Experimental designs for functional neuroimaging

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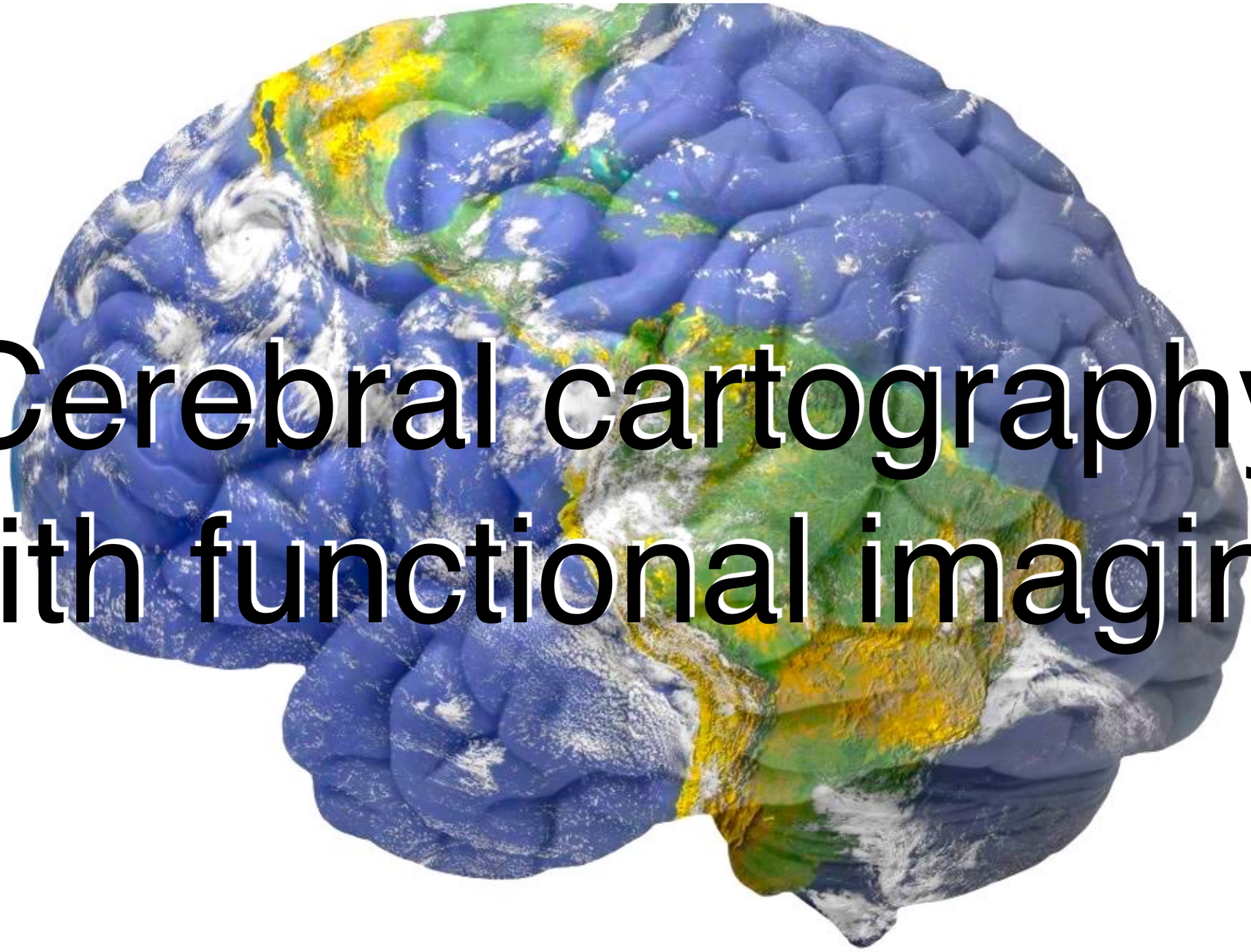
Lecture contents

- Basic problems in experimental design and model fitting
- Basic experimental designs
  - Boxcar design
  - Event-related design
  - Parametric designs
  - Analysing unconstrained conditions



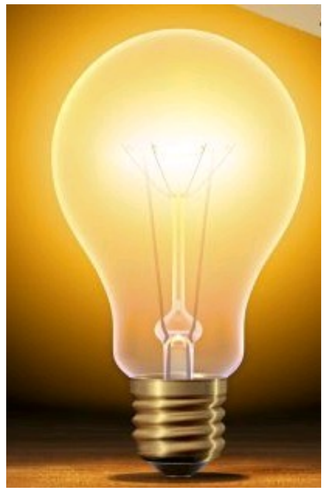
Cerebral cartography with functional imaging

Magnetic resonance imaging (MRI)

- Based on the magnetic resonance of the hydrogen nuclei
- Measuring the behaviour of hydrogen nuclei in the strong magnetic field of the MRI device allows studying different tissues in vivo
- Adjusting imaging sequence allows highlighting different tissues or their different characteristics

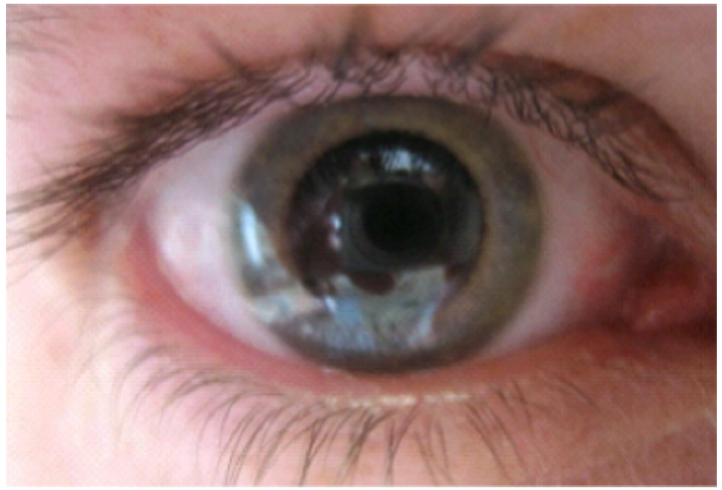
Experiment: Linking stimulation model with measurements

BACKGROUND LUMINOSITY



Independent variable
Controlled by experimenter

PUPIL DIAMETER



Dependent variable
Researcher measures if changes in the independent variable cause changes in the dependent variable

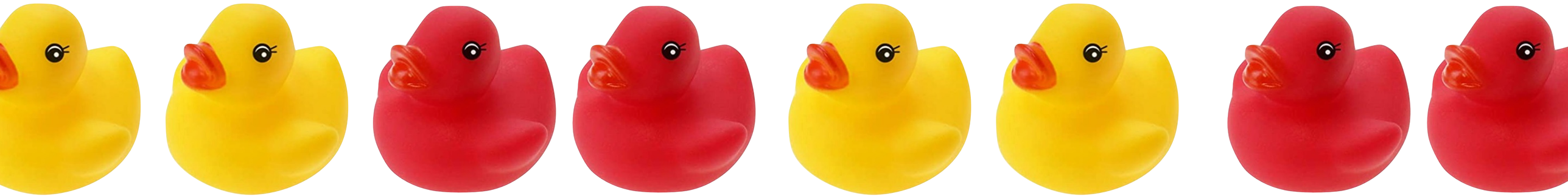
SIGNAL
Experiment-induced variations in pupil size

