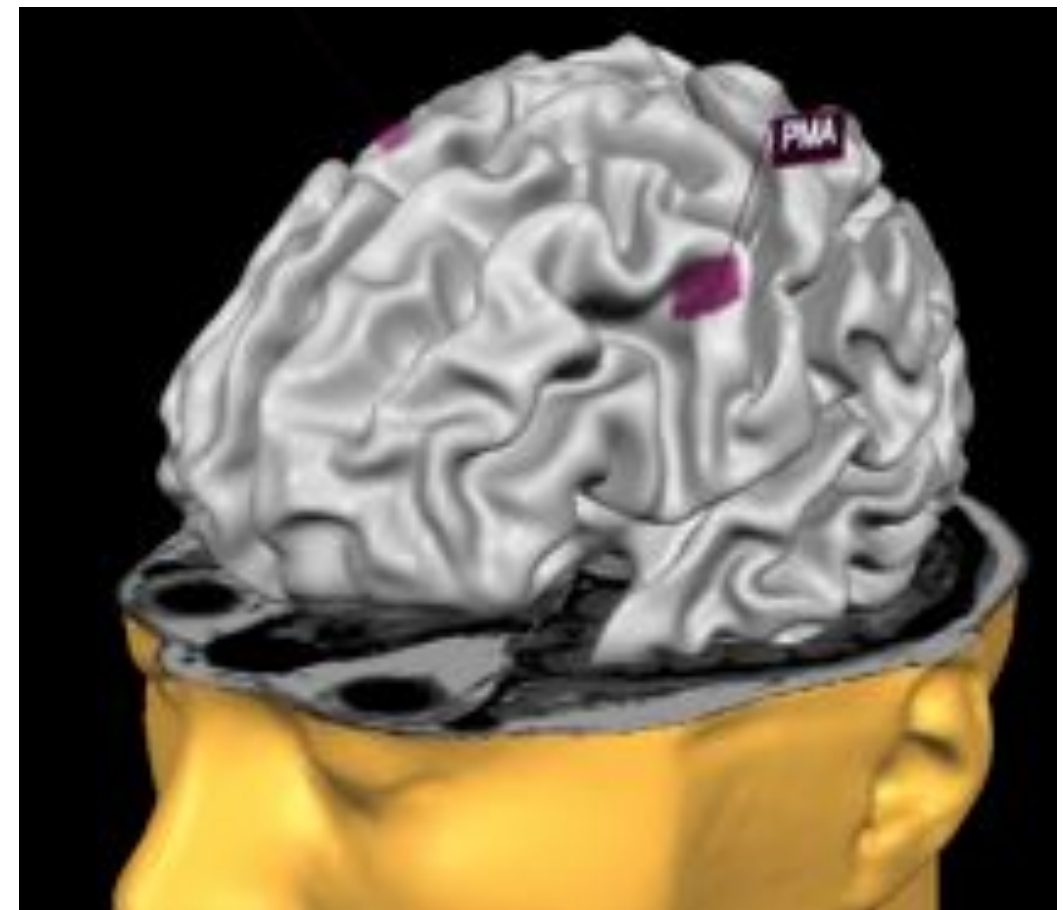
- How can we use this to study the brain function?



Brainvoyager Tutor

# functional MRI - background

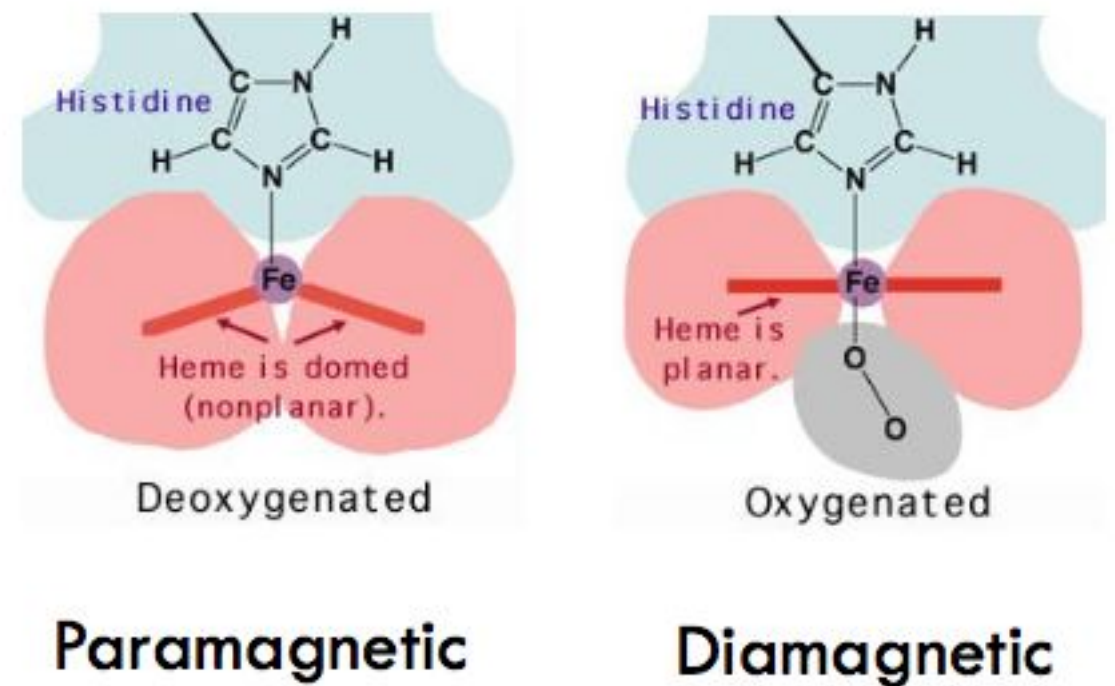
- Pre-operative tool (e.g. Epilepsy studies)
- The brain is *functionally* sub-specialized
  - brain regions related to/engaged specific tasks
  - increase in neuronal activity in these regions
  - the neurons require additional amount of metabolic substrates - vascular response
  - oxygen is delivered to cells bonded to *haemoglobin*



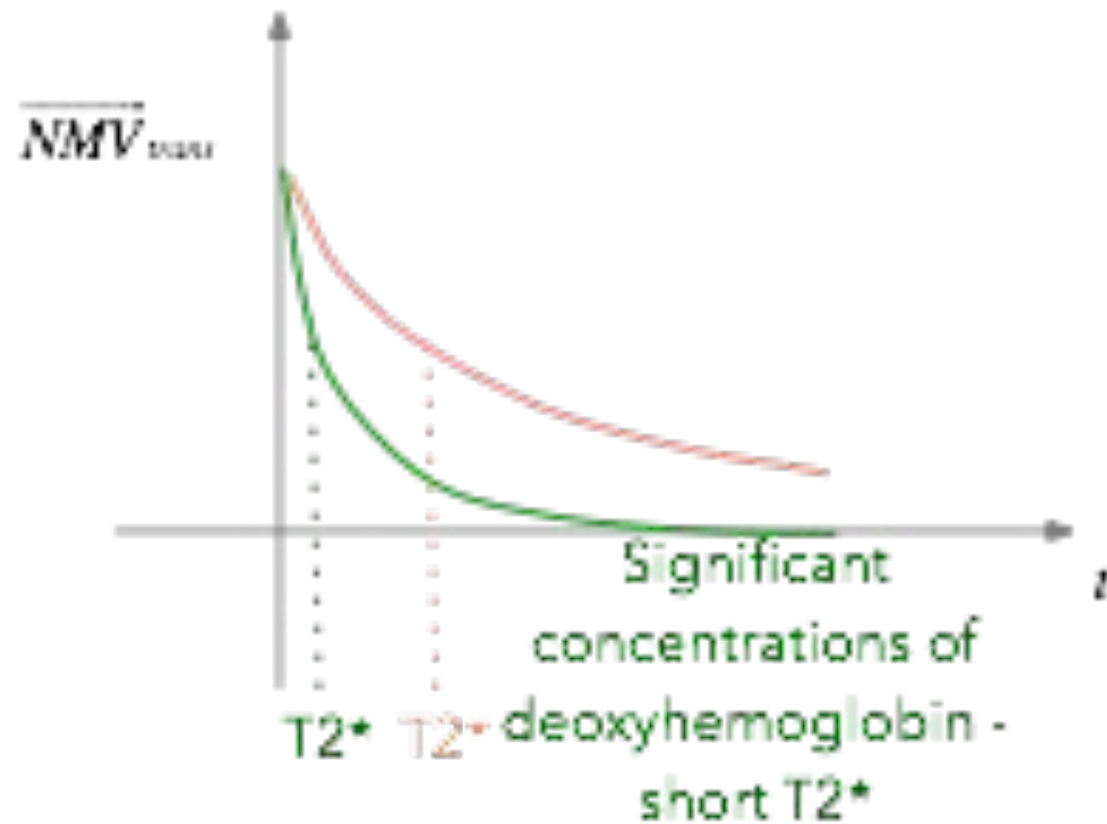
Brainvoyager Tutor

# functional MRI - background

- Oxygenated haemoglobin is diamagnetic
- elements that have a very weak susceptibility
- Deoxygenated haemoglobin is paramagnetic
- have a stronger susceptibility



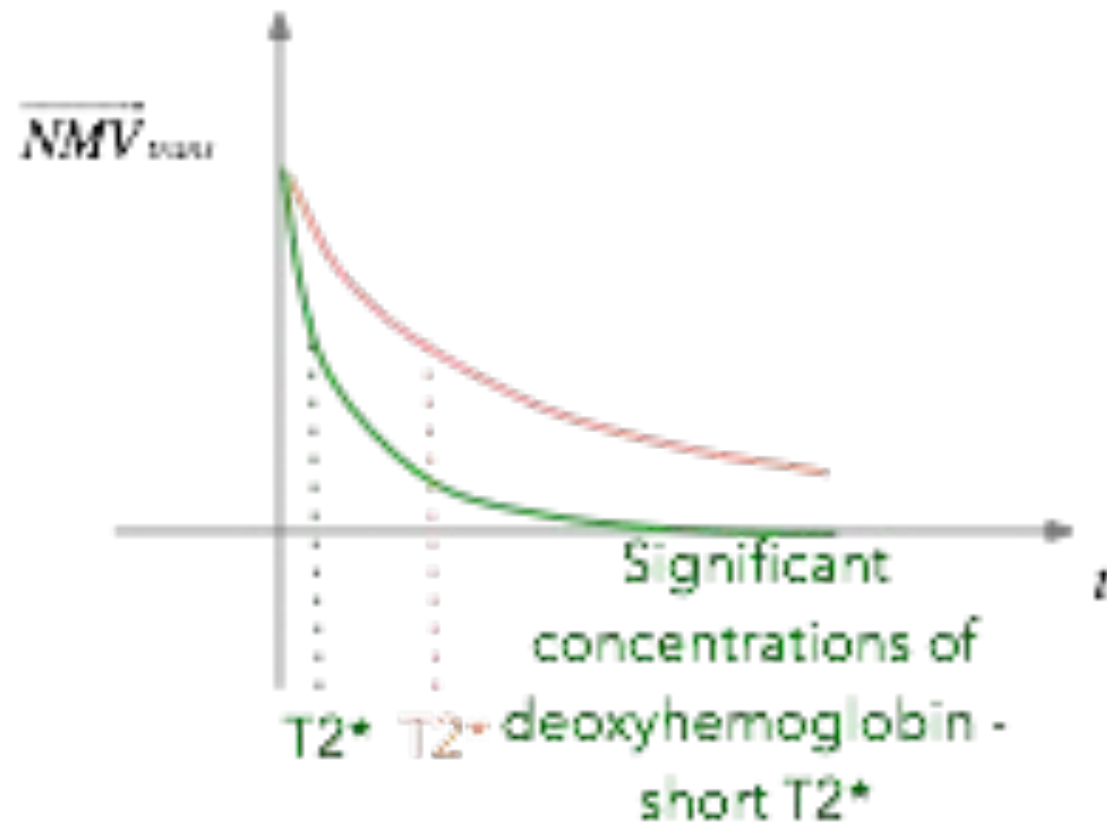
# functional - BOLD



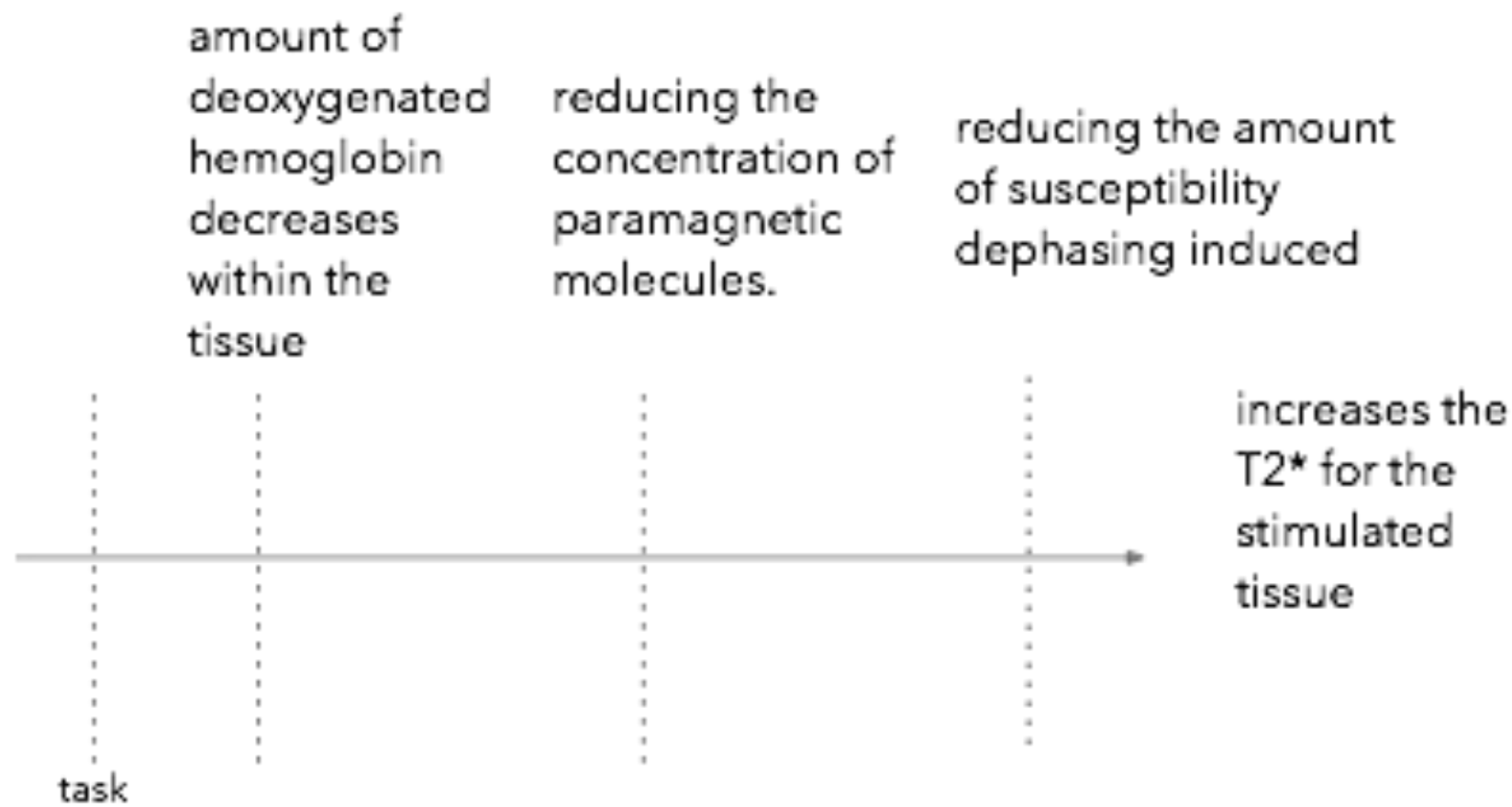
Significant concentrations of deoxygenated hemoglobin shorten the  $T2^*$  relaxation time of the tissue

