

Cognitive Neuroscience for AI Developers

Methods of Cognitive Neuroscience: Lesioning, Neuroimaging



Motivation

- Different techniques (imaging, lesioning) are necessary as different time-scales and spatial resolutions are covered

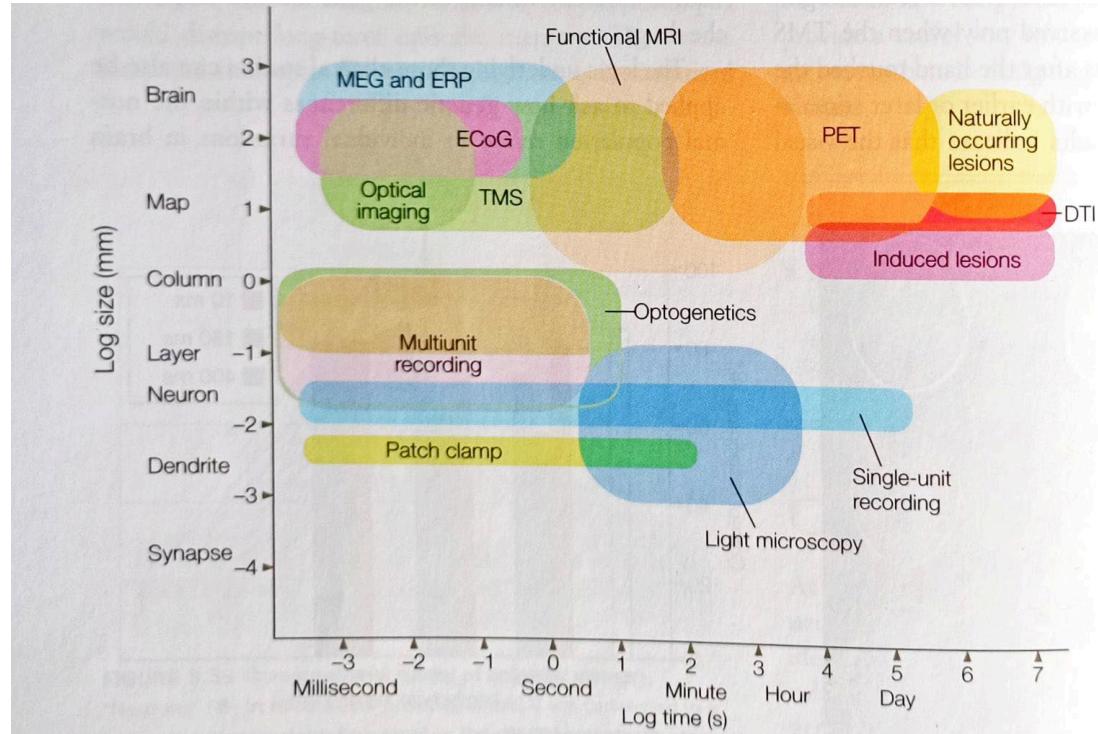


FIGURE 3.41 Spatial and temporal resolution of the prominent methods used in cognitive neuroscience.

Motivation

- Different techniques (imaging, lesioning) are necessary as different time-scales and spatial resolutions are covered