+

NOISE
Errors in measurement, individual differeneces

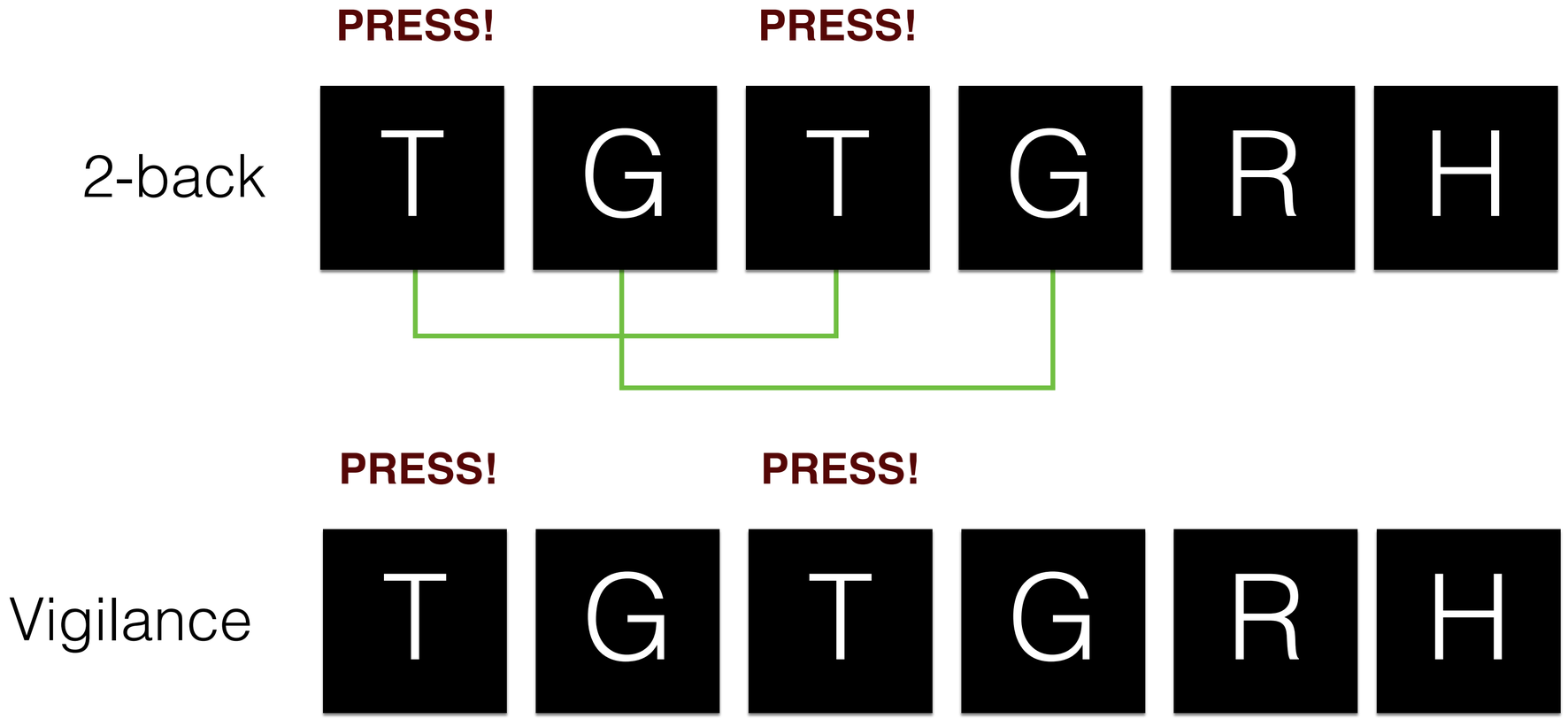
STATISTICS = SEPARATING NOISE FROM SIGNAL IN A PROBABILISTIC FASHION

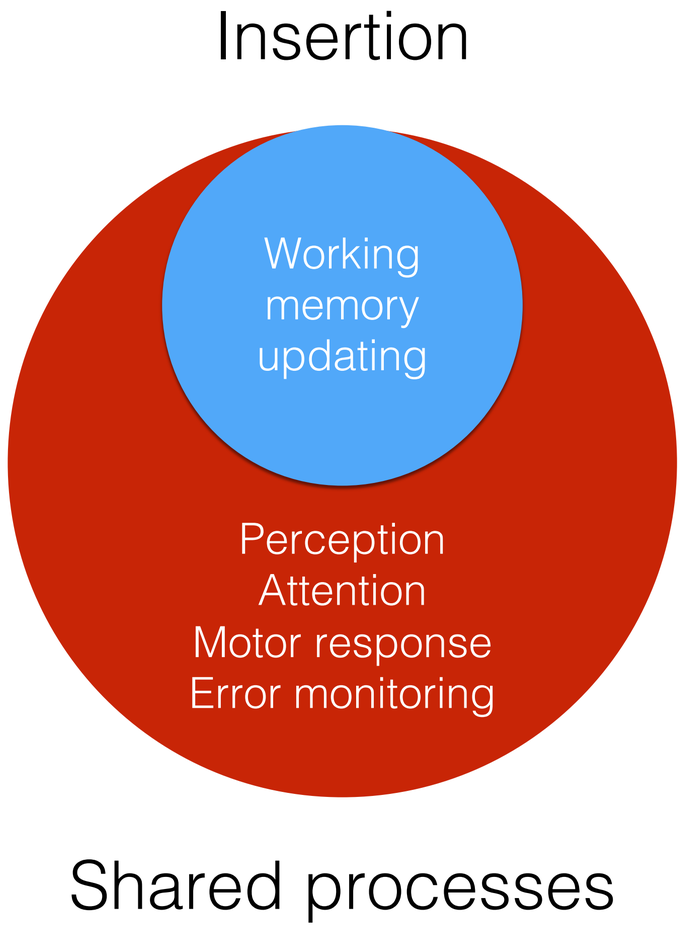
Cognitive subtraction



Induce brain in states **A** and **B** and calculate the differential activation

Problem: assumption of pure insertion

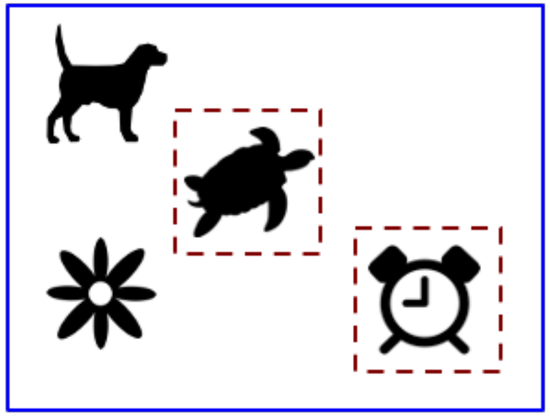




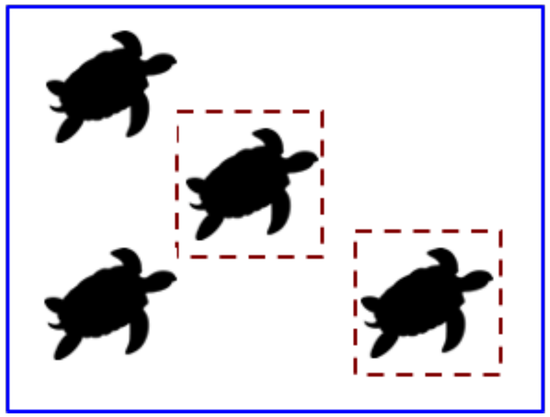
Pure insertion: assumption that inserting another component to the task does not affect the remaining process

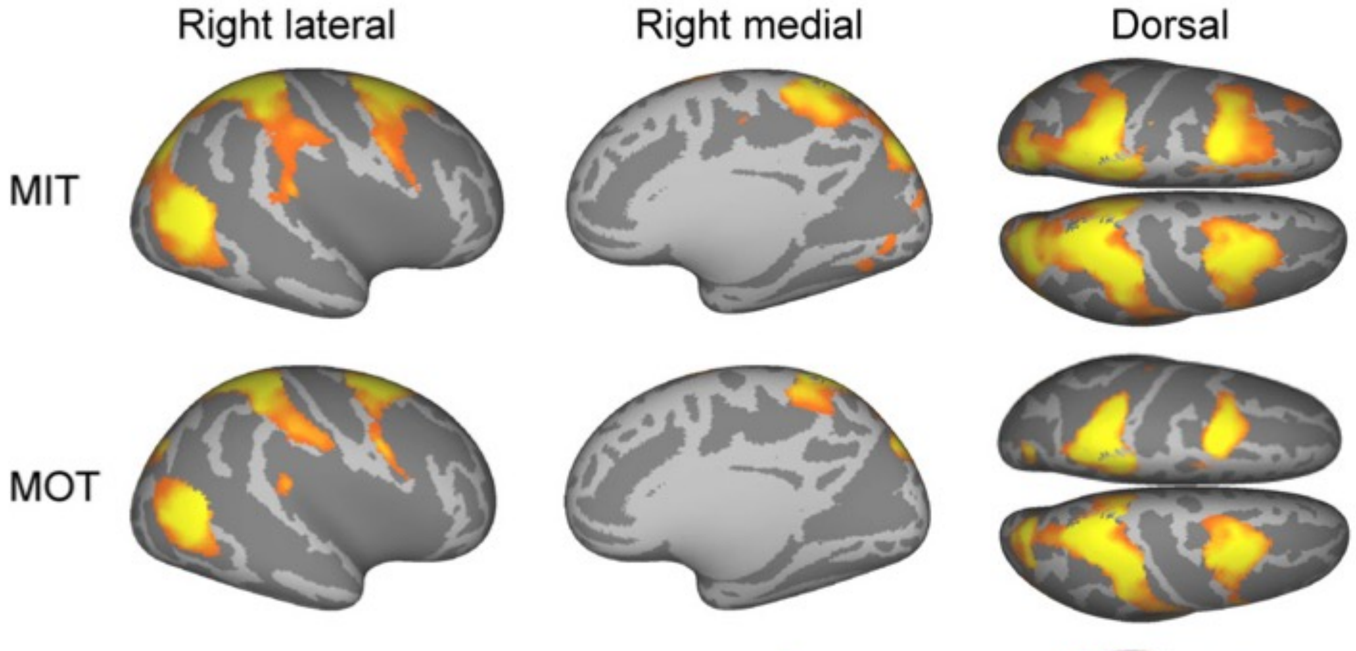
A) Multiple Identity Tracking (MIT)