- *decrease in SI compared to tissue with oxygenated haemoglobin.*

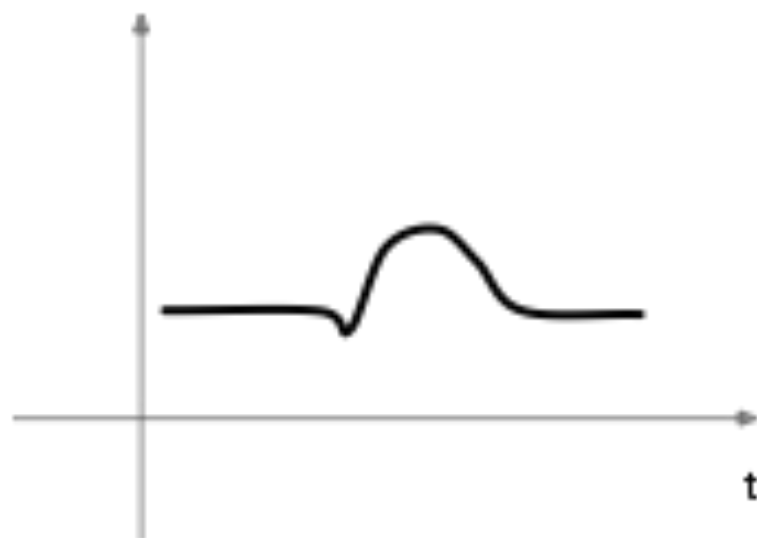
# functional - blood-oxygenation-level-dependent effect or BOLD effect



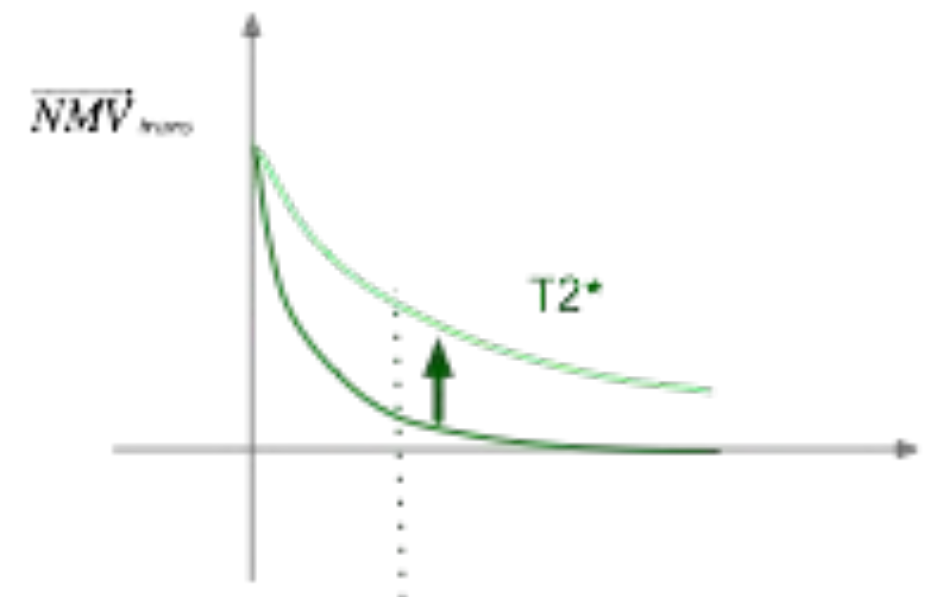
Let us assume that stimulated tissue - e.g. brain cortex engaged in a task - undergoes an increase in blood flow with an increased delivery of oxygenated haemoglobin



Ox:DeOx ratio

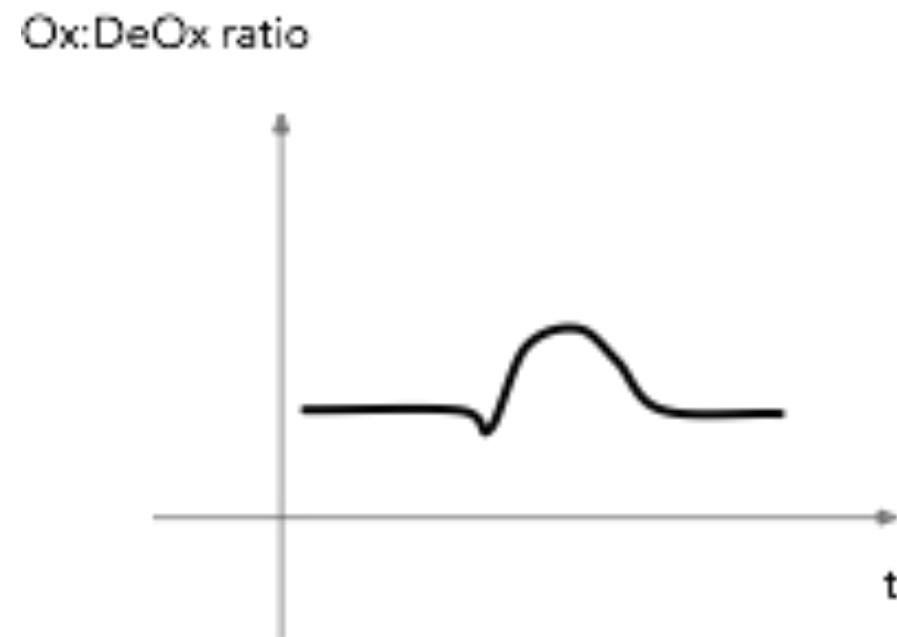


Haemodynamic response function



# functional MRI

- How can we get an image based on this information?

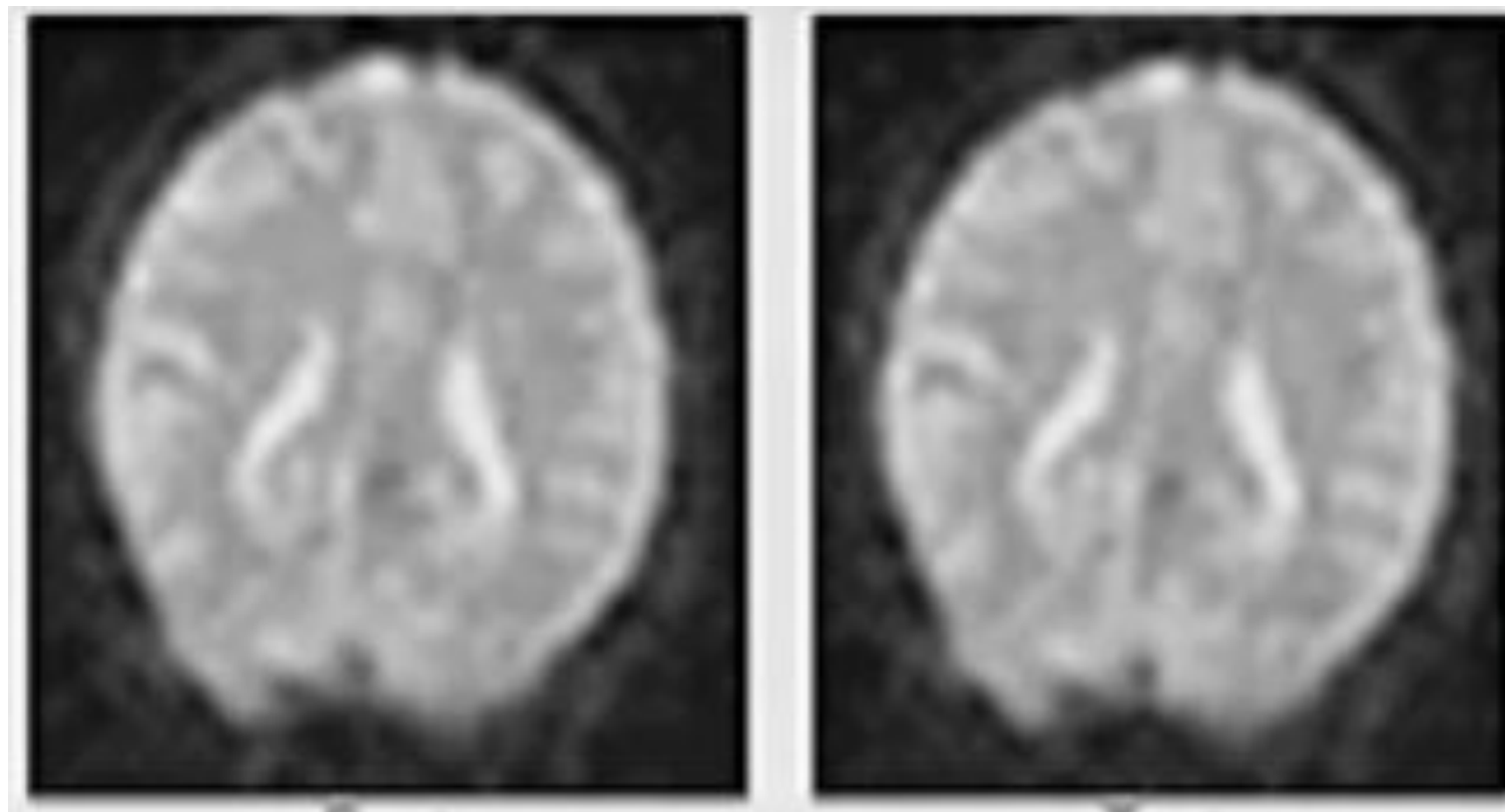


- If enough resolution (contrast), we could determine which voxels change during task performance
  - delay after the beginning
  - very small signal change (2 to 3 % variation)



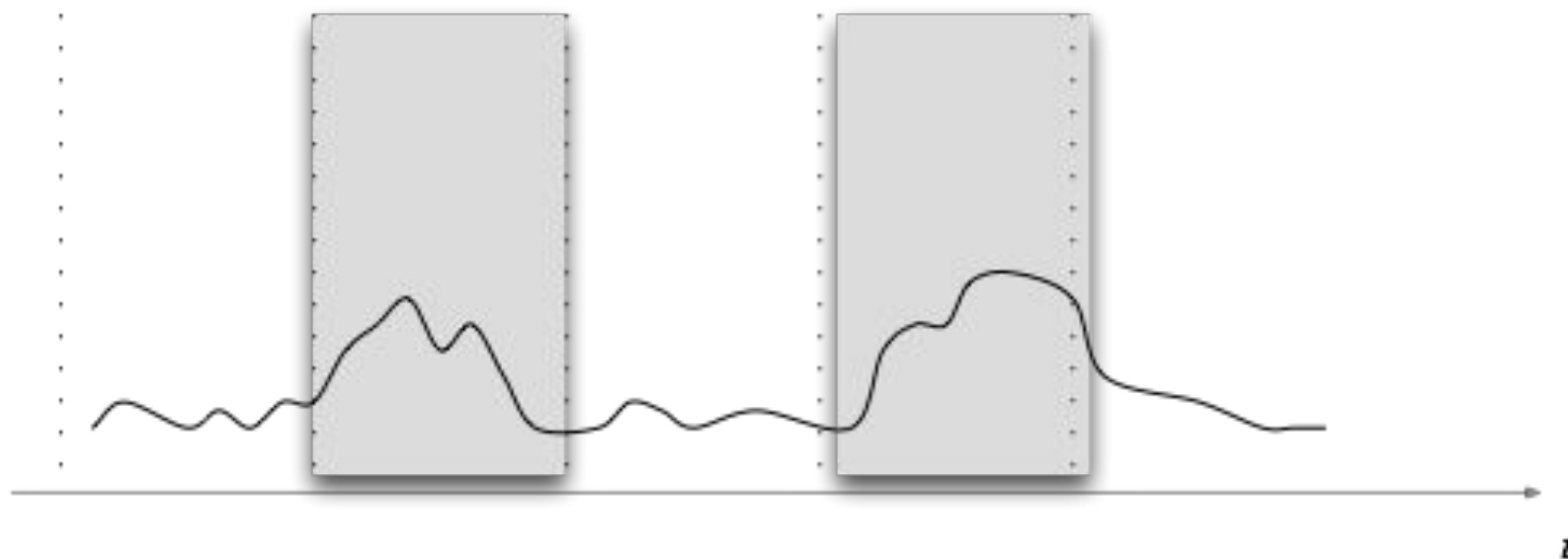
# fMRI data

difference between two fMRI images



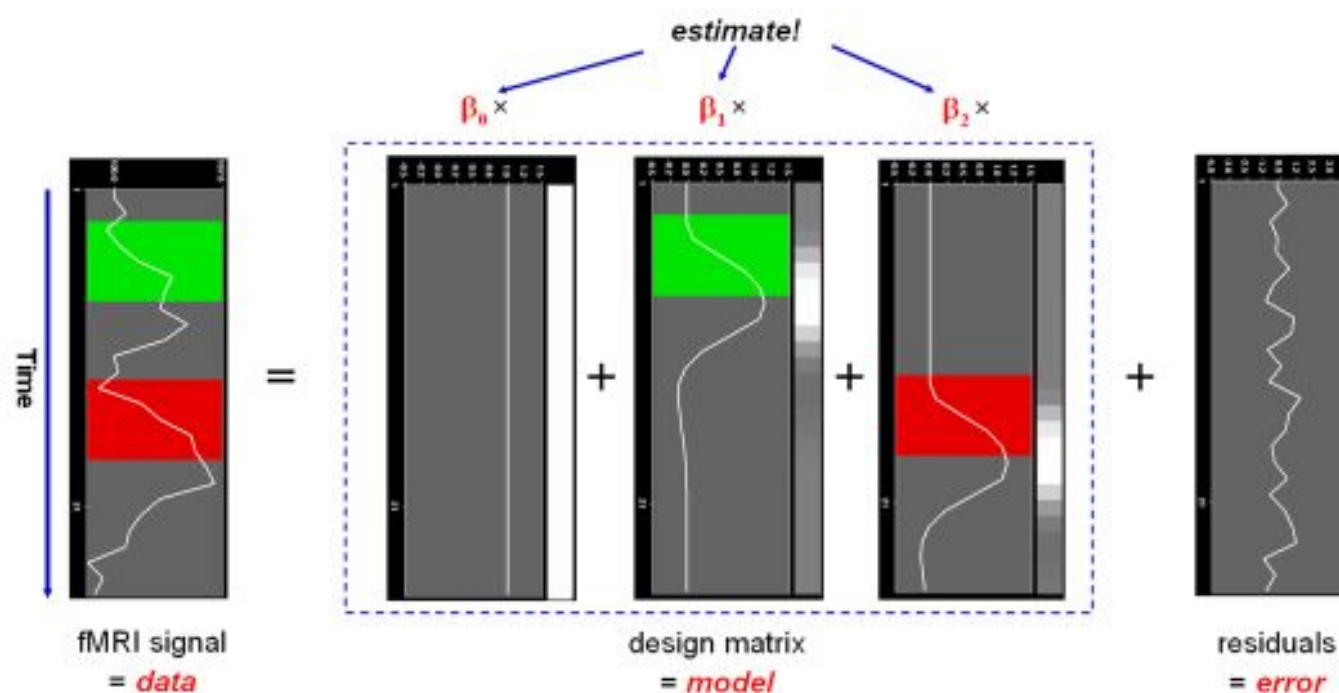
# functional MRI

- The typical approach is to perform a large series of measurements in the presence and absence of the stimulus and subtract the images
- increasing statistical significance