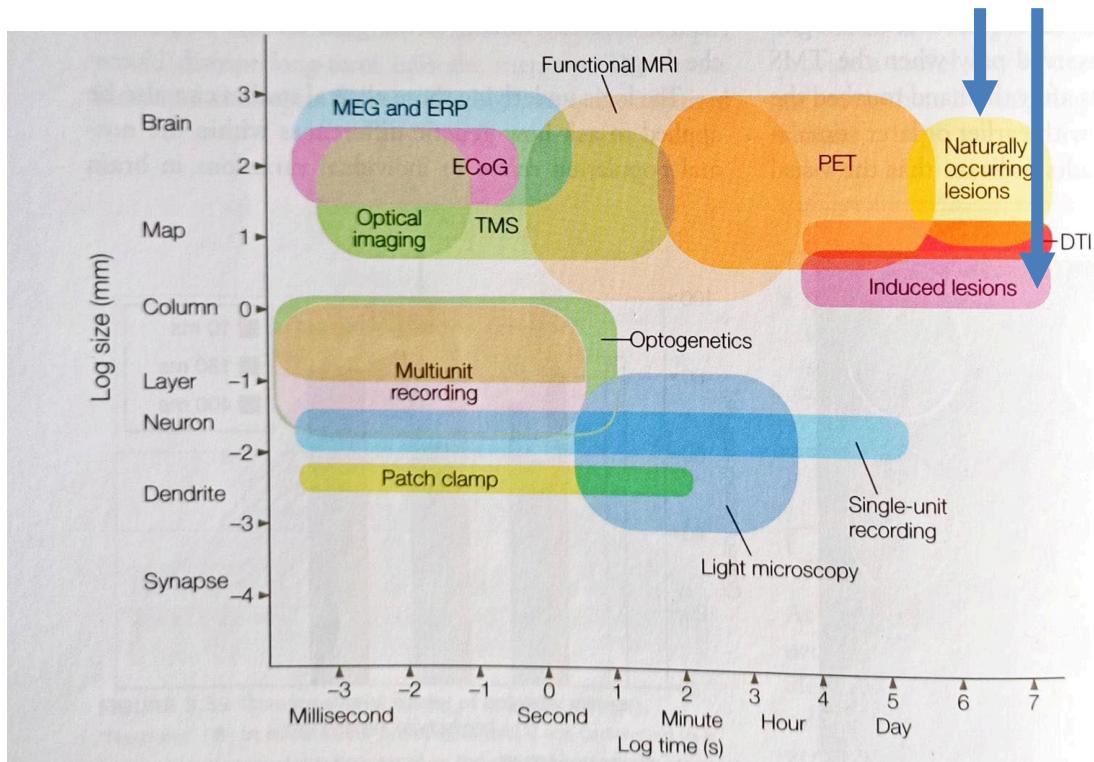


FIGURE 3.41 Spatial and temporal resolution of the prominent methods used in cognitive neuroscience.

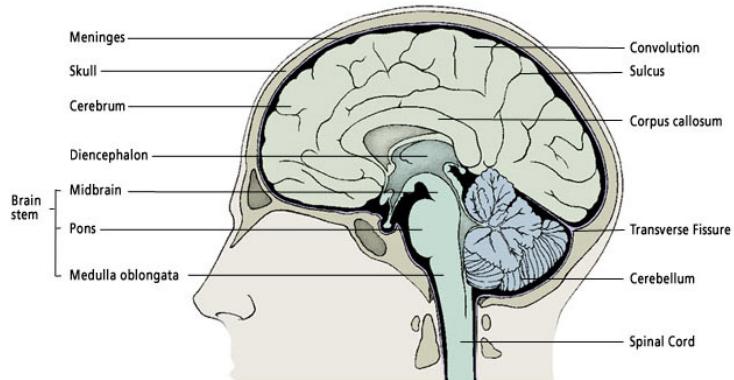
Lesion studies in general

But first: Very brief overview of brain anatomy

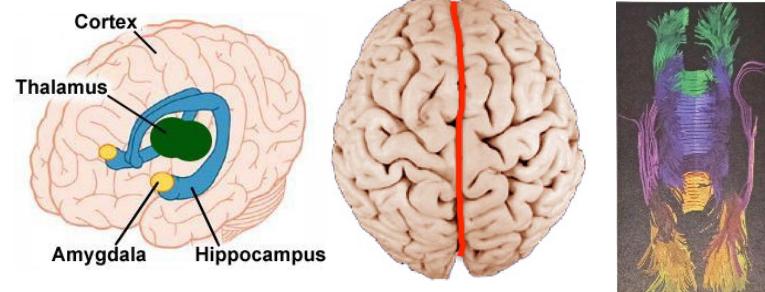
in detail: later lecture

- **peripheral nervous system:** transforms environmental stimuli into neuronal signal (-> spinal chord -> brain)
- **Brainstem:** pre-processing of the signal coming from periphery
- **Thalamus:** controls which signal is transmitted to cortex
- **Cortex:** Higher processing an perception: conscious perception, voluntary movements, language, math reading, memory storage and retrieval
- **Hippocampus:** spatial orientation, memory formation and distribution
- Brain is (nearly) mirror symmetrical
- **Corpus callosum:** nerve fibers connecting both hemispheres (especially cortex areas)

