

# Functional and molecular neuroimaging *in vivo*

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Established by the European Commission

### Why do we need to understand brain function?

- To aid in clinical diagnosis
- To understand physiology of the CNS
- To develop drugs that target CNS
- To understand 'higher' mental functions such as emotions and memory



Neuroscientist's three main problems





Figure 45-5 Biological Science, 2/e © 2005 Pearson Prentice Hall, Inc.



### Traditional cognitive neuroscience





Year





# Part 1: Principles of magnetic resonance imaging

# Magnetic resonance imaging

- Based on magnetic resonance of hydrogen nuclei omnipresent in human tissue
- By measuring RF signals emitted by hydrogen nuclei excited in a strong magnetic field we can study multiple tissue types in vivo
- By altering the excitation sequence we can highlight different tissues and their properties





#### EMI central laboratories











#### Coronal



0.5 mm isotropic voxels





## MRI in a nutshell

#### Strong No magnetic field magnetic field RF pulse



### Magnetic resonance



**T<sub>1</sub> Relaxation** 









### Proton density, relaxation time and contrast

- Proton Density (PD) = number of hydrogen atoms in a volume
  - High in watery tissue such as CSF, low in bone
- Spin-lattice relaxation time (T1)
  - Long in fluids, medium in water-based, short in fat-based tissue
- Spin-spin relaxation time (T2); always shorter than T1 in tissue
  - Long in fluids, medium in water-based, short in fat-based tissue
- Image contrast determined (primarily) by PD, T1 and T2 and their weighting in the pulse sequence

### T1-weighting





#### 1 mm isotropic voxel

#### 1 mm isotropic voxel

### T2-weighting

### T2\*-weighting (EPI)





#### 3 mm isotropic voxel



### Blood oxygenation dependent (BOLD) contrast



Heeger & Ress 2002 NRN





#### Neuronal activity

#### Metabolism

### Pathways to BOLD contrast

### Blood flow

#### dHb

#### Blood volume



#### Martin (2014 Front Neurosci)

# Part 2: Statistical analysis in fMRI

### Cognitive subtraction and boxcar design



### 20-second face block



**AIM** Localize brain regions that are more sensitive to faces versus non-face objects

**DESIGN** Blocked experiment using cognitive subtraction assuming pure insertion

20-second house block



### 20-second face block



### Cognitive subtraction and boxcar design



20-second





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

# Canonical double gamma HRF



#### Martin (2014 Front Neurosci)

### First-level model





Estimates task-induced activation in single subject. However effects are not fixed across subjects. For population-level inference, need to account for between-subjects variance

STATISTICAL SIGNIFICANCE AT  $1^{ST}$  LEVEL = RELIABILITY OF EXPERIMENTAL MANIPULATION ON BRAIN ACTIVITY IN THIS PARTICULAR SUBJECT

## First and second level models

#### **EPI DATA**

**UNIVARIATE MODEL** FOR EACH VOXEL



Predictor variable

STATISTICAL SIGNIFICANCE AT  $2^{ND}$  LEVEL = RELIABILITY OF EXPERIMENTAL MANIPULATION ON BRAIN ACTIVITY ACROSS SUBJECTS

VOXELWISE EFFECTS (BETAS)

2<sup>nd</sup> LEVEL MODEL (T-IMAGE)



# Part 3: Experimental designs for functional MRI

### Boxcar design



Smirnov, Glerean, Lahnakoski, ..., & Nummenmaa (2014 Neurospychologia)

# Analysing free-ranging behaviour





### Winning activates the stratal reward circuit



Kätsyri, Ravaja, Hari & Nummenmaa (2013 Cereb Cortex)



# Connectivity analysis



Nummenmaa et al (J Neurosci, 2015)




Nummenmaa et al (2014 Neuroimage)

### Sub-voxel resolution with pattern recognition?



Sharifan, Nummenmaa & Vanni (unpublished work)





Rees & Haynes (2006 Nat Rev Neurosci)

### Sub-voxel resolution with pattern recognition?

- Orientation preferences are systematically mapped in V1
- Regions with different orientation tuning separated by 0.5 mm and cannot thus be discriminated by conventional EPI imaging
- Due to slight irregularities in the orientation specific maps, different voxels contain uneven distribution of orientation-specific cells
- Differences are small, but when taken into account together they allow estimation of orientation selectivity









Rees & Haynes (2006 Nat Rev Neurosci)





#### Feature selection



#### **CLASSIFIER** learns to associate emotions with brain states

#### **Test data**



???