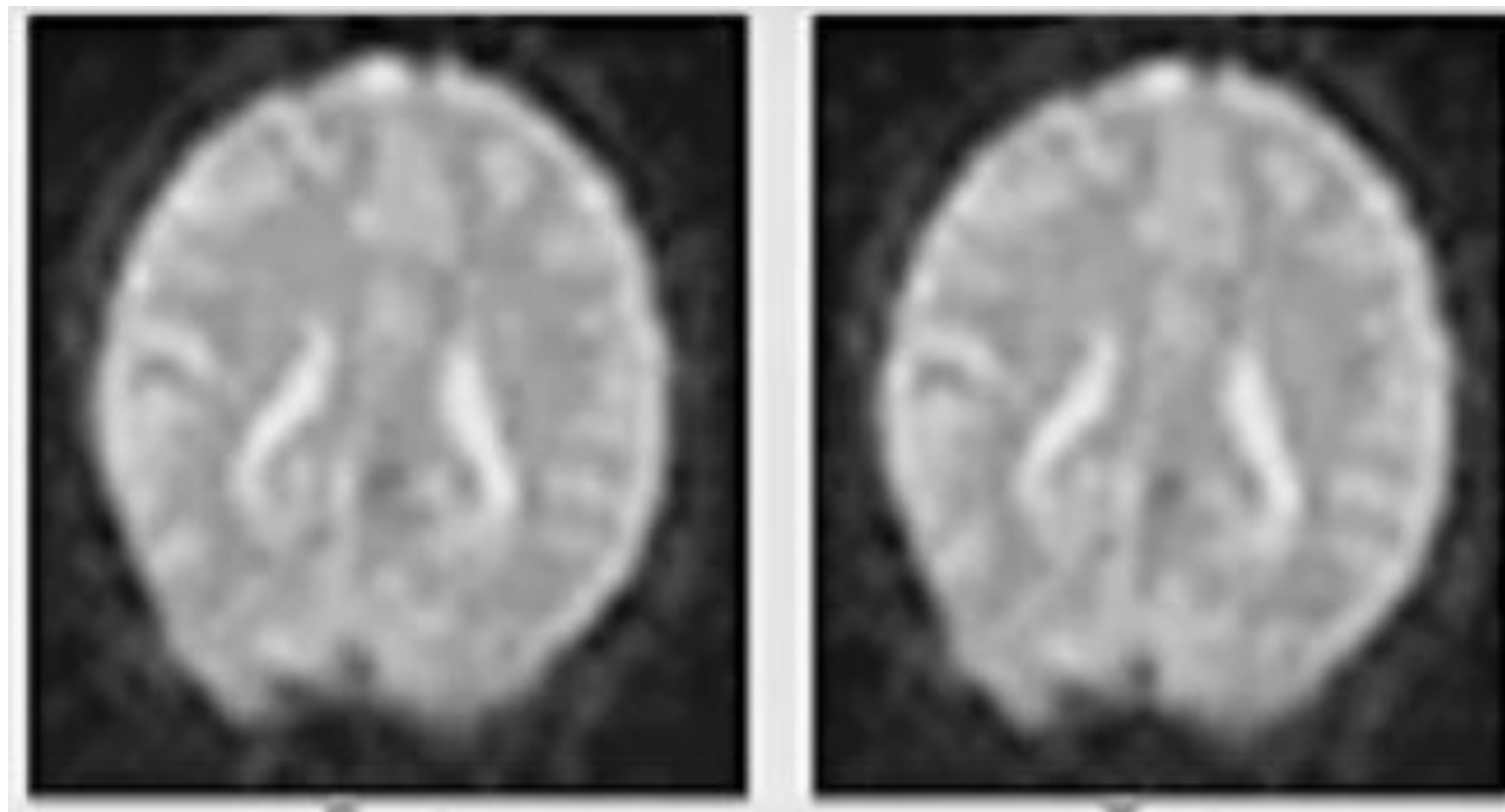
# General Linear Model

- Statistical framework
  - Simplest case: baseline and condition
  - but we can go further and use different conditions



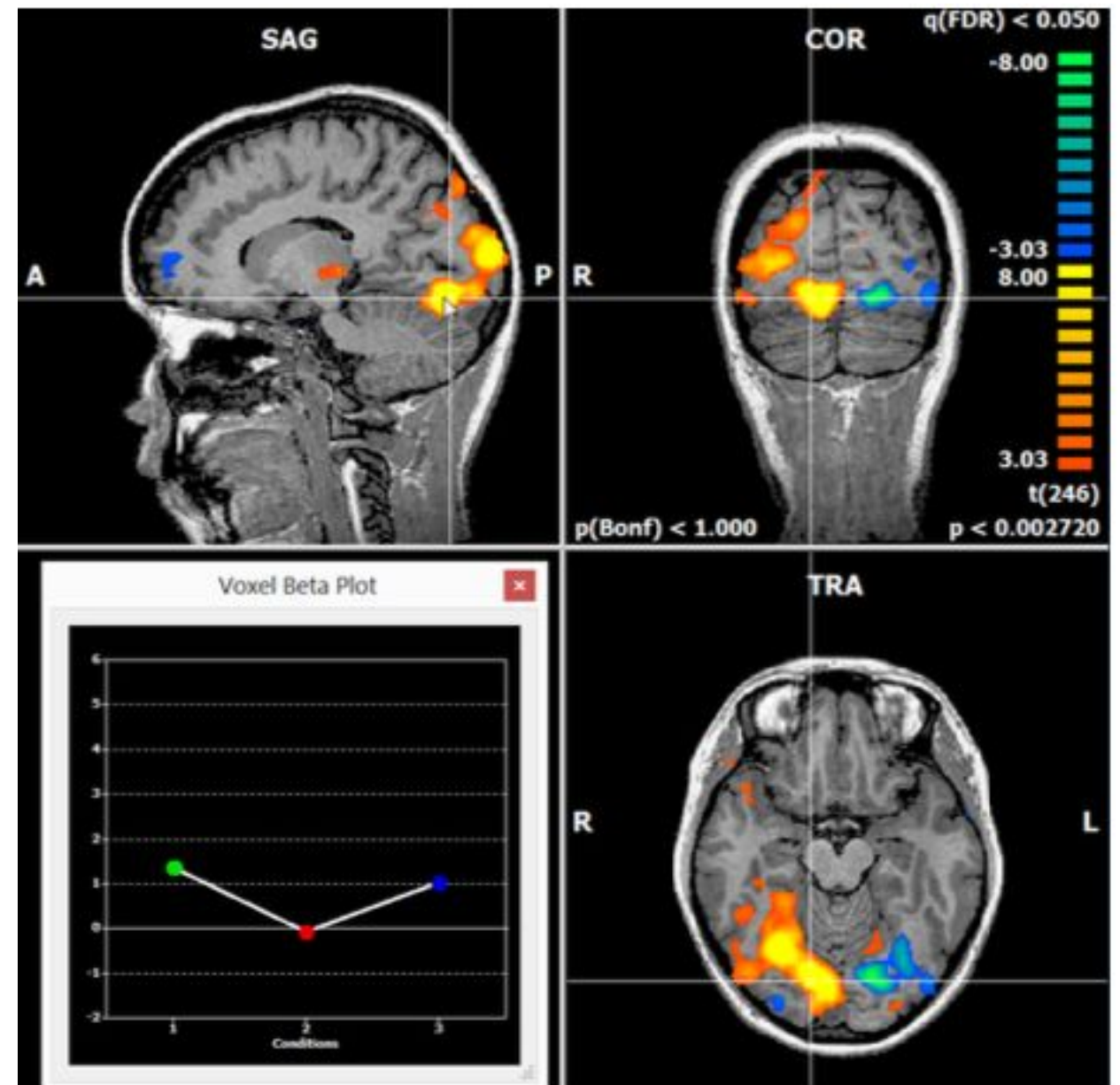
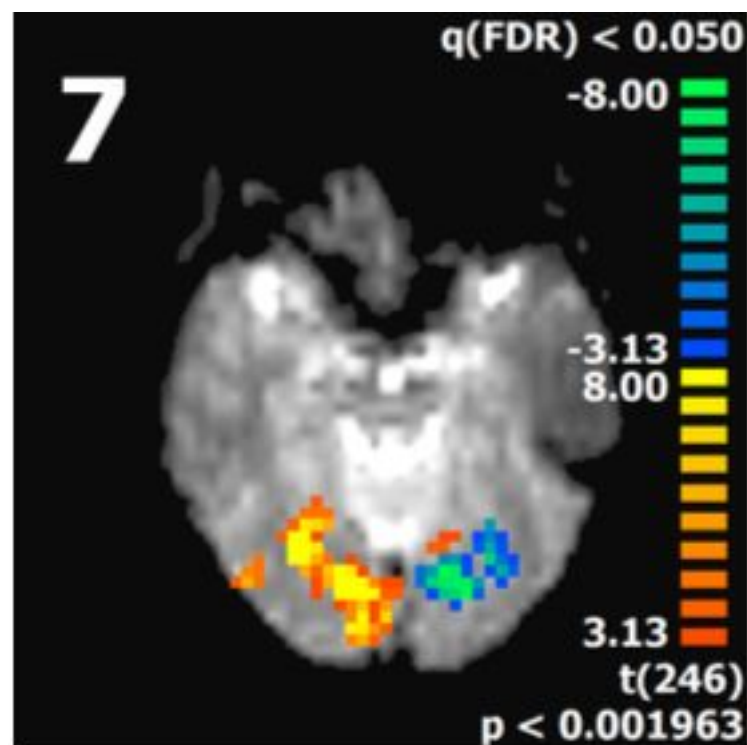
# fMRI statistical map

difference between two fMRI images



# fMRI statistical map

2D and 3D statistical map based on GLM contrast condition>baseline



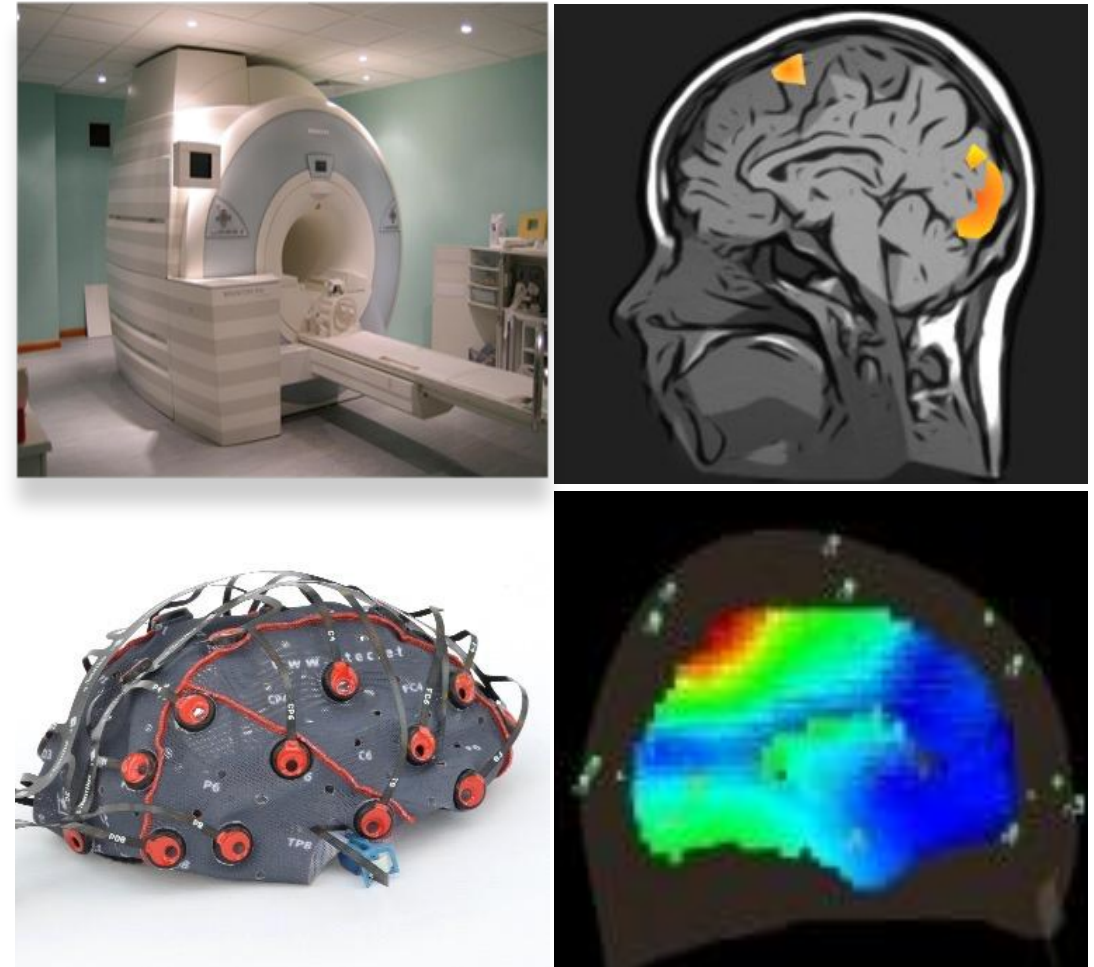
Questions?

# Project *Braintrain*



# Background

- Developments in neuroimaging
  - Information about areas previously unavailable to other imaging techniques
    - *Direct* access to brain function
    - Identification of *neural correlates*/functional networks

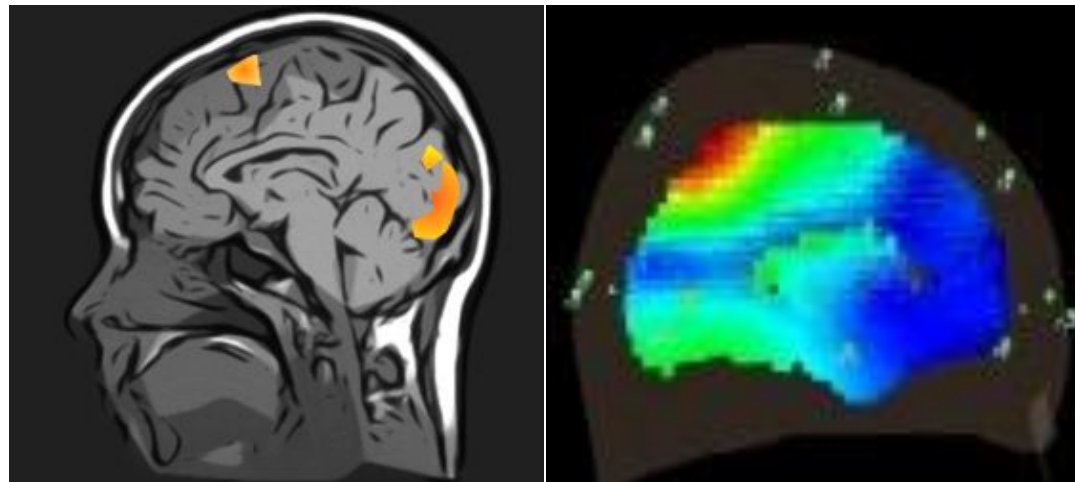


Magnetic Resonance Imaging (MRI) Scanner and Electroencephalography (EEG)

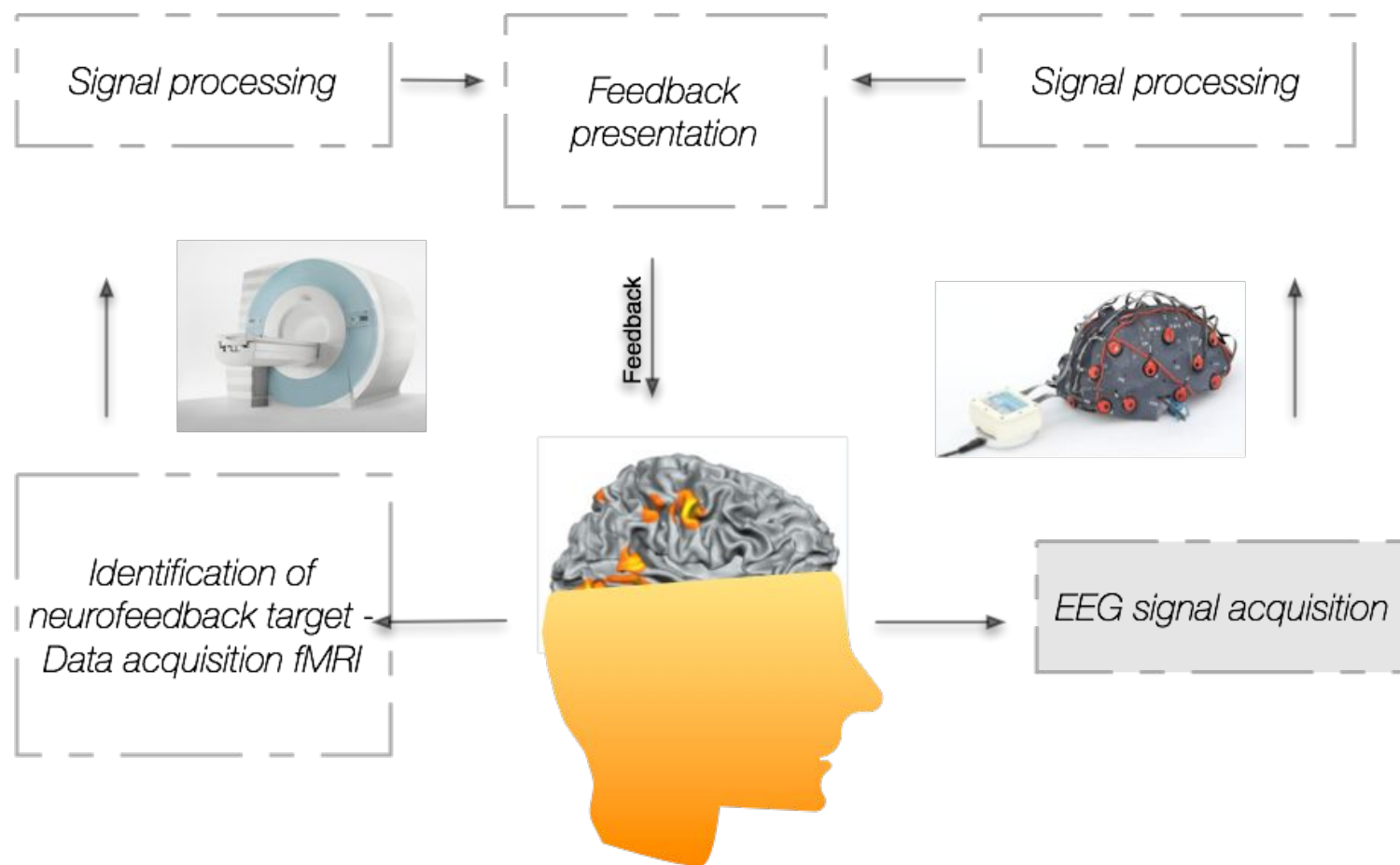


# Background

- Unique view to understanding brain dysfunctions
- Comparison between control and clinical groups
  - Access to the mechanisms involved
  - Creation/development of interventional tools/applications
    - Direct/personalised intervention on the dysfunctional mechanisms