The Major Portions of the Brain Include the Cerebrum, Cerebellum and Brain Stem



<https://www.atlantabrainandspine.com/brain-anatomy/>



Source: <https://www.pinterest.de/pin/384494886932859162/>

<https://www.mdpi.com/2227-7080/5/2/16>

Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

Lesion studies

In general:

- to draw conclusions about function of a certain part of the brain by studying impairment / functional deficit caused by damage to this brain part
- Some kind of „reverse engineering“ -> what can brain do without certain parts

Lesions e.g. due to

- injuries after accidents
- Disorders
- **surgeries** to treat e.g. epilepsy

Brain Disorders:

Vascular disorders

- Stroke: Bloodflow stops cause of occlusion of arteries
- Cerebral hemorrhage

Tumors

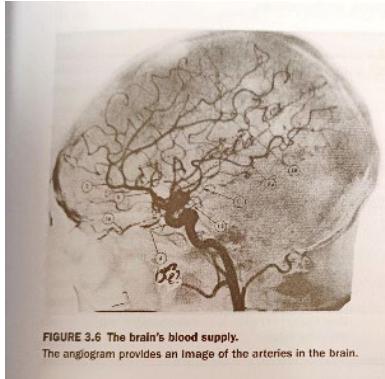
- Abnormal growth of tissue with no function (most caused by glial cells, benign, malignant)

Degenerative disorders

- E.g. Huntington disease, Alzheimer's disease, AIDS

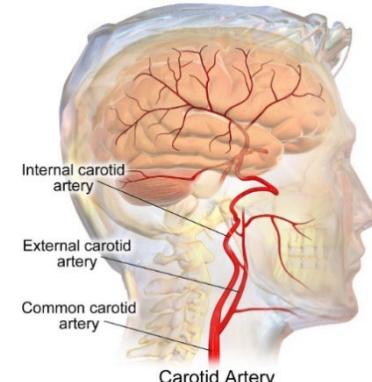
Examples for brain disorders

Vascular disorders:



Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

- Blood supply of the brain: Angiography
- Injection of dye
 - X-ray study



https://en.wikipedia.org/wiki/Internal_carotid_artery

- Stroke: occlusion of arteries
- Cerebral hemorrhage: breakage of blood vessels (e.g. high blood pressure)

Examples for brain disorders

Degenerative disorders:
2 examples

Alzheimer's disease

- Atrophy of the cerebral cortex and hippocampus
- Reason: unknown

Huntington disease

- Genetic
- Atrophy interneurons

MRI scan (Alzheimer's disease)

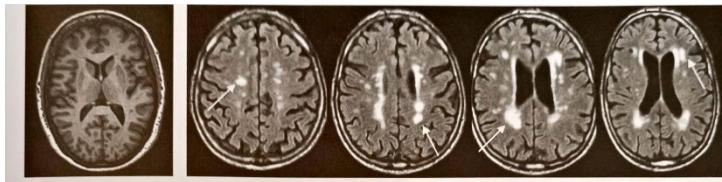


FIGURE 3.8 Degenerative disorders of the brain.
 (a) Normal brain of a 60-year-old male. (b) Axial slices at four sections of the brain in a 79-year-old male with Alzheimer's disease. Arrows show growth of white matter lesions.

Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

Disorder	Type	Most Common Pathology
Alzheimer's disease	Degenerative	Tangles and plaques in limbic and temporoparietal cortex
Parkinson's disease	Degenerative	Loss of dopaminergic neurons
Huntington's disease	Degenerative	Atrophy of interneurons in caudate and putamen nuclei of basal ganglia
Pick's disease	Degenerative	Frontotemporal atrophy
Progressive supranuclear palsy (PSP)	Degenerative	Atrophy of brainstem, including colliculus
Multiple sclerosis	Possibly infectious	Demyelination, especially of fibers near ventricles
AIDS dementia	Viral infection	Diffuse white matter lesions
Herpes simplex	Viral infection	Destruction of neurons in temporal and limbic regions
Korsakoff's syndrome	Nutritional deficiency	Destruction of neurons in diencephalon and temporal lobes

Famous examples of lesion studies and consequences

Lesion studies:

What we can learn from brain injuries



Source: wikipedia.org

- **Phineas Gage 1823-1860**
- American railroad construction foreman
- 1848 Gage survived a fatal accident
- large iron rod completely driven through his head
- destroying brain's **left frontal lobe**
- dramatic changes in **personality and behavior**



Source: wikipedia.org

His friends said: Gage is “no longer Gage” !