4 s



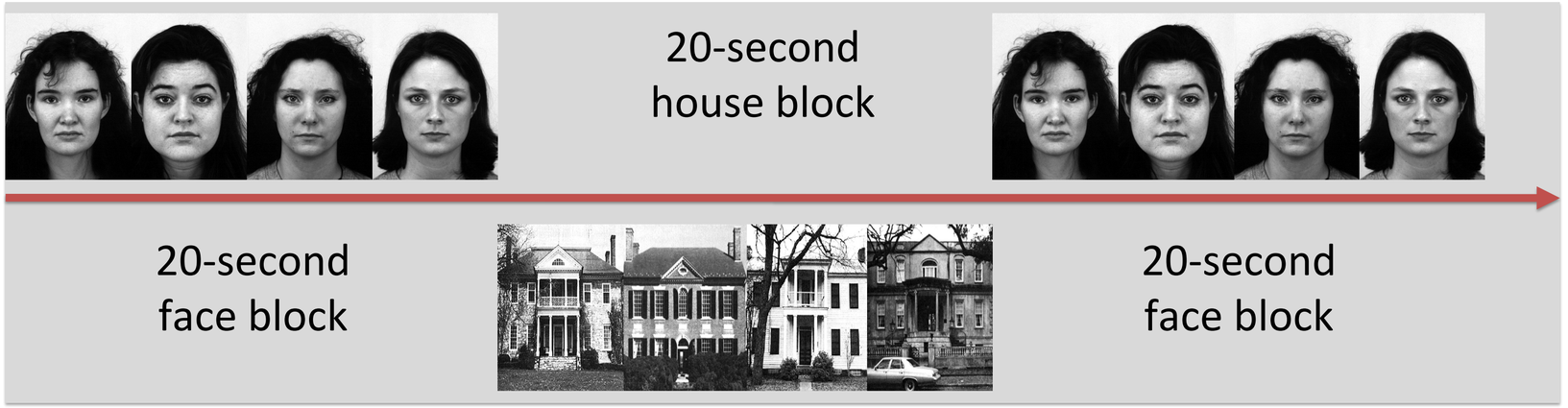
B) Multiple Object Tracking (MOT)

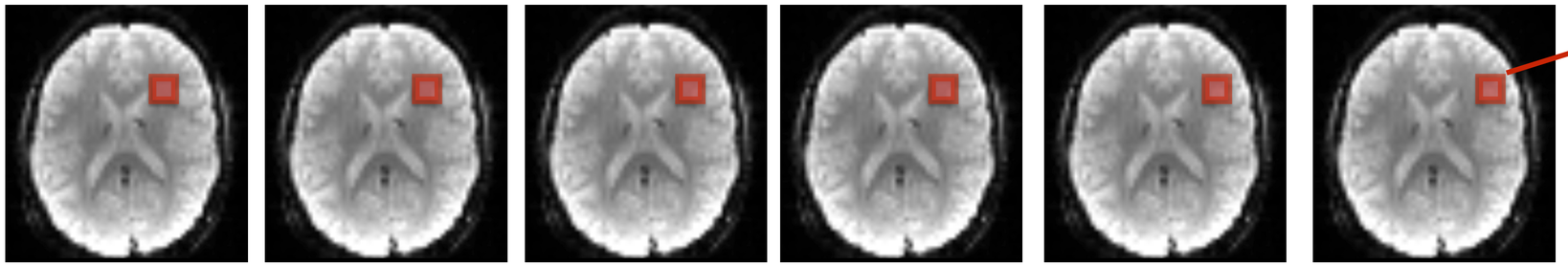


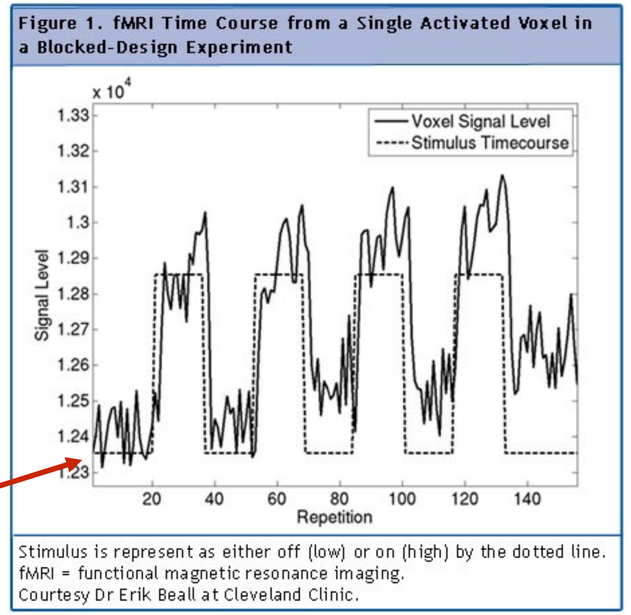


Nummenmaa et al (2018 Cereb Cortex)

Typical fMRI experiment



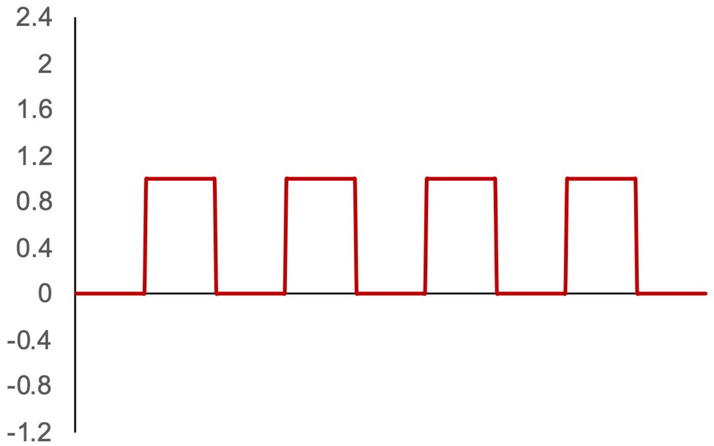




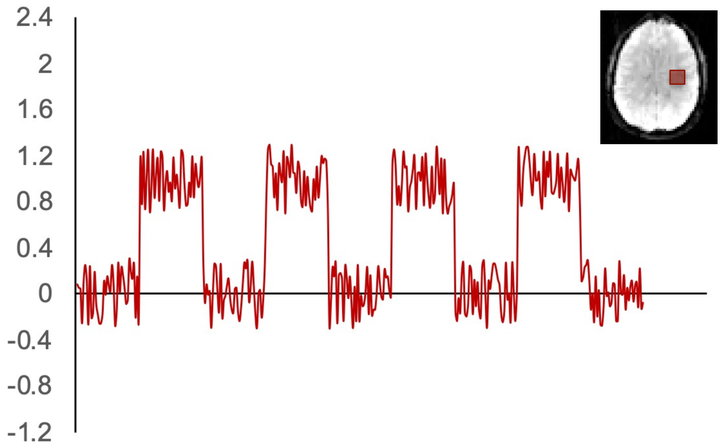
Acquiring one 3D functional volume takes about 1.5 seconds
We can distinguish events ~100ms apart, yet their actual timing can be resolved with about 2-s accuracy

Fitting the model to the data

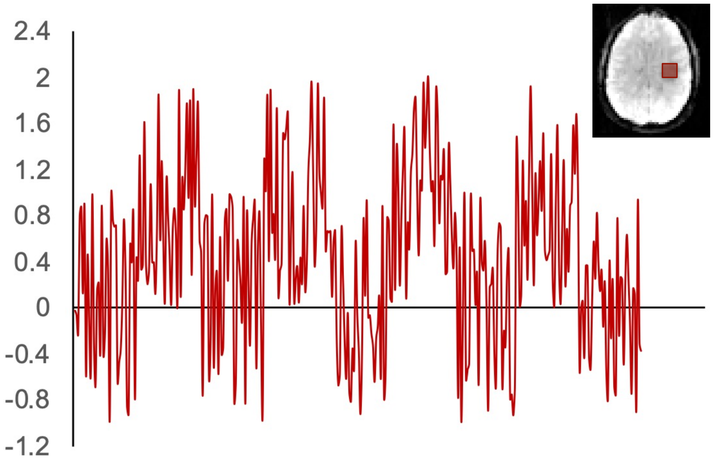
Stimulation model (boxcar)