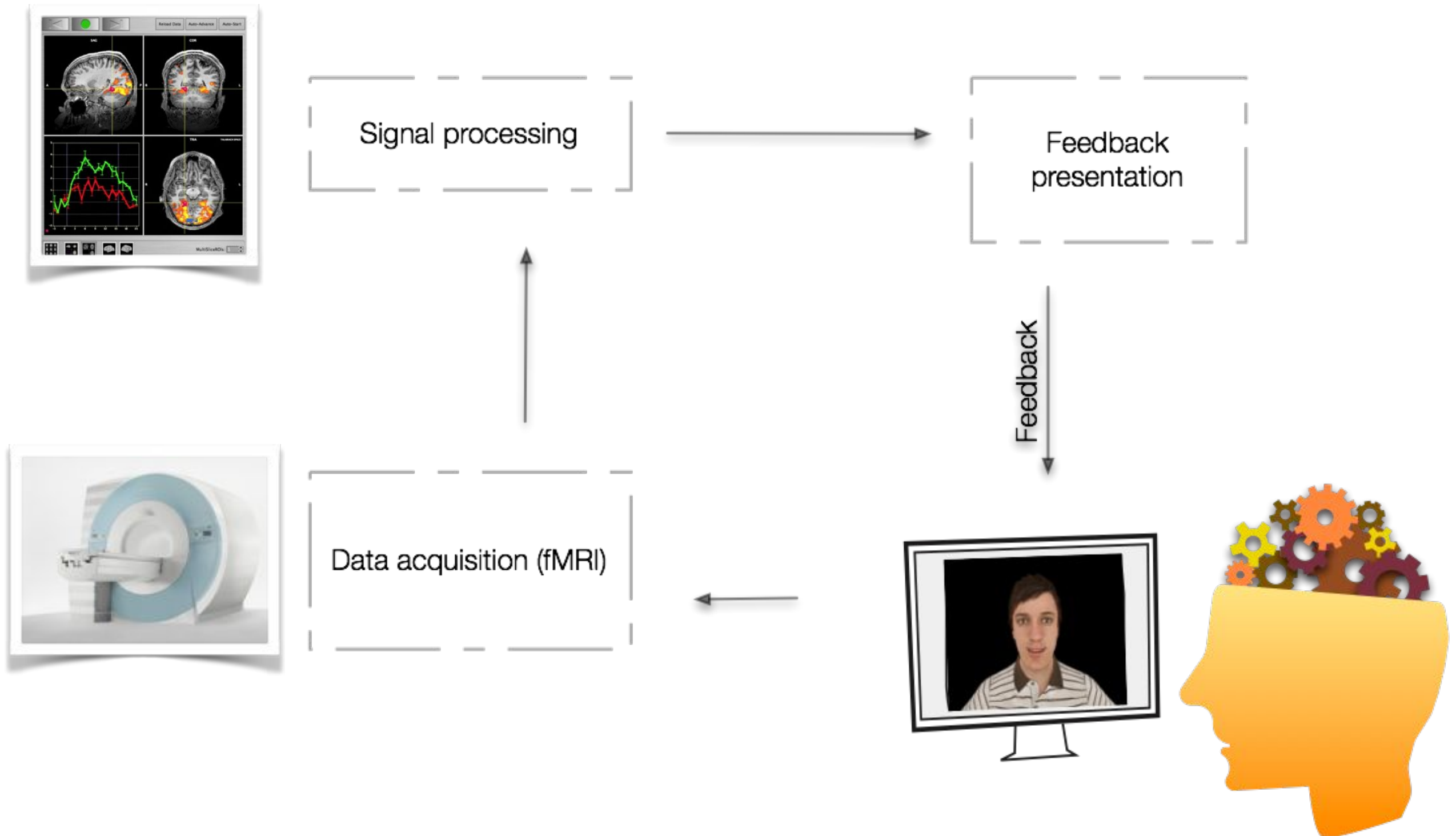


# Neurofeedback and Brain-Computer Interfaces



- Uses information from neuroimaging in (pseudo) real-time
- Allows to present this information to the participant
- The participant can *regulate his own brain activity*

# rt-fMRI Neurofeedback

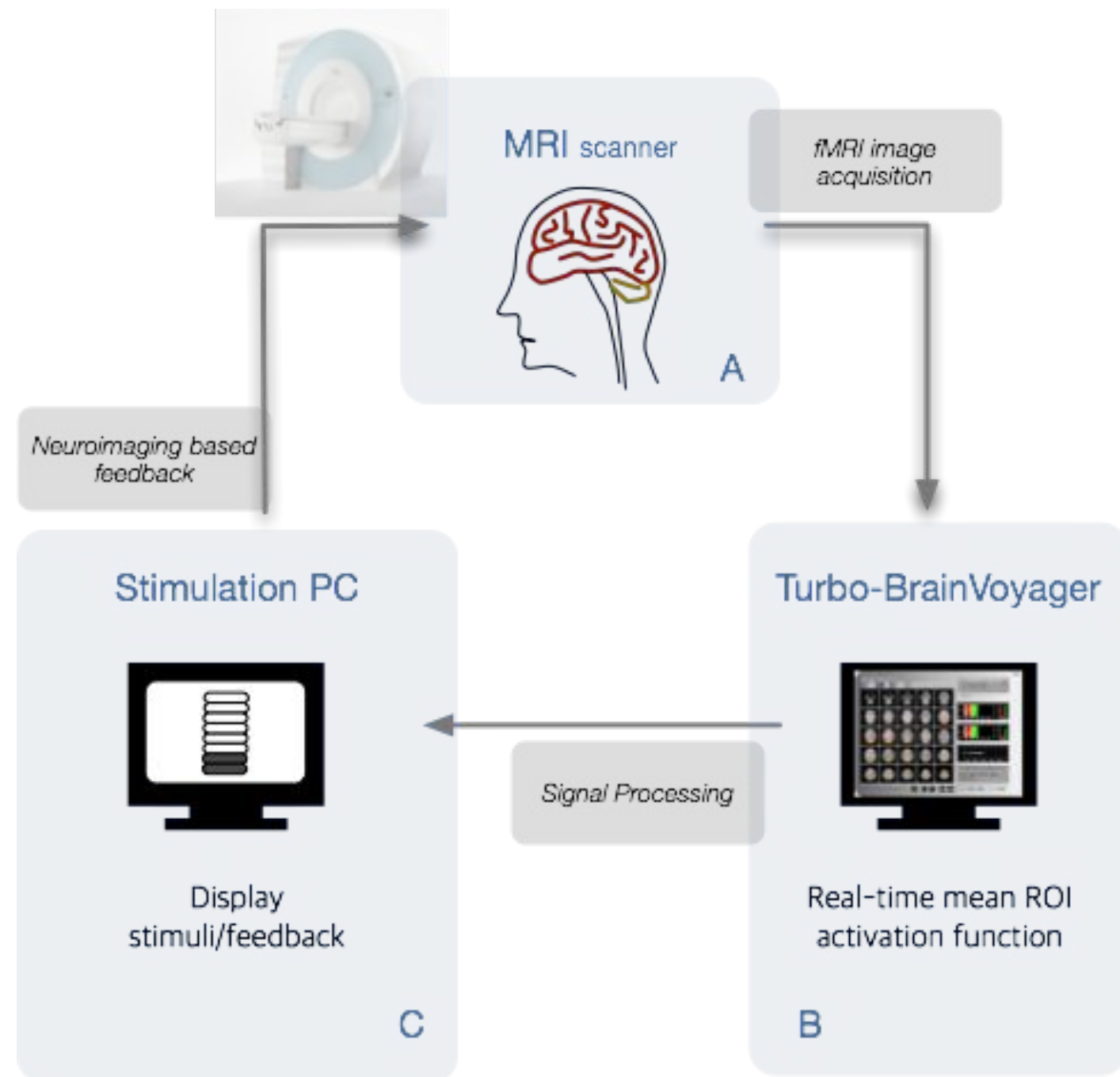


# Training and self-regulation of brain activity

- Modulation of the activity of specific brain regions and/or neural networks
  - Restore function
    - Improve clinical symptoms
  - Induce changes on impaired underlying mechanisms
  - Optimisation / functional reorganisation
    - *Neuroplasticity*

# Technical implementation

- Acquisition equipment (A)
  - MRI scanner (3T Siemens Magnetom TimTrio) t
  - Collecting and saving data in a network shared folder
- Accessed by Turbo Brain-Voyager 3.2 software (B)
  - Data preprocessing (3D motion correction) and real-time statistical analysis (online GLM - General Linear Model)
- Subsystem (C) is responsible for the computation of neuroimaging-based feedback

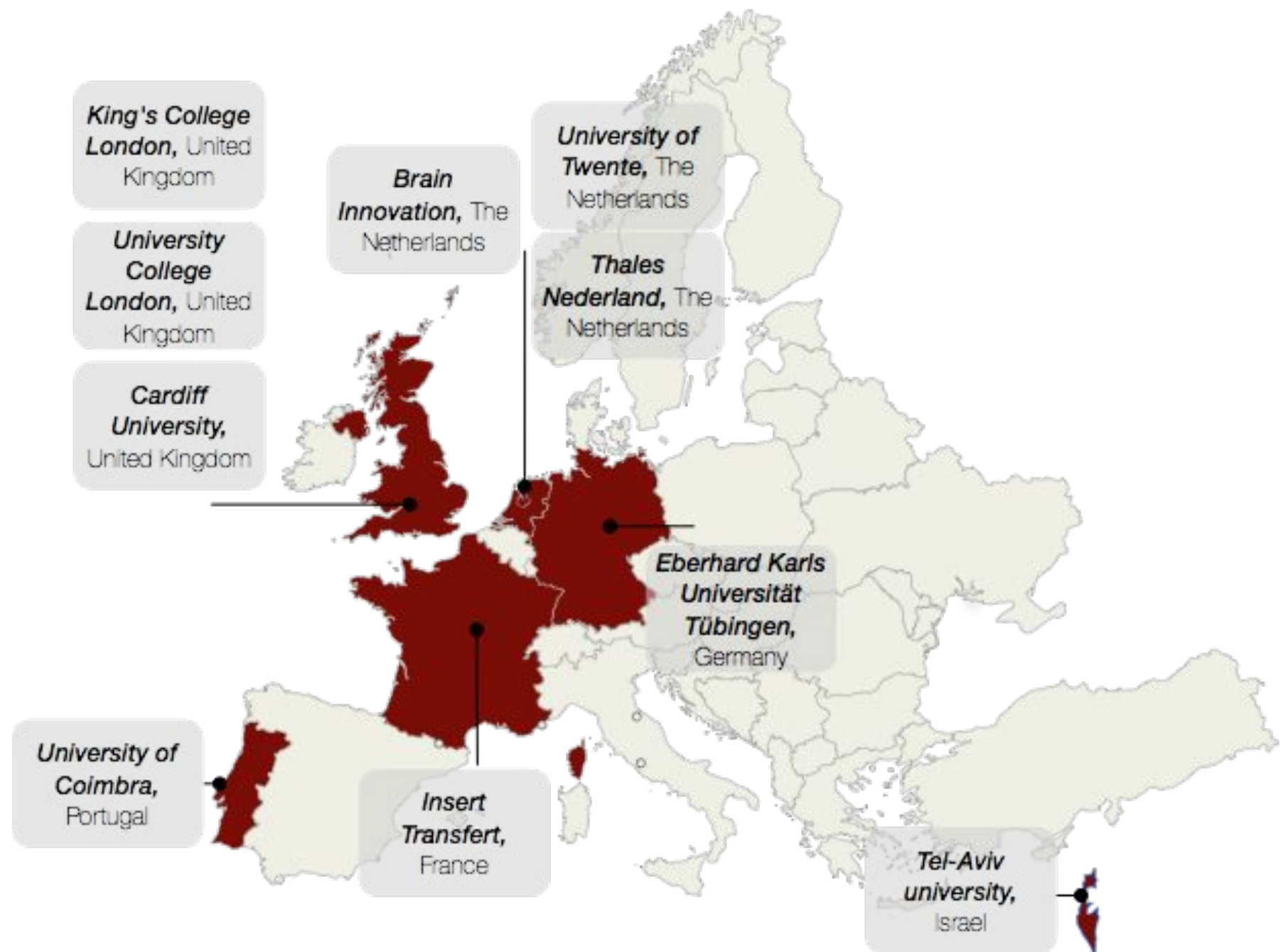


# BrainTrain example

- Let us take a look at the setup using an example...