???



???



???

Classifier is tested with a novel dataset it has never seen before

#### Task begins

Exp 1 Induction







#### Task begins

Exp 2 Cued Imagery





#### 1 second

Saarimäki et al (Cereb Cortex 2015)

#### Movie

ITI

#### 14 seconds 10 seconds

**Emotion word** 



2 seconds

14 seconds





Saarimäki et al (Cereb Cortex 2015)

#### Movies



Saarimäki et al (Cereb Cortex 2015)

#### Imagery

#### Crossmodal



### Intersubject synchronisation









y = -8





0.2

#### Dorsal

#### Left



x = −15

z = 2

0.4

ISC

Nummenmaa et al (2012 Proc Natl Acad Sci U.S.A)



#### 5 seconds

#### 15 seconds



#### Fixation cross

Text describing the Movie clip general context of the upcoming movie

Nummenmaa et al (2012 Proc Natl Acad Sci USA)

#### 29 to 132 seconds 5 seconds

Fixation cross cross, next trial

### Emotions make brains tick together



#### Francis Ford Coppola: *The Godfather* Paramount Pictures (1972)

Nummenmaa et al (2012 Proc Natl Acad Sci USA)

0.2 Intersubject synchronisation





![](_page_47_Figure_2.jpeg)

Nummenmaa et al (2012 Proc Natl Acad Sci USA)

#### Default mode network

### Dorsal attention network z = 60

![](_page_47_Picture_6.jpeg)

## Summary - MRI

- Noninvasive method for imaging soft tissue
- Can be used for quantifying Hb / dHb ratio from blood
- Indirect measure of brain activity
- Full-volume, high bandwidth, high spatial resolution
- Slow, unspecific, does not measure neural activity directly

## Part 4: Principles of Positron Emission Tomography

![](_page_50_Figure_0.jpeg)

![](_page_51_Picture_0.jpeg)

#### Synaptic connections

![](_page_52_Figure_1.jpeg)

#### Neurotransmitters

![](_page_52_Picture_3.jpeg)

#### **PET camera**

![](_page_53_Picture_1.jpeg)

**Positron Emission Tomography** allows in vivo quantification of the distribution of specific chemical compounds. It can thus be used for studying specific neurotransmitter systems.

#### **Coincedence detection**

![](_page_53_Picture_5.jpeg)

#### **Reconstructed image**

![](_page_53_Picture_7.jpeg)

#### Isotope production [<sup>11</sup>C<sup>18</sup>F<sup>13</sup>N<sup>15</sup>O]

#### Image of ligand distribution in brain

![](_page_54_Picture_2.jpeg)

![](_page_54_Picture_3.jpeg)

![](_page_54_Picture_4.jpeg)

## Radiochemistry

- Radioligands: Biologically active, unstable isotopes
- Decay via positron emission
- Short half-life required for sufficient SNR and reasonable scan duration
- Need to be synthesised close to PET camera
- Radiochemistry allows investigation of any biological circuit as long as it can be radiolabeled
- Radiochemistry is the "pulse sequence design for PET"

# What makes a good radioligand?

- Optimal target density and ligand affinity: Density x Affinity ≈5
- High brain uptake
- Optimal lipophilicity (LogP=2.5–4); sufficiently high to cross bloodbrain barrier but not too high to cause non-specific binding
- Not substrate for efflux transporters at BBB (e.g., P-gp)

- High pharmacological selectivity
- No brain-penetrant radiometabolites
- Quantifiable plasma protein binding
- Amenability to rapid labelling with high specific activity
- Fast enough kinetics to allow measurement in a few hours

### 18 MeV CC18/9 Cyclotron at the Turku PET Centre

![](_page_57_Picture_1.jpeg)