Lesion studies:

What we can learn from brain injuries



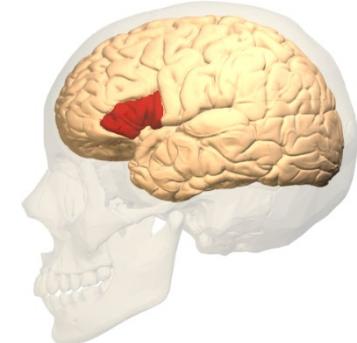
Source: wikipedia.org

Pierre Paul Broca (1824-1880)

French physician, anatomist and anthropologist

- 1861 he reported impairments in one patient (named 'Tan')
- Tan could understand language
- lost the **ability to speak** after injury to the **left posterior inferior frontal gyrus**
-> tan was only word he could say

-> brain region was named Broca's area
(important for speech production)



Source: wikipedia.org

Lesion studies:

What we can learn from brain injuries



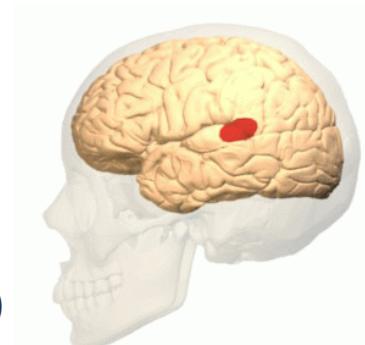
Source: wikipedia.org

Carl Wernicke (1848-1905)

German physician, anatomist, psychiatrist and neuropathologist

study of receptive aphasia (1876):

- impaired **comprehension of written and spoken language** after injury to the **left superior temporal gyrus**
- However he could speak (made no sense)



Source: wikipedia.org

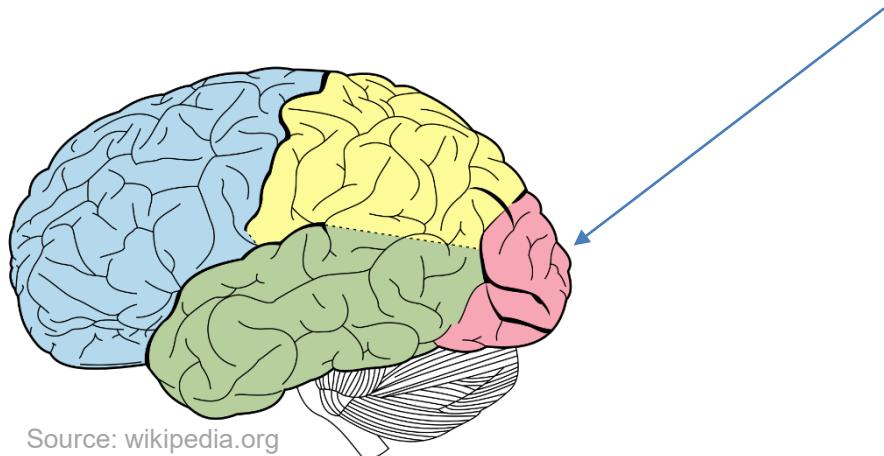
-> Wernicke's area (important for speech comprehension)

Lesion studies:

What we can learn from brain injuries

Cortical blindness

total or partial loss of **vision** in a normal-appearing eye caused by damage to the **occipital cortex**



Source: wikipedia.org

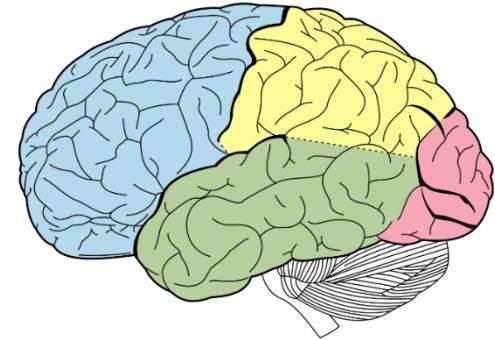
- Inability to report visual stimuli
- But however sometimes people behave as if they have seen the object
- People report to see nothing but are able to point towards the stimulus

Lesion studies: What we can learn from brain injuries

Cortical blindness

How is this possible?