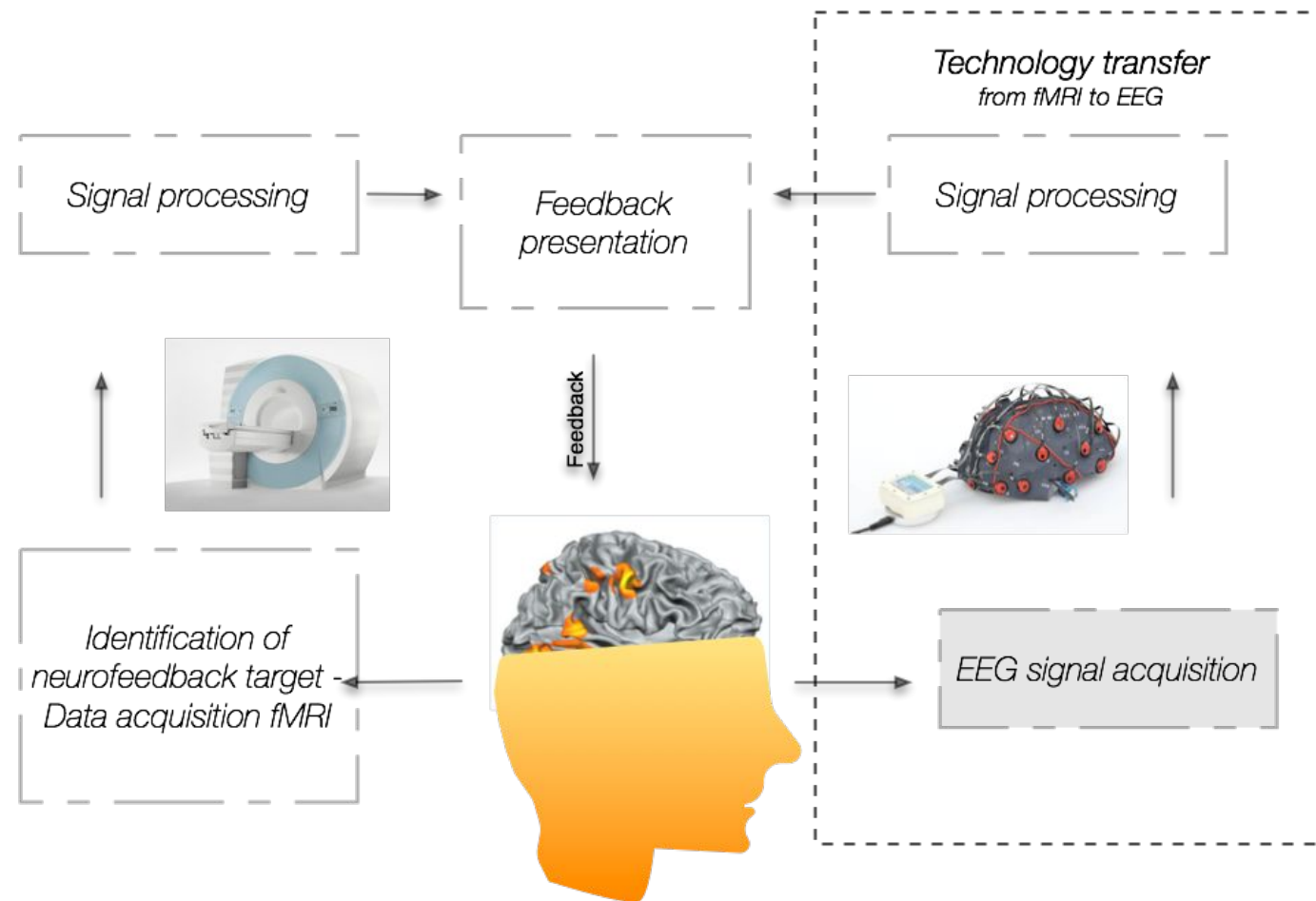
# BrainTrain

*Taking imaging into the therapeutic domain: Self-regulation of brain systems for mental disorders*





# Research Objectives

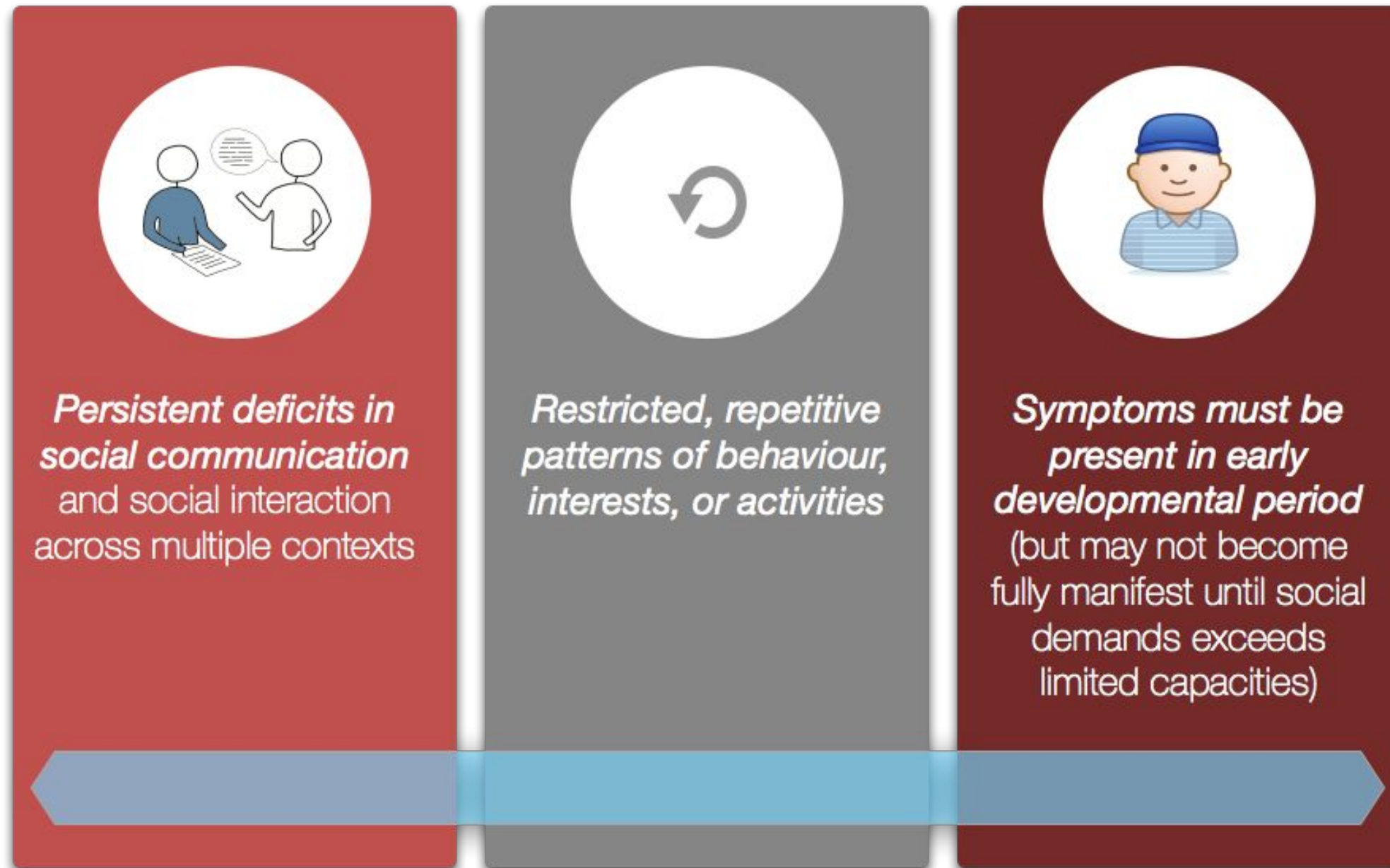


## From Basic Science to Applied Science

Development of new therapeutic/interventional techniques for the improvement of ASD clinical symptoms

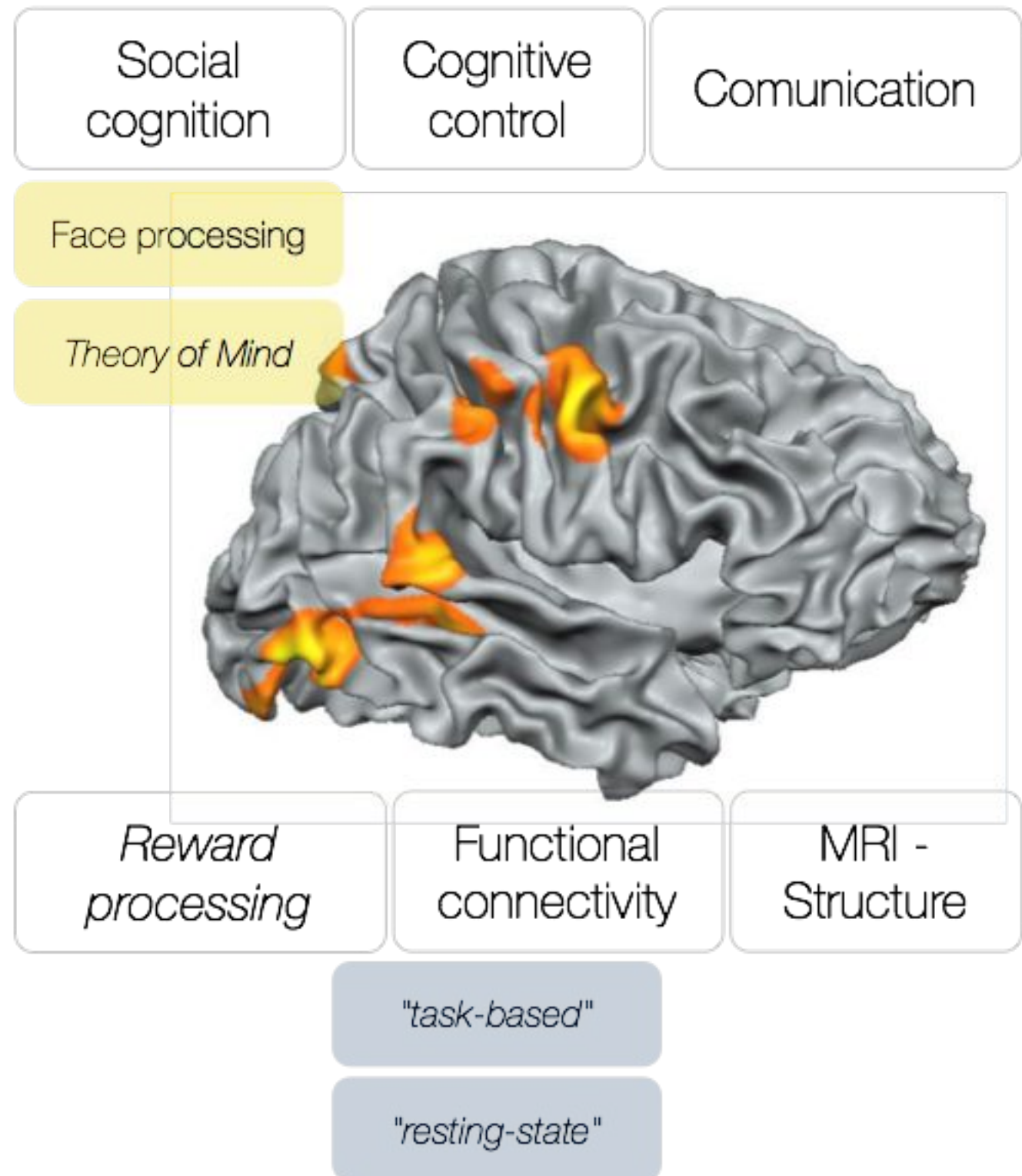


# Autism Spectrum Disorder (ASD)



# Autism Spectrum Disorder (ASD)

- Neuroimage and ASD
- *What have we found thus far?*



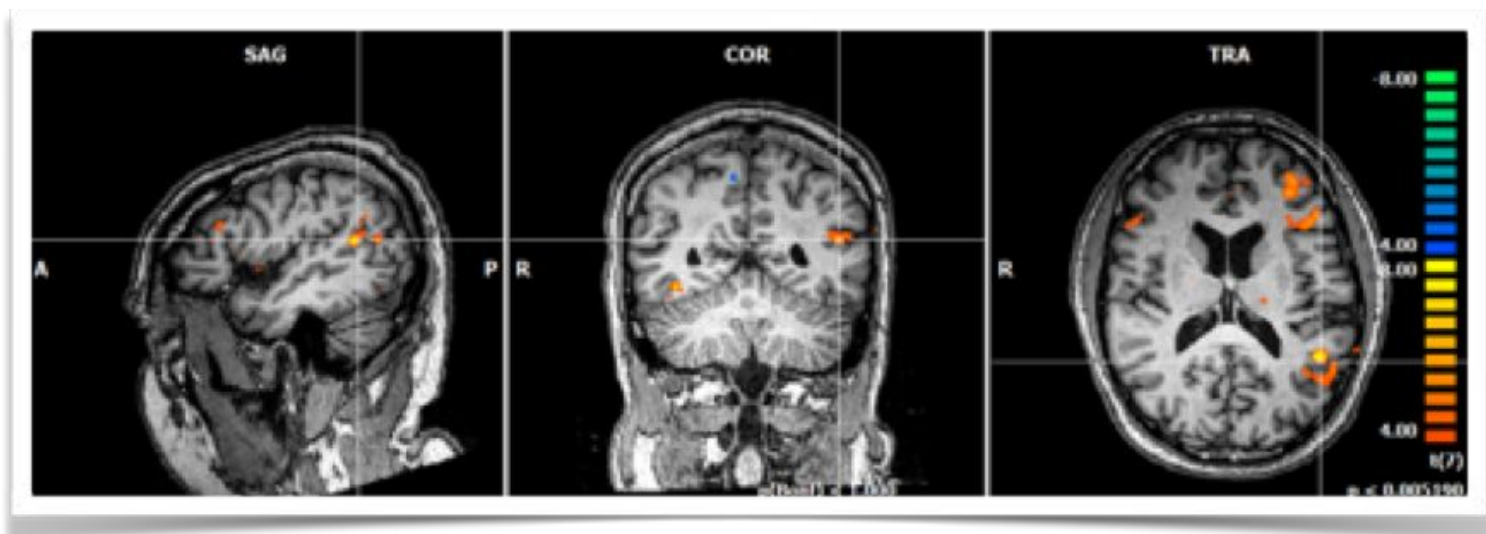
# NF-ASD

*A neurofeedback* strategy  
for the improvement of  
facial expression  
recognition/perception in  
ASD

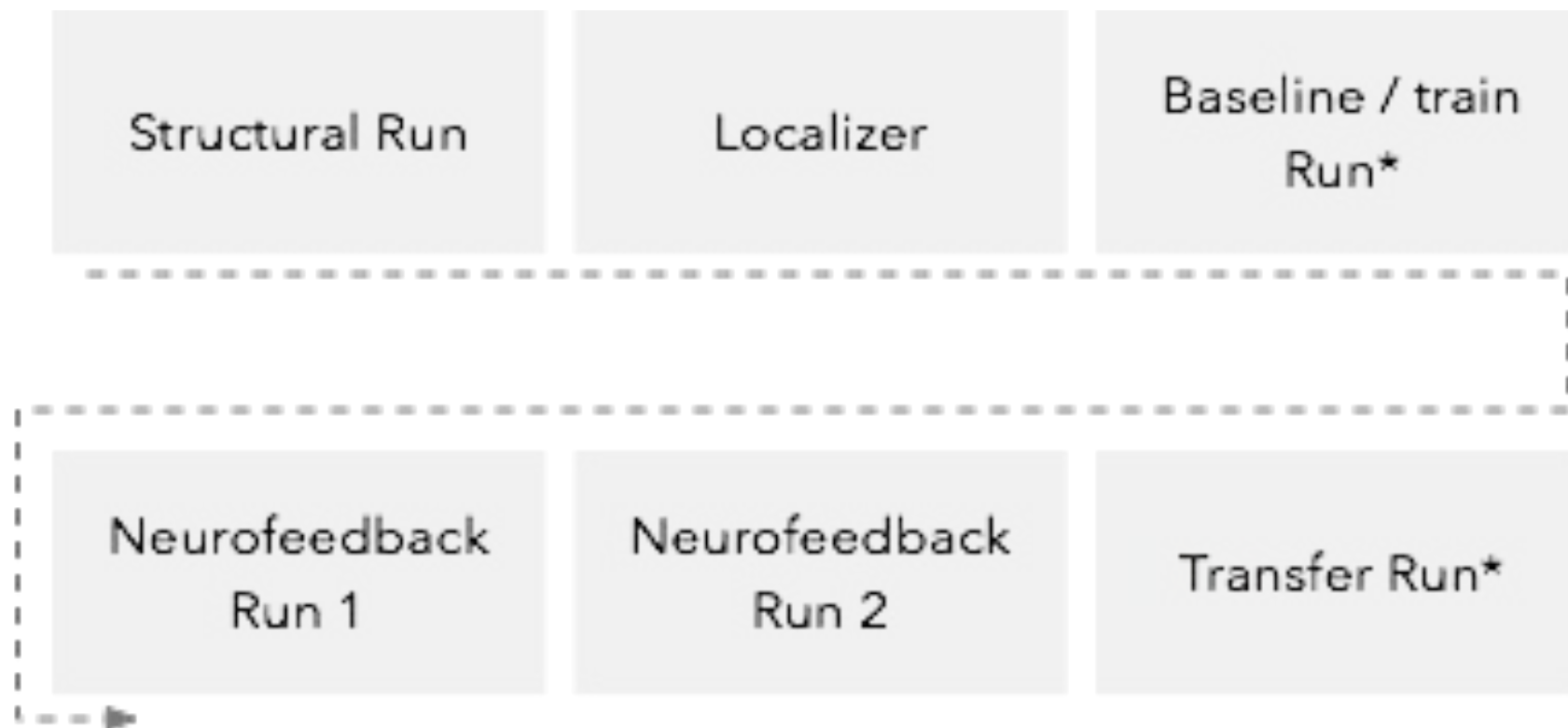


# NF-ASD A *neurofeedback* strategy for the improvement of facial expression recognition/perception in ASD

- *Identification, perception and mental imagery of facial expressions*
- Brain activity in areas related to social cognition and facial expression interpretation
- posterior portion of the superior temporal sulcus (pSTS)