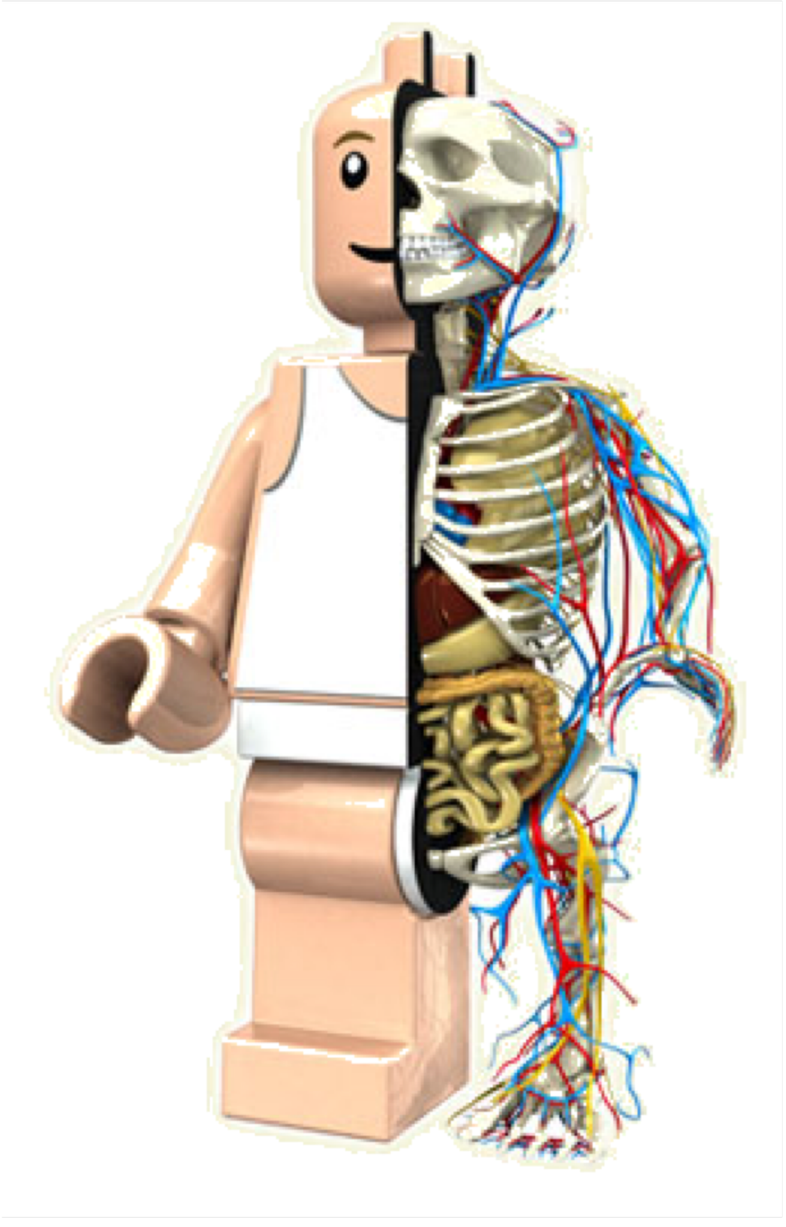
Clean (unrealistic) data

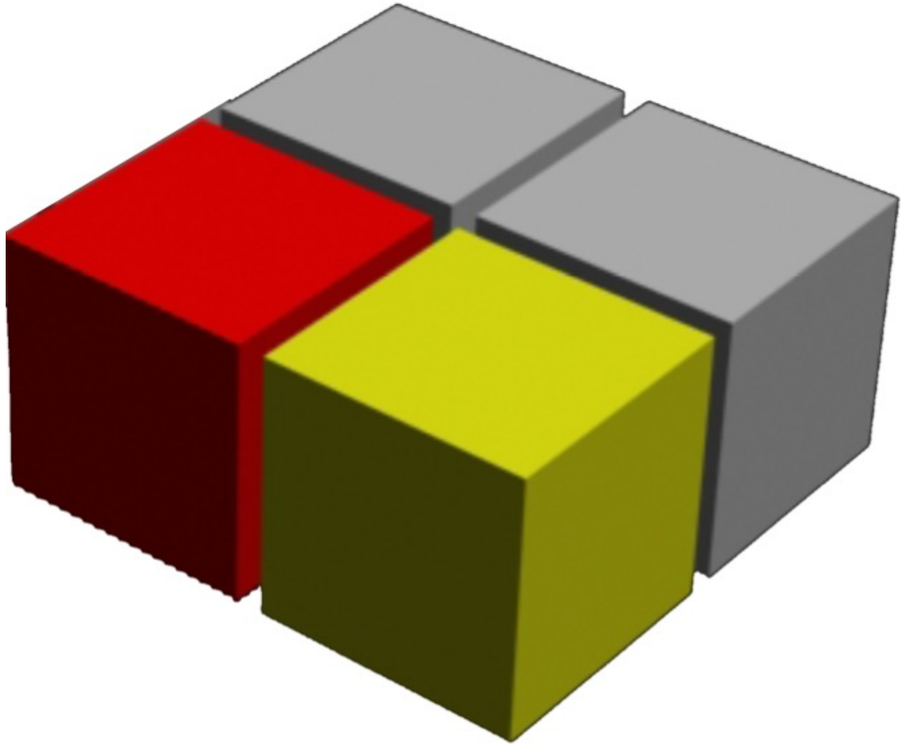


Noisy (realistic) data



Basic idea: model how well the stimulation model predicts BOLD time course at tech voxel