#### [11C] carfentanil MOR tracer

### [11C] MADAM SERT tracer

### [11C] raclopride D2R tracer

![](_page_58_Picture_3.jpeg)

### Some common PET tracers

Stable molecule	Isotope	Half-life	
Fluoride [F]	[18F]	118 min	
Carbon [C]	[11C]	20 min	
Nitrogen [N]	[13N]	10 min	
Oxygen [O]	[015]	2 min	

**Typical tracer** 

Target molecule / system

[18F]FDG

glucose analogue

[11C]carfentanil

MOR / KOR / DOR -receptor

[13N] ammonia

perfusion

H2O15

perfusion

#### Positron emission

![](_page_60_Picture_1.jpeg)

#### Image reconstruction

![](_page_61_Figure_0.jpeg)

#### Coincidence

Sinogram

![](_page_62_Picture_2.jpeg)

![](_page_62_Picture_3.jpeg)

#### Reconstructed slice

![](_page_62_Picture_6.jpeg)

![](_page_63_Picture_0.jpeg)

#### tors Corresponding location in sinogram

![](_page_63_Figure_2.jpeg)

Colorado, Anschutz Medical Campus, Aurora, Colorado, USA

# Modelling

- Modelling transforms radioactivity concentration into biologically relevant pharmacokinetic information
  - **No modeling** ('raw' radioactivity)
  - Standardised uptake value (SUV; control for injection and weight)
  - **Kinetic modeling** (arterial plasma as input)
  - **Reference tissue model** (reference tissue as input; not always possible as e.g. with H2O)

![](_page_64_Figure_6.jpeg)

![](_page_65_Picture_0.jpeg)

### Fitting a function to the data

 $y=-(x-30)^2 + 50$ 

 $y = K_1 e^{-k2t} + k_3 e^{-k4t}$ 

![](_page_65_Picture_4.jpeg)

# Part 5: Experimental designs for PET

![](_page_67_Figure_0.jpeg)

# Between-groups design

### Group 1

![](_page_68_Picture_2.jpeg)

Voxelwise comparison with mass univariate tests

![](_page_68_Picture_4.jpeg)

![](_page_68_Picture_5.jpeg)

![](_page_69_Figure_0.jpeg)

Berridge & Kringelbach (2013 CiN)

![](_page_70_Figure_0.jpeg)

#### Karlsson et al (2015 J Neurosci)

![](_page_70_Figure_2.jpeg)

![](_page_71_Figure_0.jpeg)

**Brain region**
# Longitudinal design



Lag typically tens of days

Scan 2

Voxelwise comparison with mass univariate tests



# Non-obese [<sup>11</sup>C]carfentanil [<sup>11</sup>C]raclopride

### Karlsson et al (2015 Mol Psych)



### Functional PET (challenge paradigm) Temporal resolution tens of minutes



Decay break

Statistical comparison (cognitive subtraction)



## Challenge paradigm



### Zubieta (2001 Science)



### Agonist decreased grooming and grooming calls

HO

HO

Antagonist
lincreased
grooming and
grooming calls





Suvilehto, Glerean, Dunbar Hari & Nummenmaa (2015; Proc Natl Acad Sci USA)



T score





Suvilehto, Glerean, Dunbar Hari & Nummenmaa (2015; Proc Natl Acad Sci USA)

#### Social touch



Nummenmaa et al (in revision; Neurolmage)

#### Baseline





Nummenmaa et al (in revision; Neurolmage)





Manninen et al (in preparation)



### Correlational design

#### Baseline scan













### Low anxiety

### Secure attachment



### **High avoidance**

### High anxiety

### Low avoidance



Nummenmaa et al (2015 Hum Brain Mapp;)

ECR avoidance

### Summary - PET

- Based on radiolabeled tracers
- radiolabeled
- Excellent chemical resolution
- Spatial resolution limited due to positron scattering
- Temporal resolution depends on tracer kinetics; typically from

• Allows quantification of any biological system as long as it can be

minutes to hours and often not relevant (no functional imaging)