# Task, clinical trial organisation and main objectives



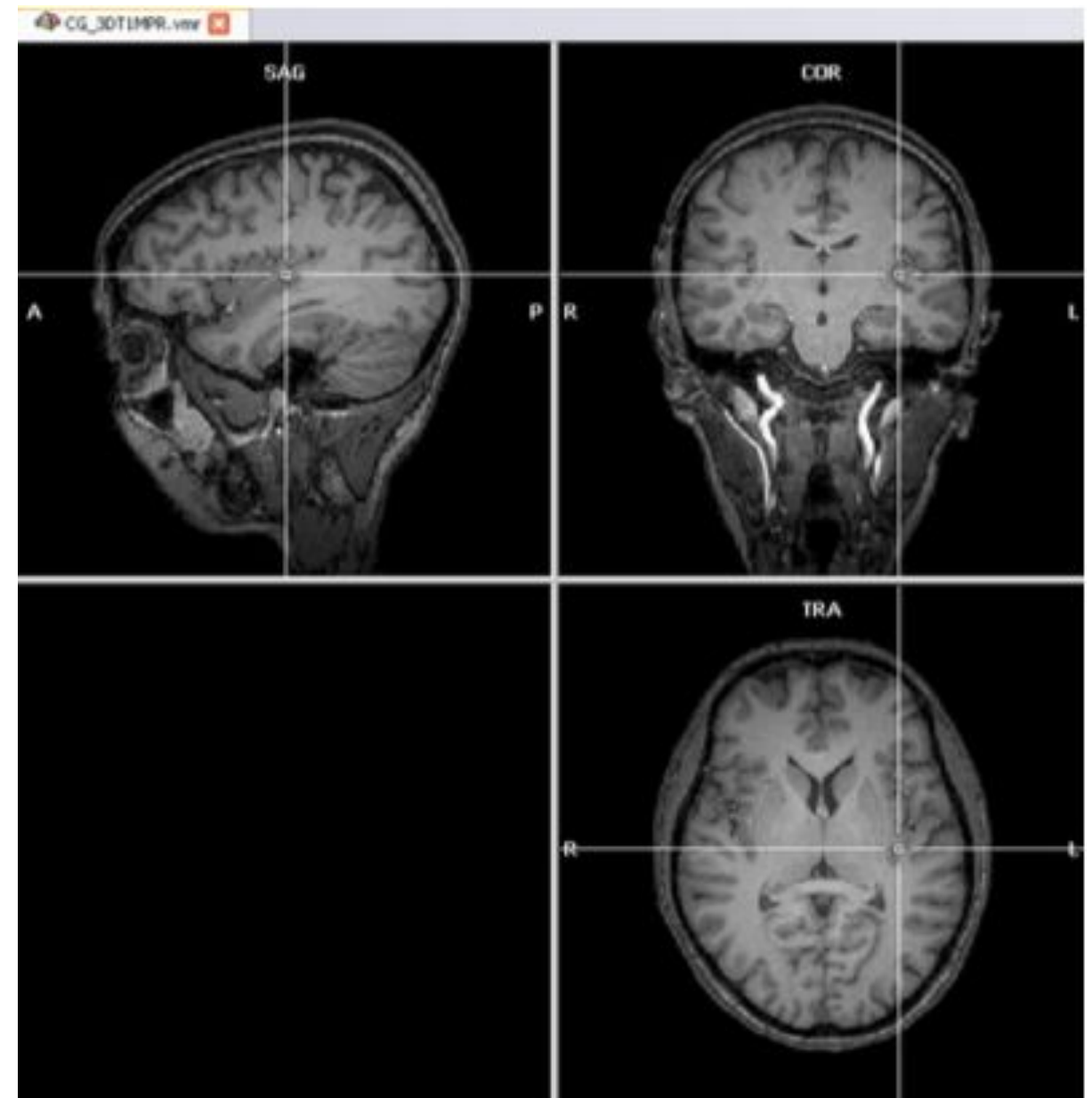
\* Without feedback

- Duration of the protocol is around 1 hour

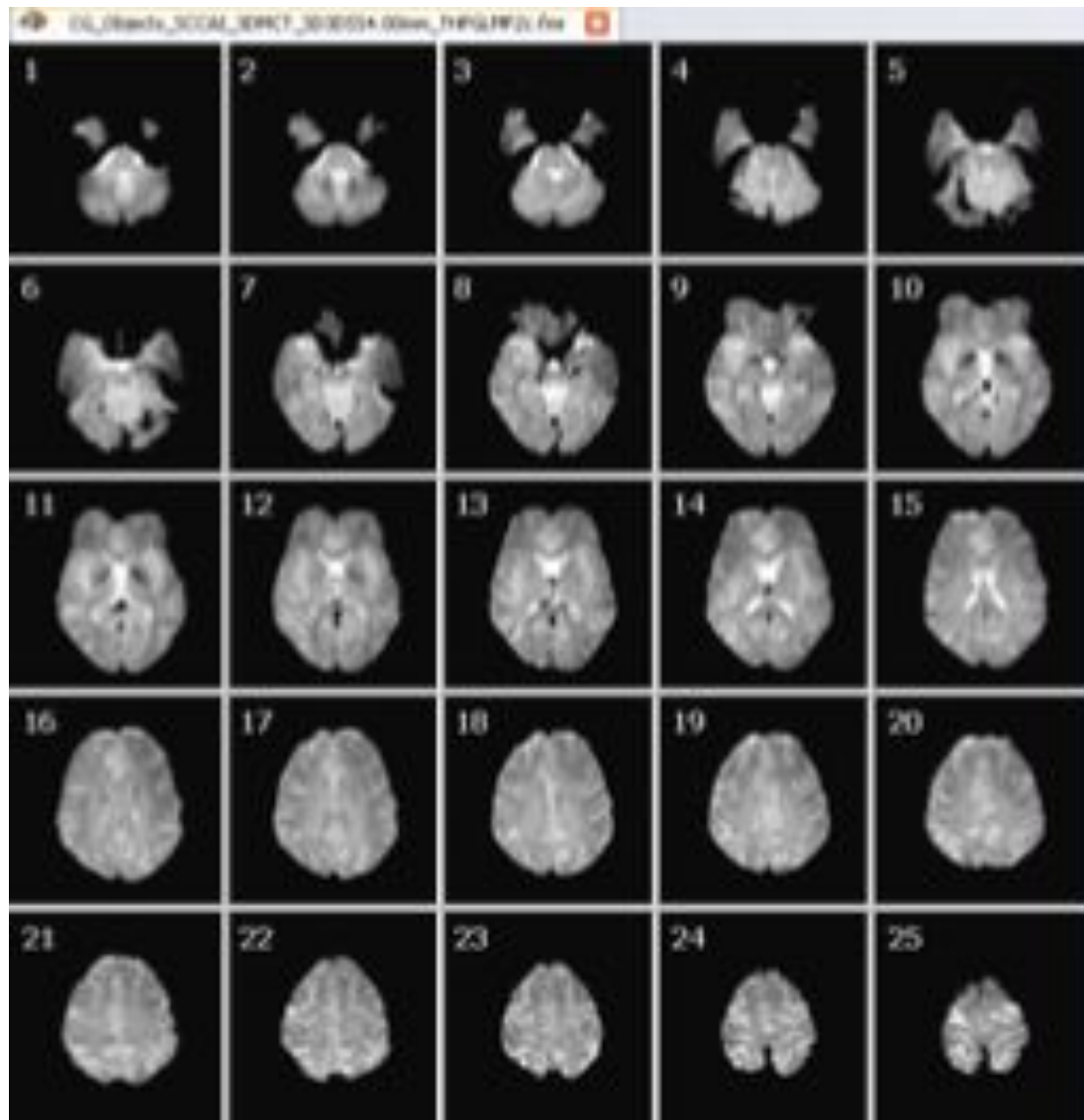


# Structural run

- *rapid acquisition gradient echo* (MPRAGE) sequence for co-registration of functional data
- 176 slices
- TE: 3.42 ms
- TR: 2530 ms
- voxel size  $1.0 \times 1.0 \times 1.0 \text{ mm}^3$
- 3 axes representation



# Functional runs



- Functional images of the localizer, neurofeedback and control runs
  - 33 slices,
  - in-plane resolution:  $4 \times 4 \text{ mm}^2$ ,
  - field of view (FOV):  $384 \times 384 \text{ mm}$ ,
  - slice thickness: 3 mm,
  - flip angle (FA):  $90^\circ$  covered occipital and posterior temporal lobe.
- Repetition time (TR) was 2000 ms (Echo Time (TE): 30 ms).

# Localizer run

MORPH NEUTRAL TO HAPPY  
AND BACK TO NEUTRAL  
2 seconds

x4



'HAPPY' Condition  
8 seconds

MORPH NEUTRAL TO SAD  
AND BACK TO NEUTRAL  
2 seconds

x4



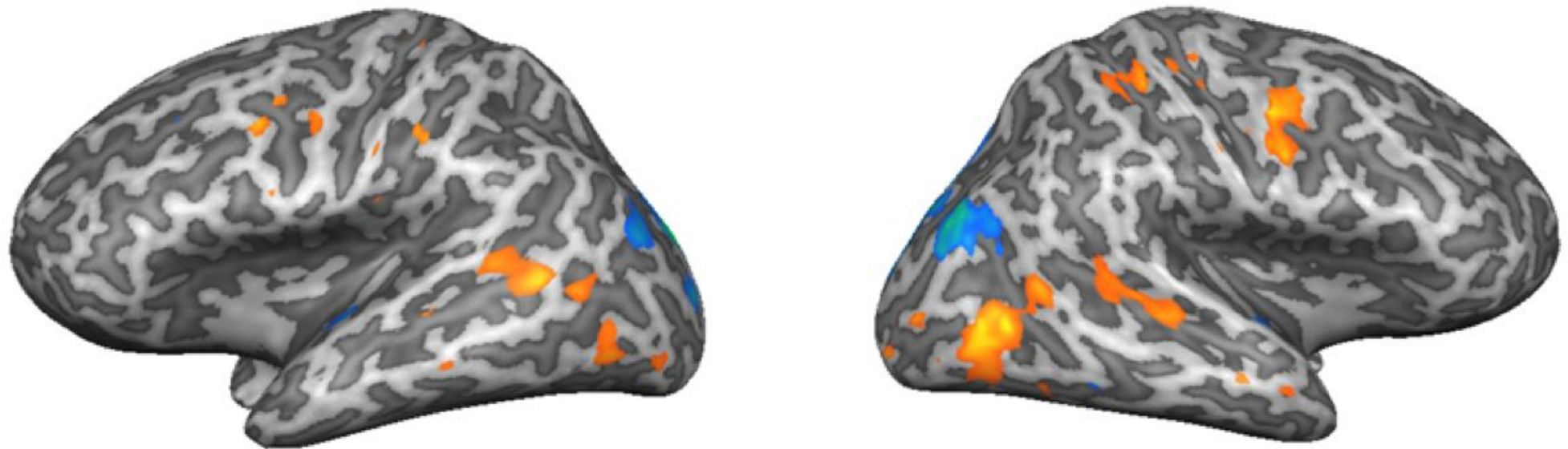
'SAD' Condition  
8 seconds

'RANDOM DOTS MOVEMENT', 'ALTERNATE', 'NEUTRAL'

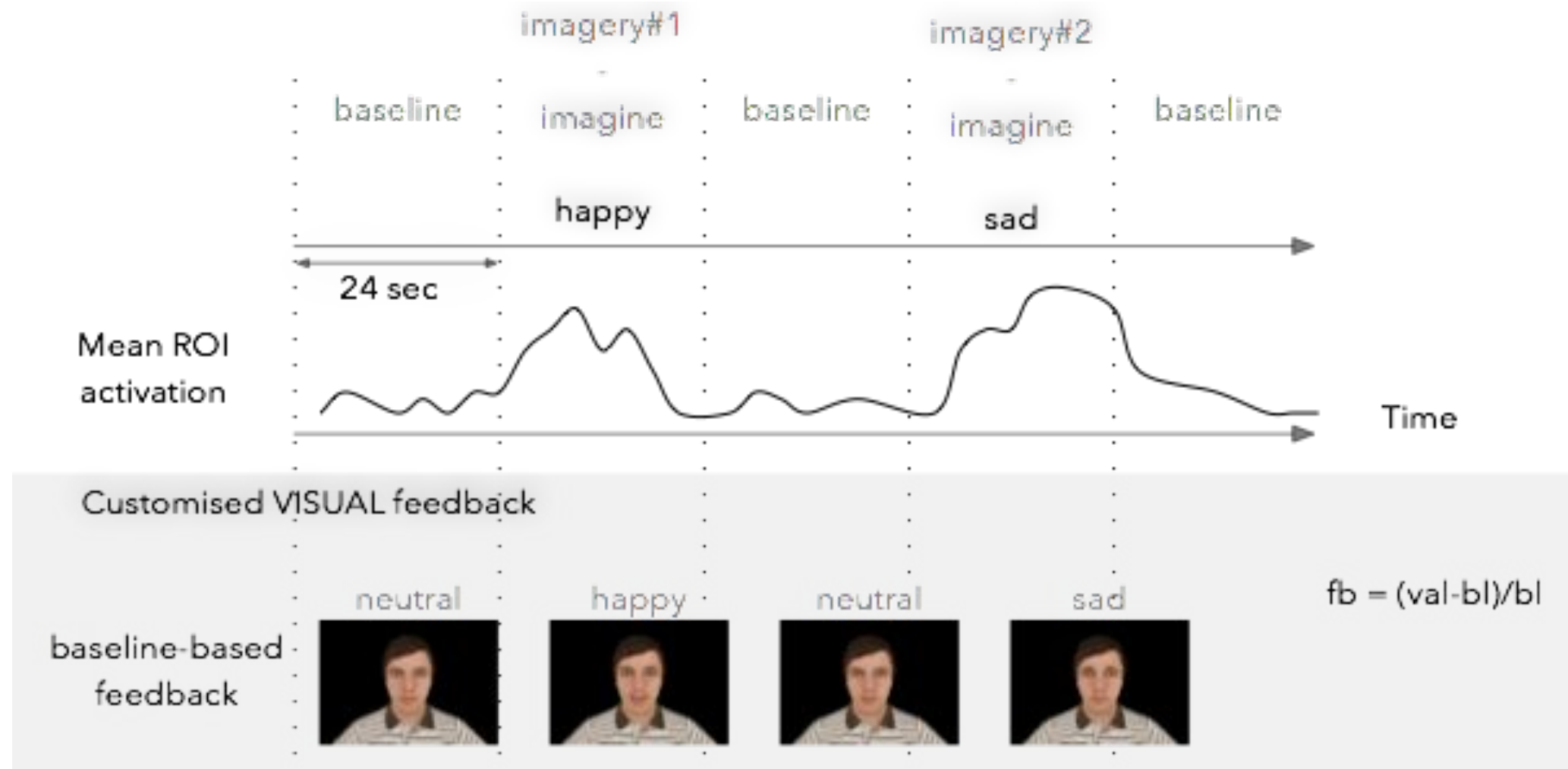


# Localizer run

- *Preliminary results*
  - *Ability to correctly identify the correct region of interest or neurofeedback target*