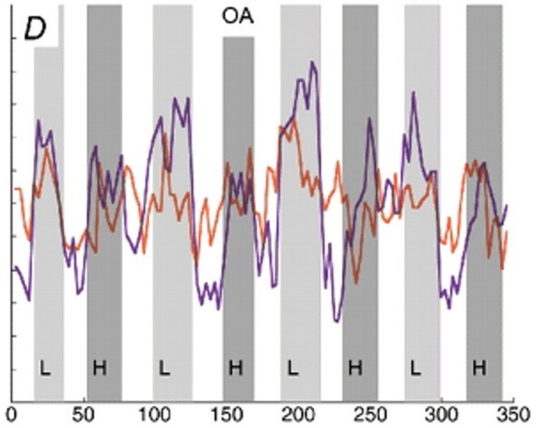


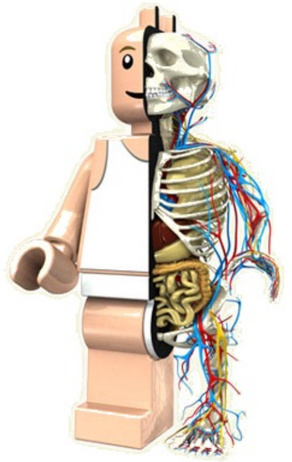


First level model with LEGO brains

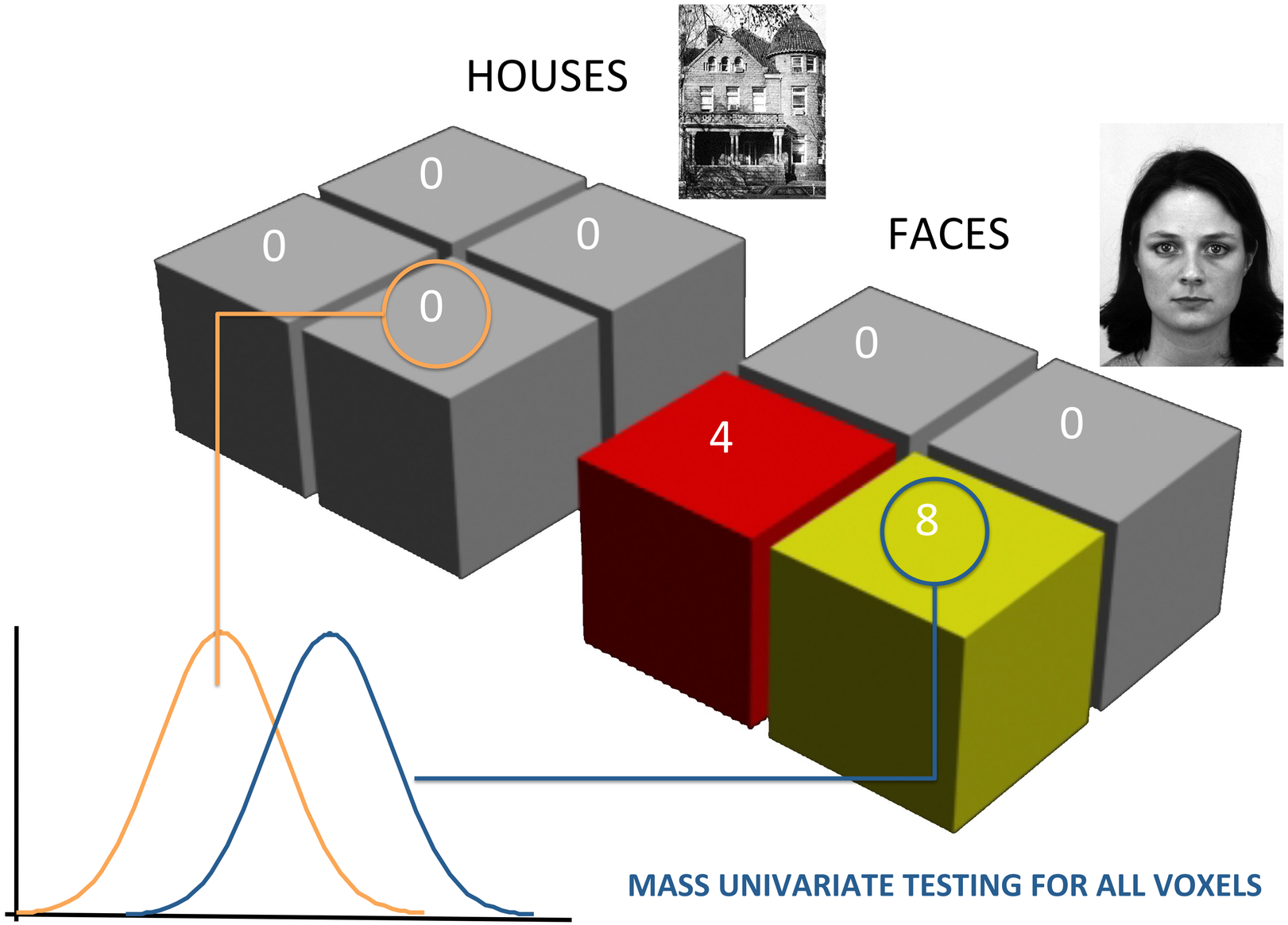
HOUSES

FACES





First level model with LEGO brains



MASS UNIVARIATE TESTING FOR ALL VOXELS

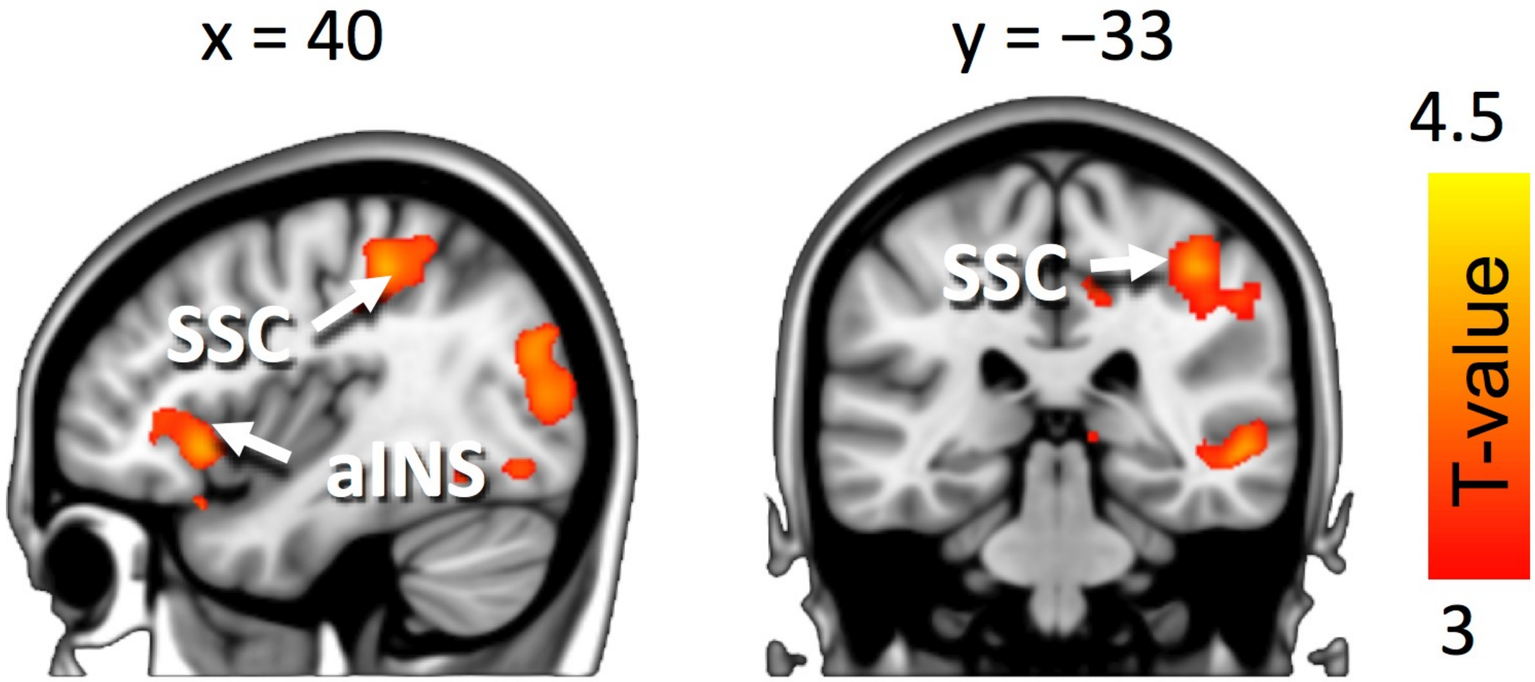
Basic tool 1: Boxcar design

AIM: Localize brain regions that are more involved in process 1 vs. process 2
DESIGN: Blocked experiment using cognitive subtraction assuming pure insertion
ADVANTAGES: Simple, powerful, often short experiments