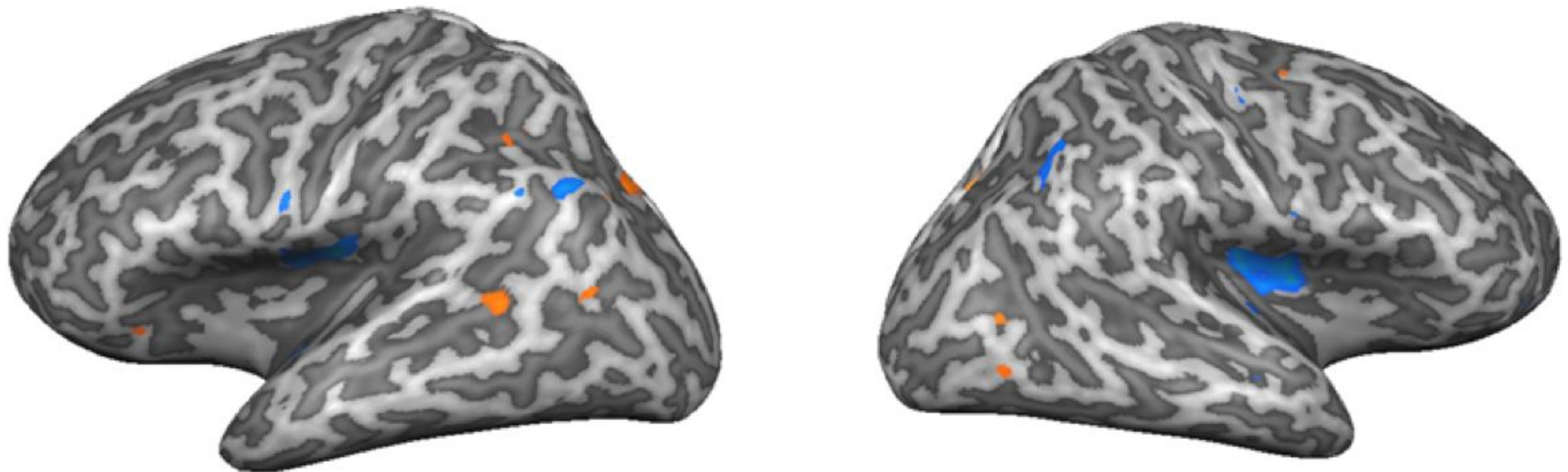


# Neurofeedback runs



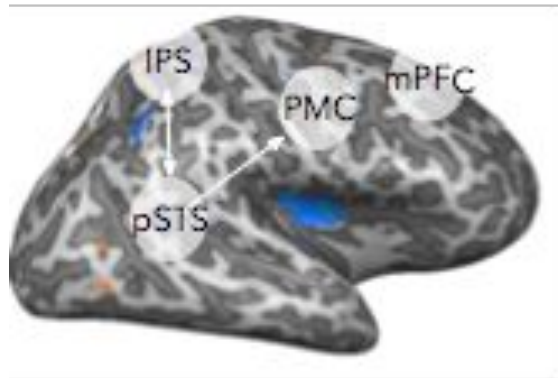
# Neurofeedback runs

- *Preliminary results*
  - *Ability to correctly identify the correct region of interest or neurofeedback target*

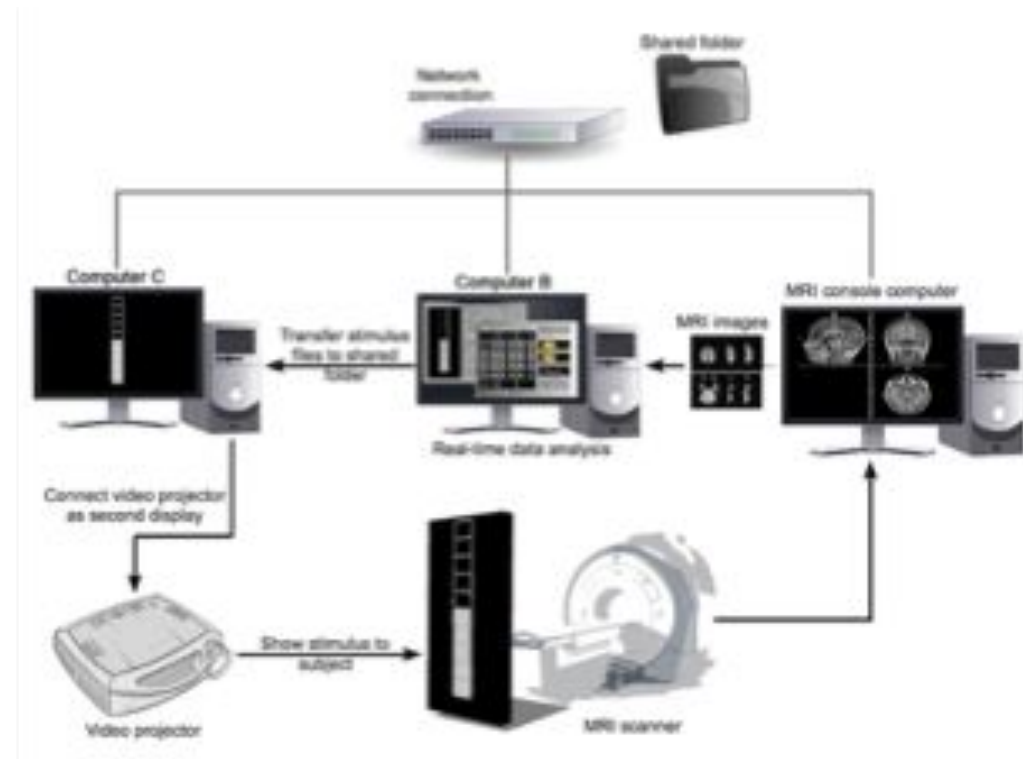


# Challenges

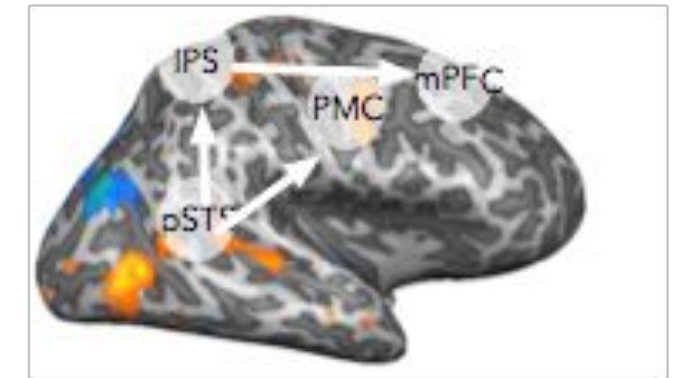
- Physiological
  - Hemodynamic delay (pseudo real-time)
  - Rest conditions
- Turbo BrainVoyager Software
  - Region of interest (ROI) selection and movement compensation
  - Real-time GLM performance
- Network communication
- Feedback calculation
  - Direct BOLD? BOLD Signal Variation? Based on what baseline values?
- Feedback presentation
  - Facial expressions realism



pre-intervention  
evaluation



neurofeedback intervention



post-intervention  
evaluation

The network and connectivity analysis  
work in progress.

# Effective connectivity as measured by Granger causality

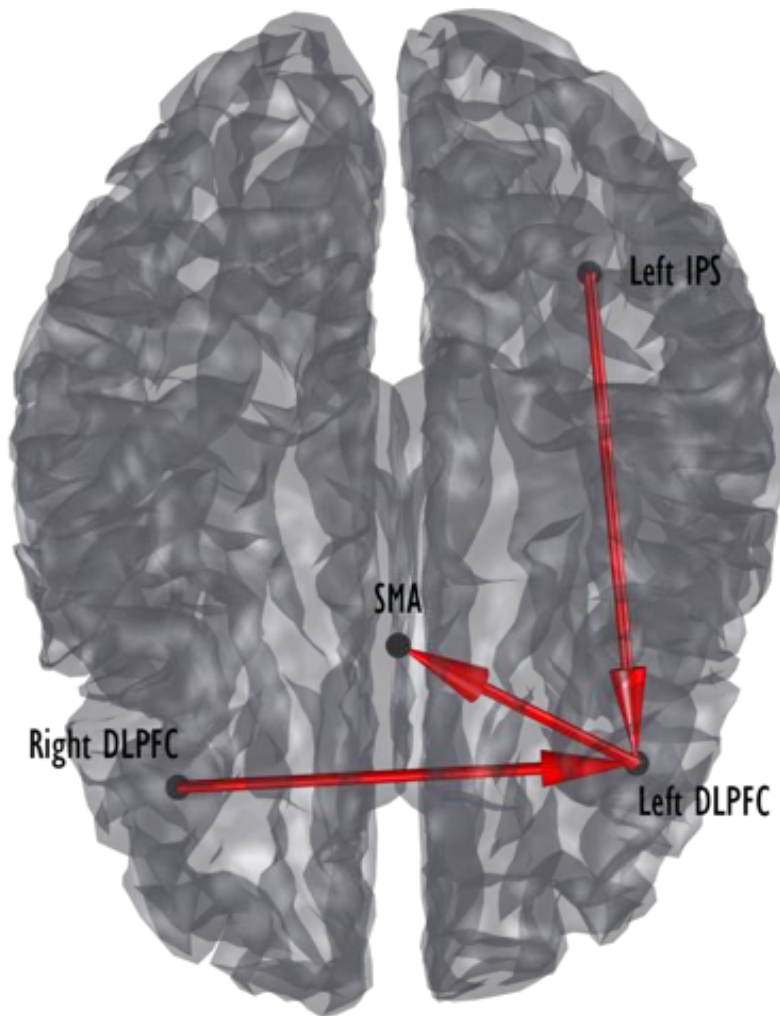
- Granger Causality (Granger, 1969)
- Vector Auto-regression model to calculate causality based on Time Series data
  - *BOLD activity derived from different ROIs*
  - $$X_1(t) = \sum_{i=1}^p A_{11i} X_1(t-i) + \sum_{j=1}^p A_{12j} X_2(t-j) + \epsilon_1(t)$$
  - $$X_2(t) = \sum_{j=1}^p A_{21j} X_1(t-j) + \sum_{i=1}^p A_{22i} X_2(t-i) + \epsilon_2(t)$$
  - “If past values of X1 and X2 can predict future value of X2 better than past values of X2 alone, then X1 granger cause X2”



# Effective connectivity - as measured by MVGC

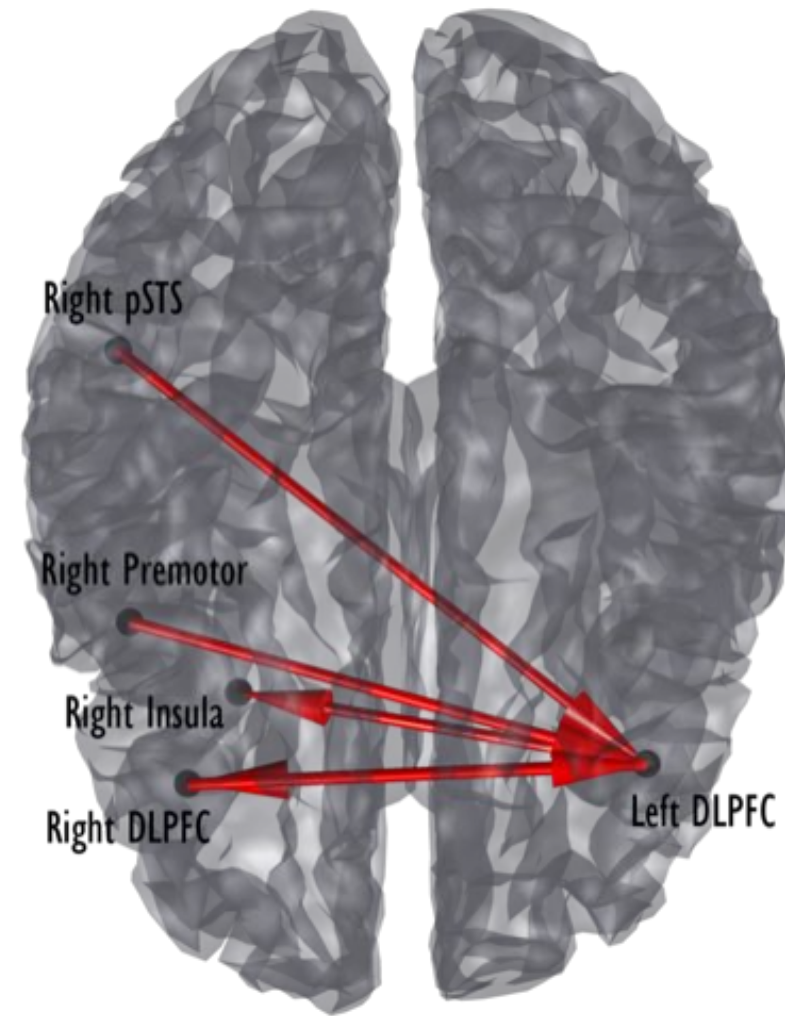
## Localizer

1-back + 2.back > basel.



## NF runs

imagination > basel.



# New approaches to rt—fMRI connectivity feedback

MSc student João Pereira



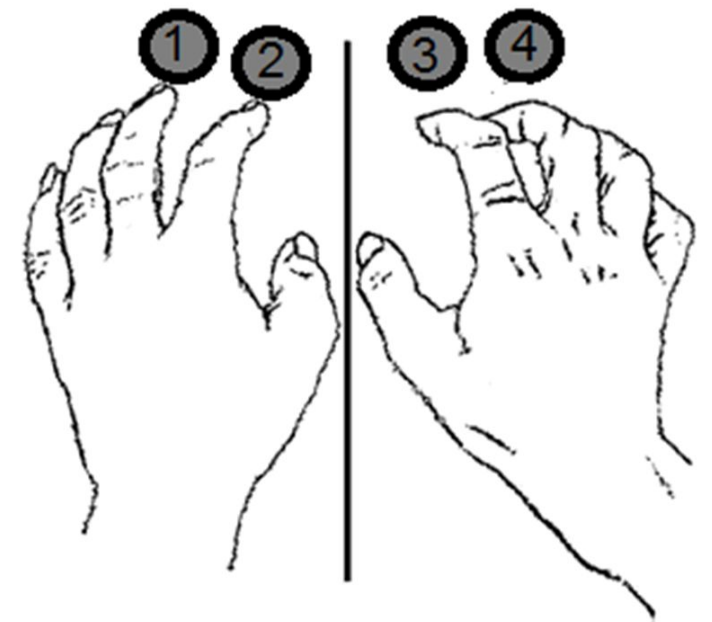
*“Real-time fMRI neurofeedback based  
on Interhemispheric functional  
connectivity:  
a motor imagery paradigm”*

Aula IIM, 16 de Dezembro

# Motor imagery

*“Dynamic state in which the subject simulates a particular action in a mental way so that he can feel himself performing the action for him imagined” (Decety, 1996)*

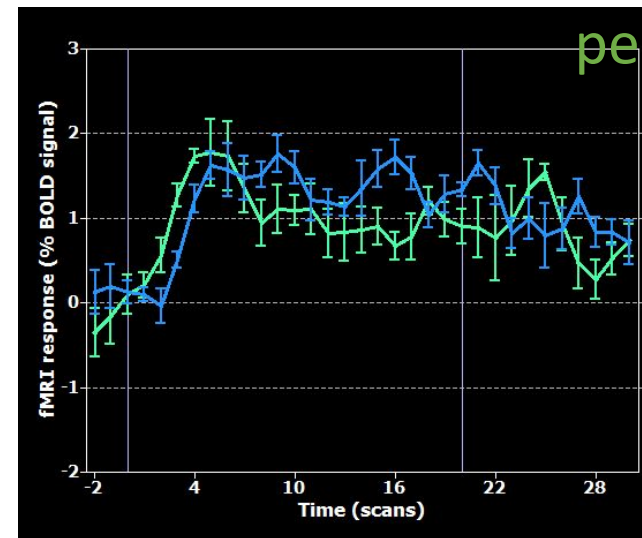
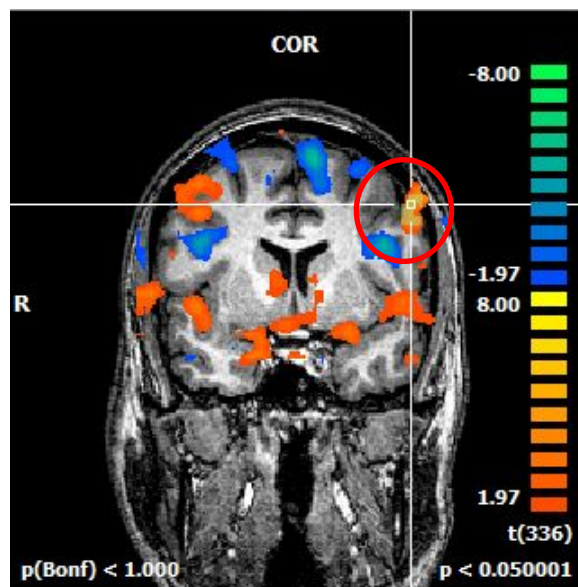
Sequence : 4-1-2-1-3-4-3