Networks for vicarious pain perception

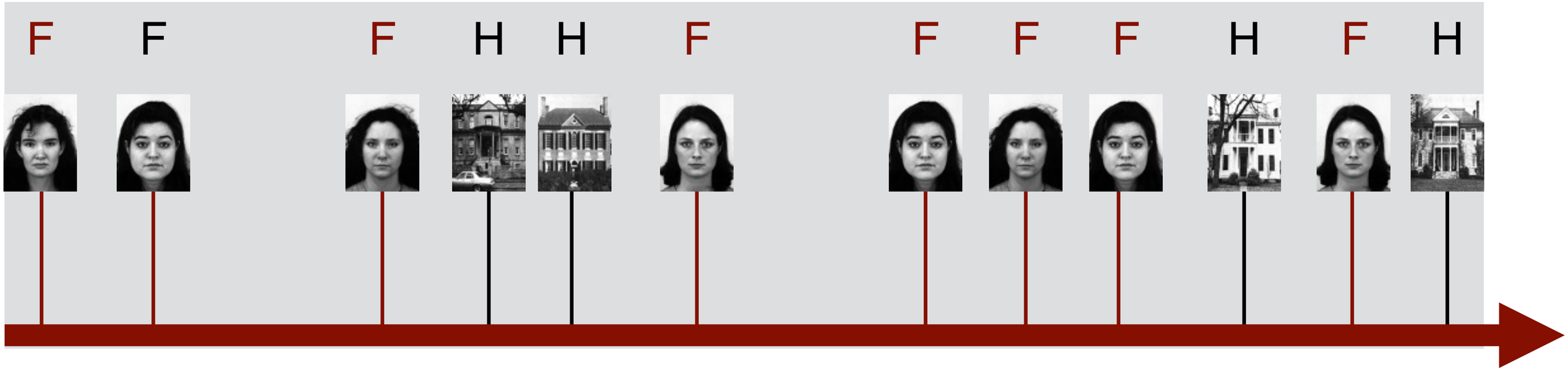
Feel pain trial

Cause pain trial



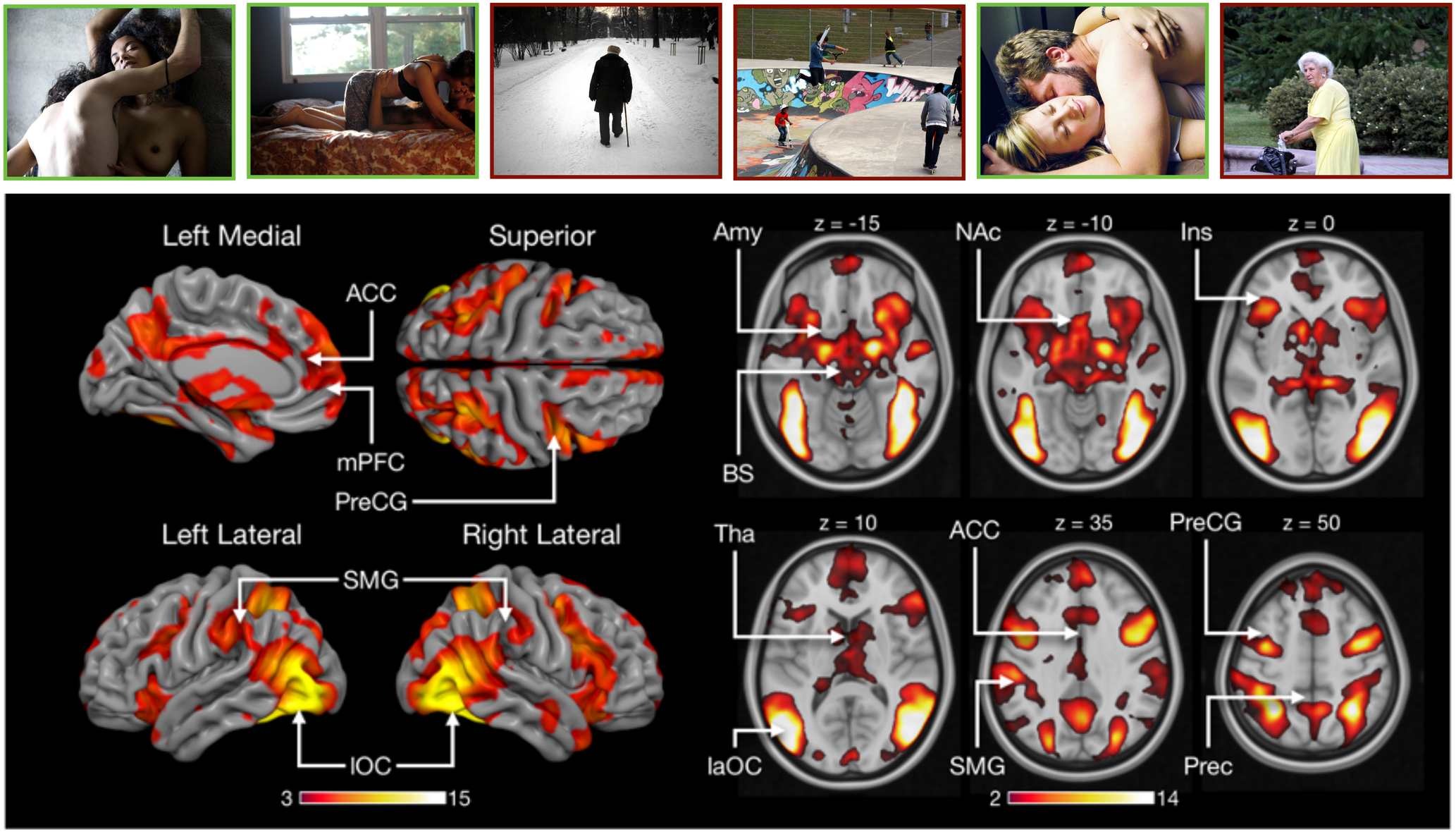
Nummenmaa et al (2014 J Neurosci)

Basic tool 2: Event-related design



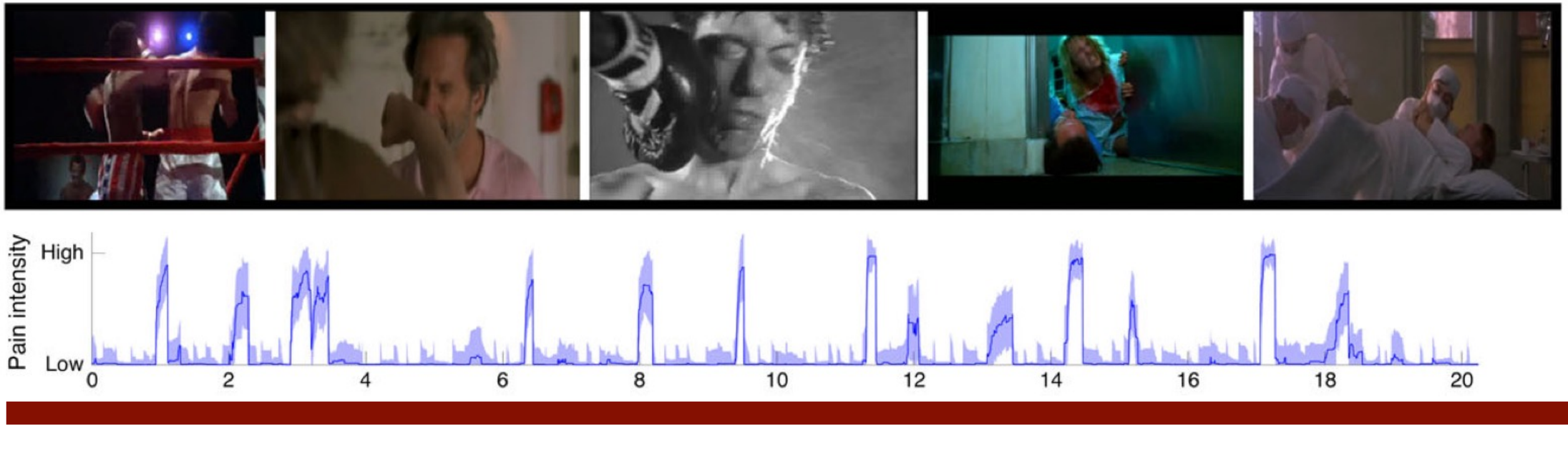
AIM: Localize brain regions that are more sensitive to process 1 vs. process 2
DESIGN: Event-related design with cognitive subtraction assuming pure insertion
ADVANTAGES: More accurate model, trialwise analysis, randomisation
DISADVANTAGES: longer experiments, less power, not suitable for all stimuli

1s 1s 1s 1s 1s 1s

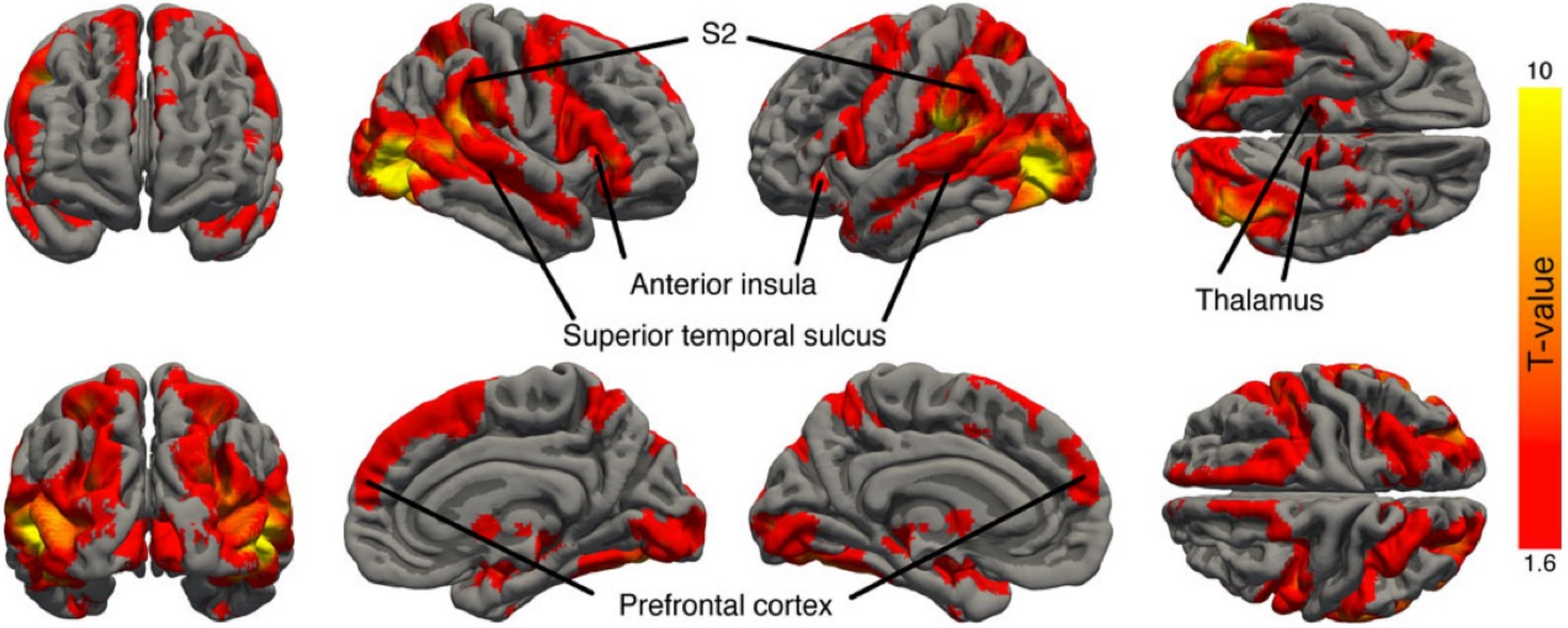


Putkinen et al (in preparation)

Basic tool 3: Parametric design

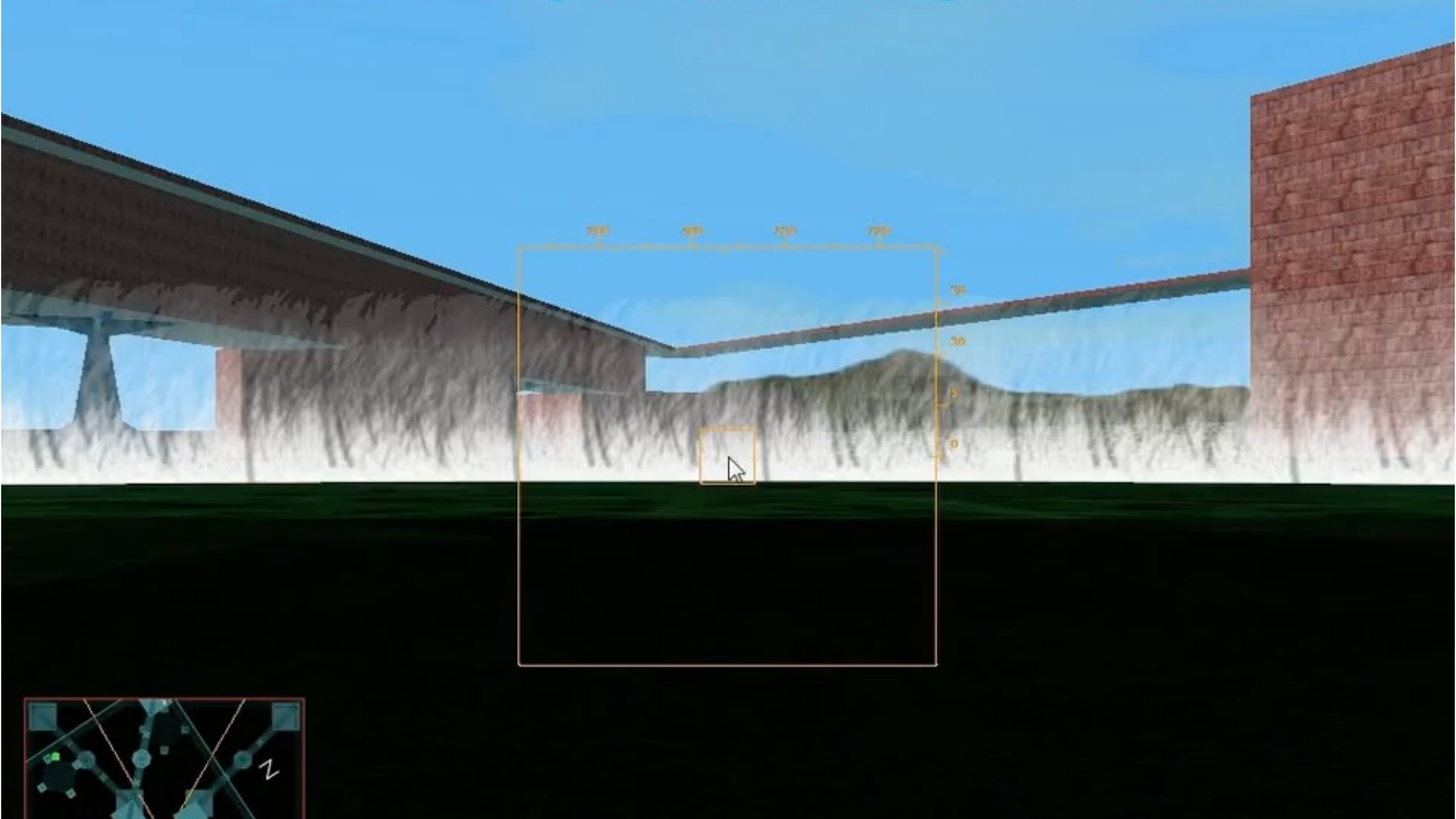


AIM: Localize brain regions that respond to vicarious pain
DESIGN: Parametric design with continuous stimulation model
ADVANTAGES: Quantitative stimulation model, high statistical power

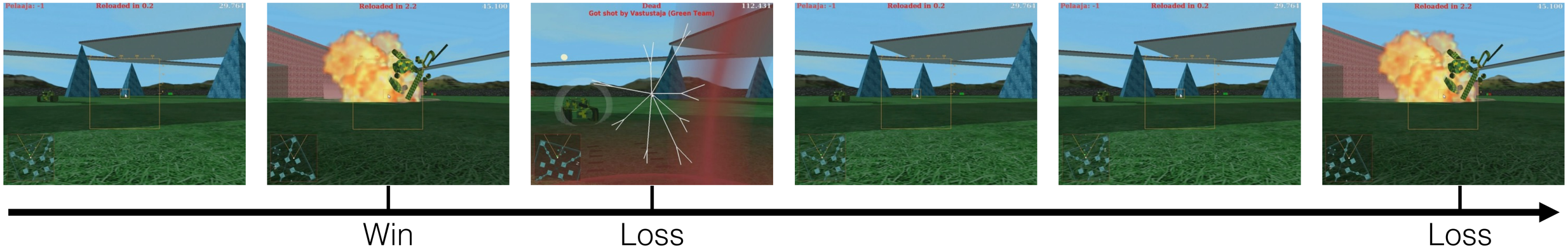


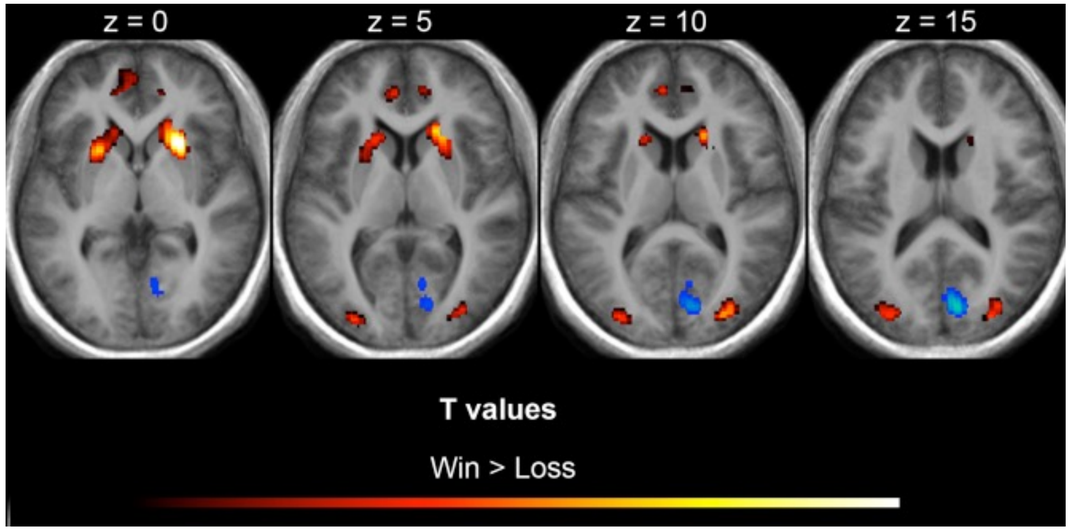
Karjalainen et al (2018 Cereb Cortex)