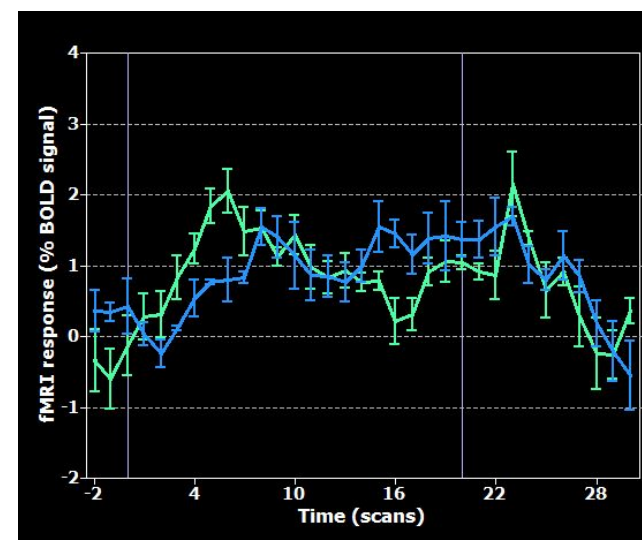
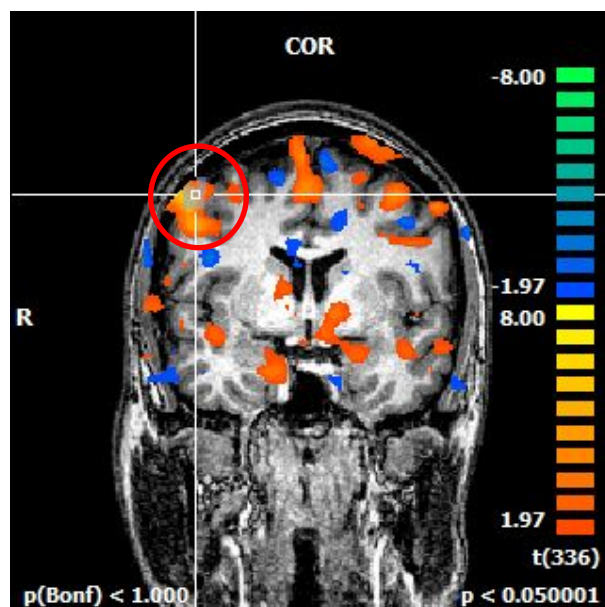
# ROI Selection : Localizer

Motor imagery

Motor  
performance



.lpmc



.rpmc

# Neurofeedback calculation

$$\rho = \frac{\sum_{i=1}^n (xi - \bar{x})(yi - \bar{y})}{\sqrt{\sum_{i=1}^n (xi - \bar{x})^2} \cdot \sqrt{\sum_{i=1}^n (yi - \bar{y})^2}}$$
$$= \frac{cov(X, Y)}{\sqrt{var(X) \cdot var(Y)}}$$

The feedback value ranges in values from -1 to 1 and it is transformed and presented to the subject in the form of a thermometer that is divided in 20 levels (+10 to -10)

# Training, NF and Transfer Runs

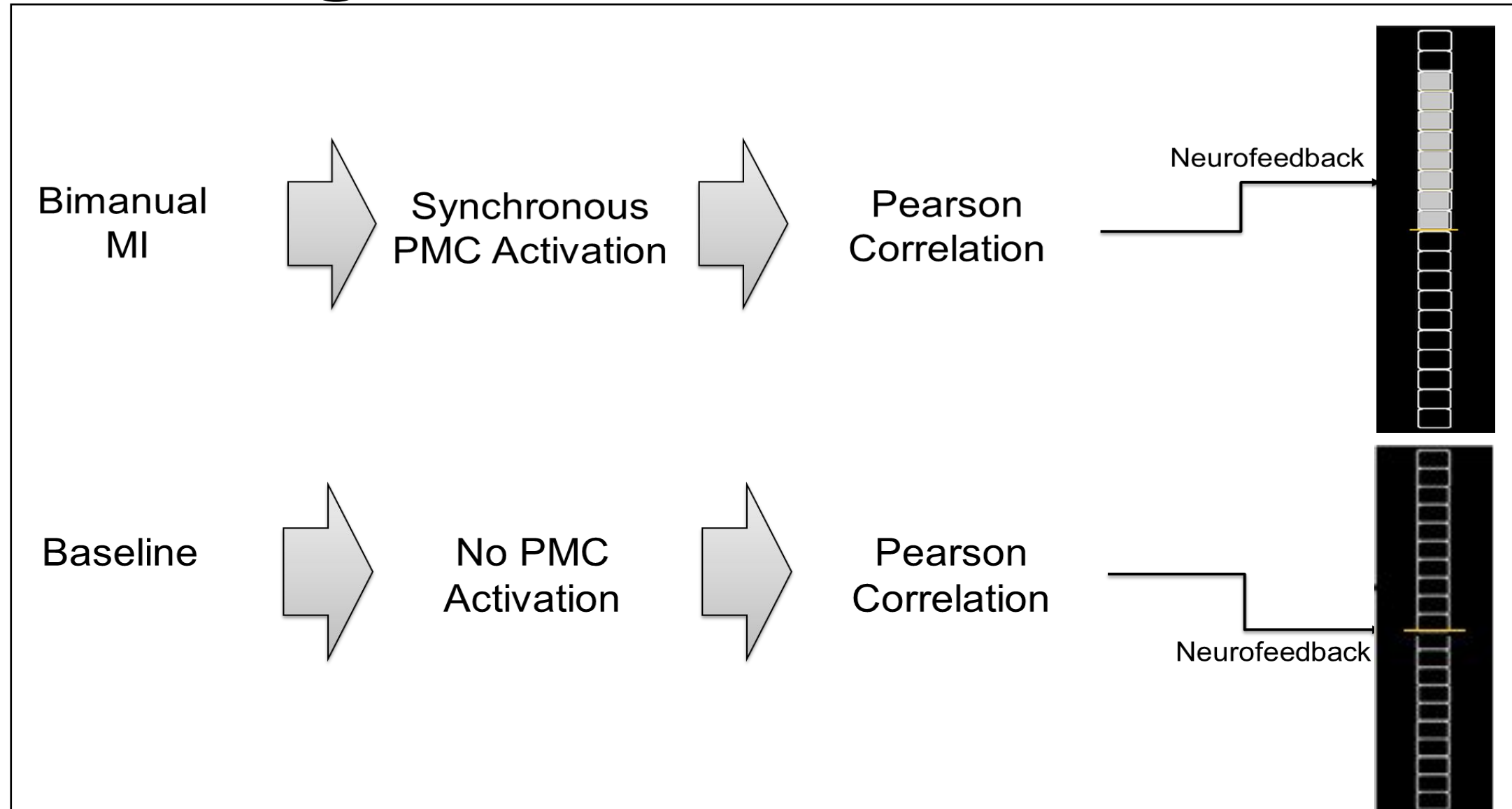
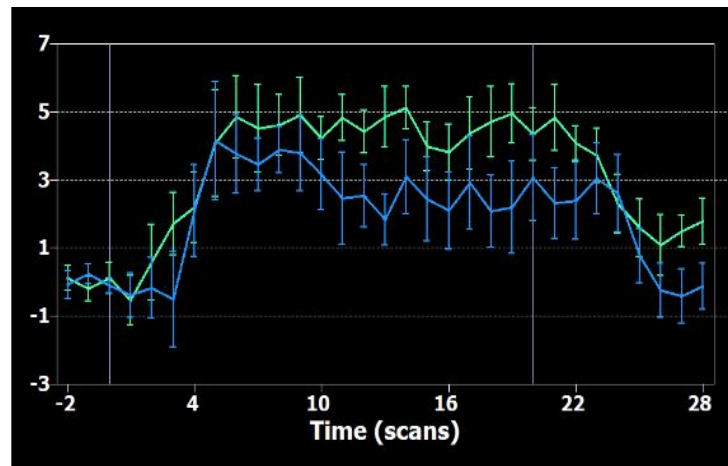
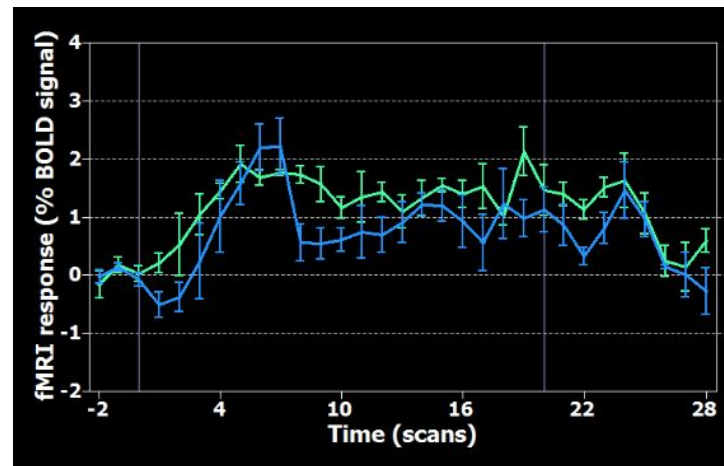


Fig. Motor Imagery (MI) tasks proposed for the training, neurofeedback and transfer runs

# NeuroFeedback Runs : Then and Now



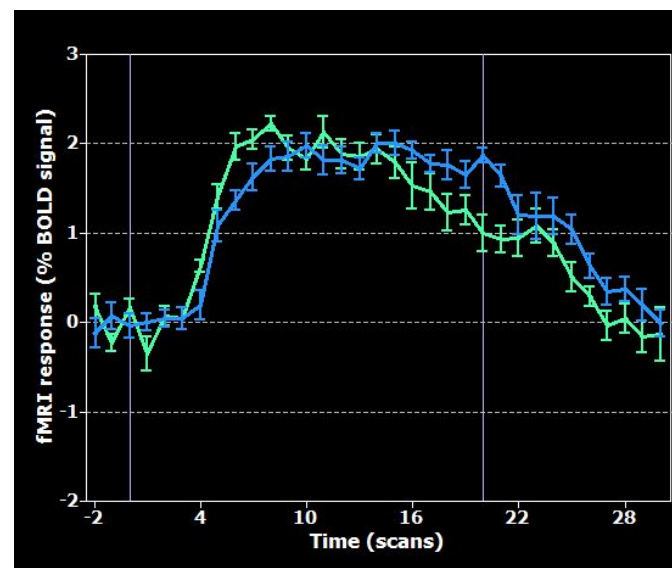
.lpmc



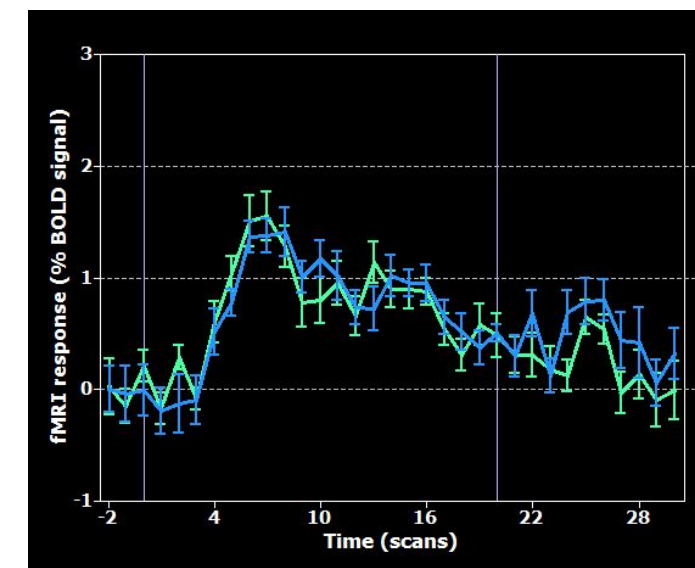
.rpmc

Unimanual imagined  
movements

Bimanual imagined  
movements

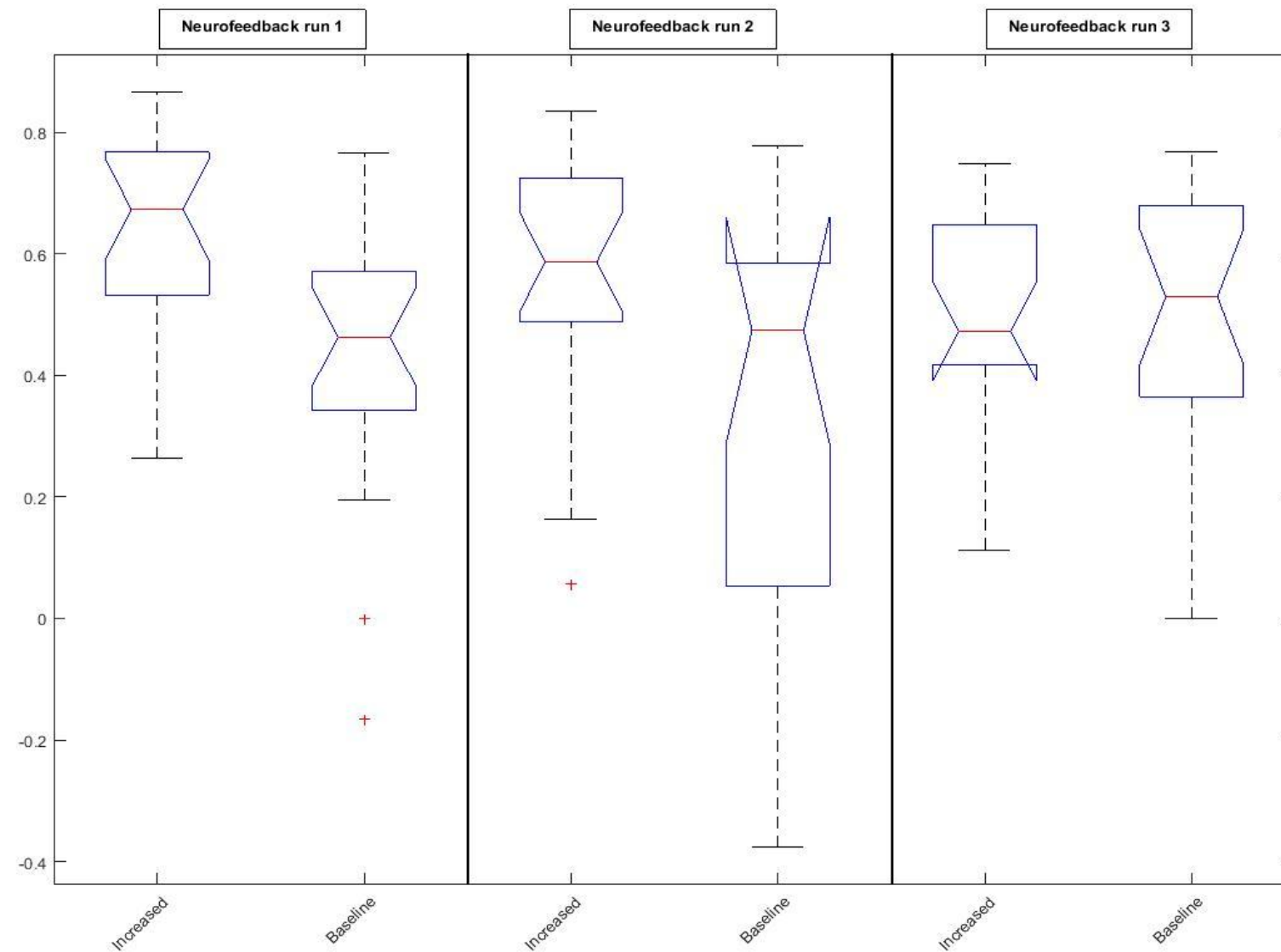


.lpmc



.rpmc

# NeuroFeedback Runs



Correlation distributions were statistically different in two neurofeedback runs.

# Expectations

- Assess PMC as a suitable neurofeedback target for MI rt-fMRI-NF.
- Study real time Pearson Correlation between two regions as a neurofeedback approach.
- Study interhemispheric PMC effective connectivity offline using Granger Causality in order to evaluate networks involved and how NF could affect them.
- Relevance of the project: possible usage of these strategies in diseases that are related with interhemispheric connectivity impairment (Alzheimer's, Parkinson, ALS and in particular in stroke patients).