Basic tool 4: Unconstrained conditions and active experiments



Model-based analysis of an unstructured gameplay session





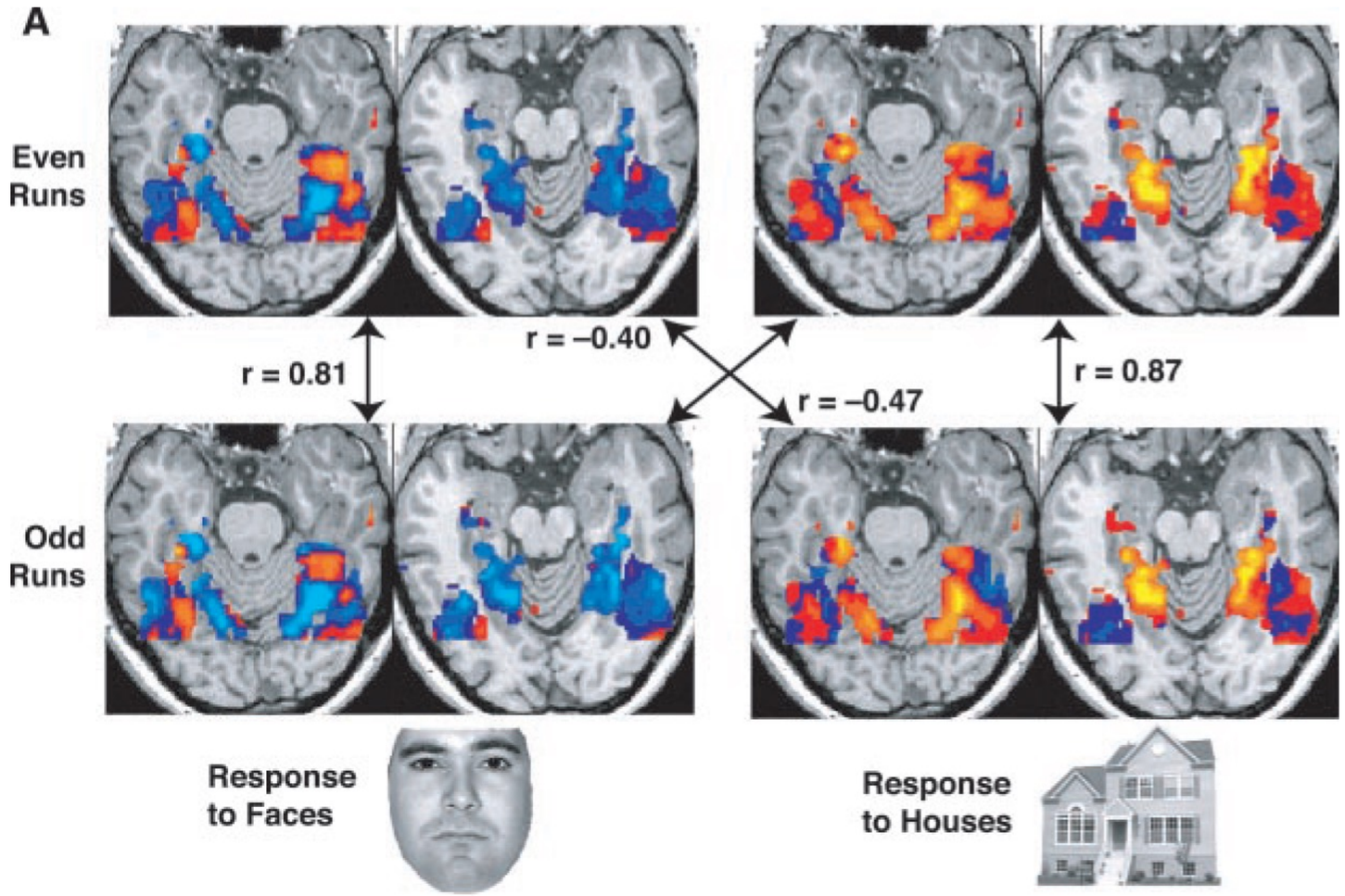
Kätsyri et al 2013 Cereb Cortex

- Stimulus model is stored based on player behaviour
- Events of interest modelled as
- Stick functions
- Everyone free to play as they want,
- But gameplay is parsed into similar event

Response variability across sessions

Sources of variation

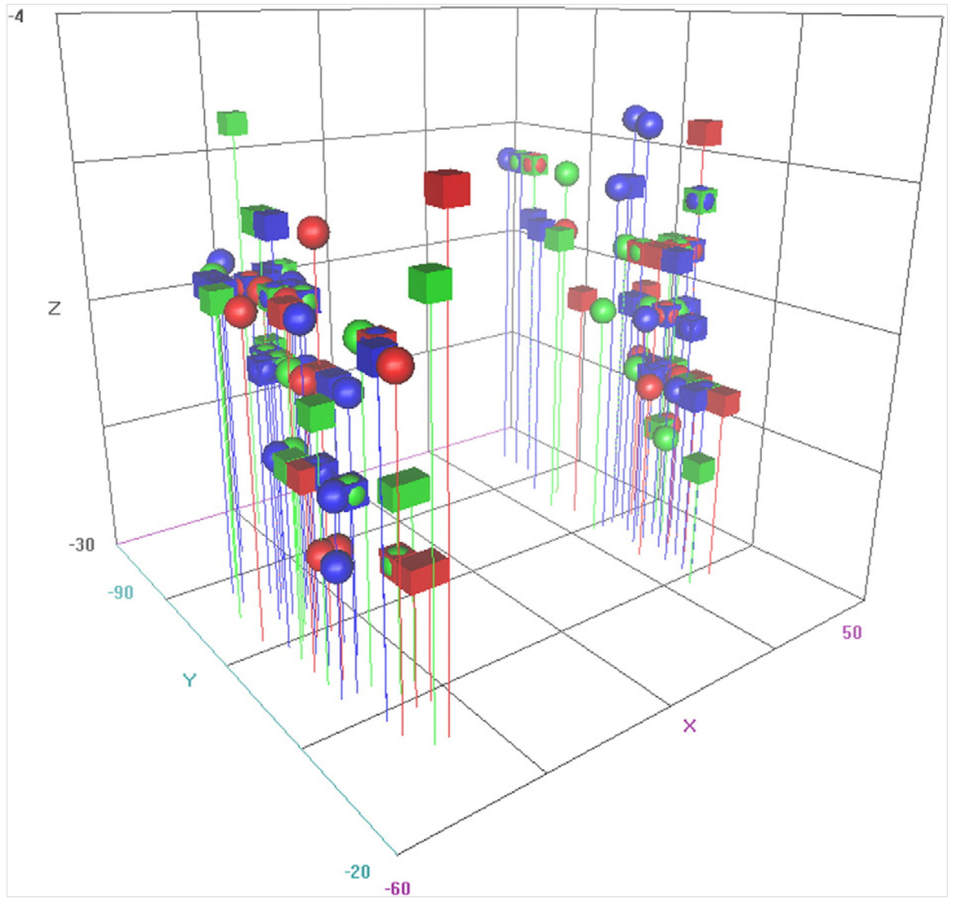
- Random variation (noise)
- Physiological state
- Arousal level
- Attention
- Learning effects
- Stimulus / event differences



Haxby et al (Science 2001)

Anatomical differences

- Localization of the ‘fusiform face area’ in 18 subjects
- Localizations vary considerably due to differences in
  - Gross anatomy
  - Functional specialization
  - Warping in normalization
- Also, consider differences in signal intensity across subjects
- All these factors are bound to lower SNR

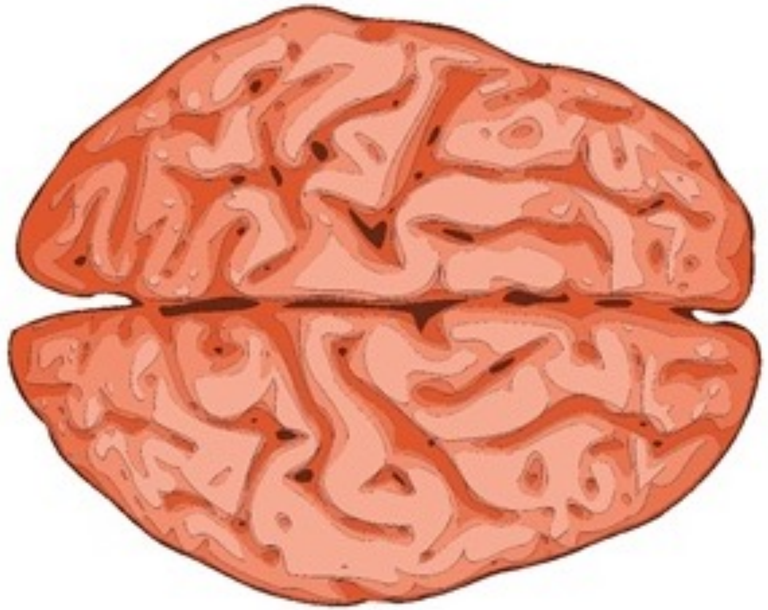


Behrens et al 2010

How to improve experimental power?

1. Improve design efficiency
2. Increase scan duration (to reasonable limits)
3. Minimize individual differences in cognitive / affective state
4. Maximize subject engagement (e.g. game > movie > picture)
5. Maximize similarity of subjects

Remember: your results are only as good as your theory!



High reliability and good SNR do not safeguard against stupid research questions and Bad Science™