- 10 different pathways from eye to the brain have been identified (most important pathway superior colliculus, lateral geniculate body, V1)
- Other routes are evolutionary more ancient
- These routes were not removed but further routes were added

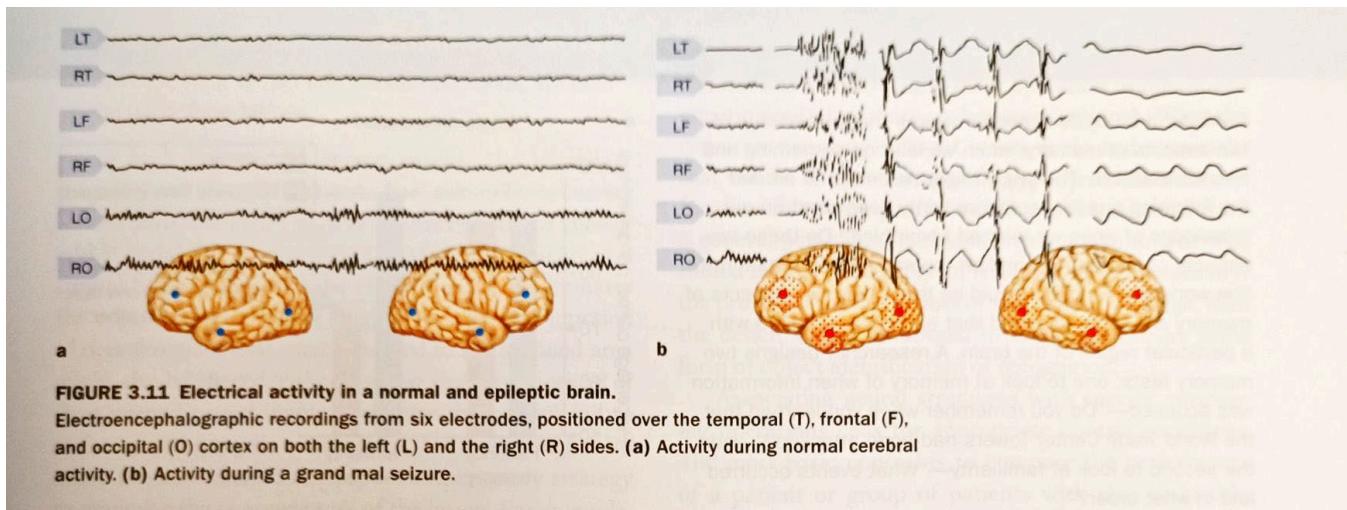


Source: wikipedia.org

Lesion studies (brain surgeries, epilepsy)

Epilepsy:

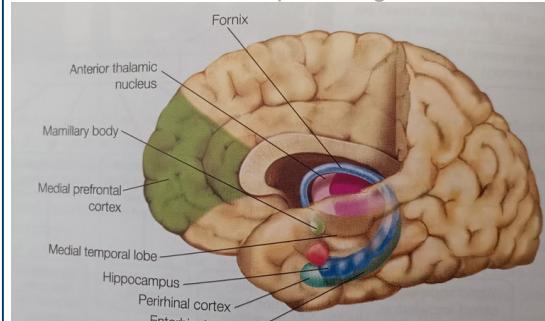
- Abnormal hyperactivity in the brain
- Leads to seizures -> loss of consciousness, shaking...
- Were often treated by lobectomies.... (lobectomy: resection of cortical lobe)
- After lobectomy -> scientific evaluation of the effects



Lesion studies: What we can learn from brain surgeries



Source: wikipedia.org



Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

Henry Gustav Molaison, known widely as patient **H.M.**
1926-2008

In 1953: bilateral medial temporal lobectomy:
surgical resection of the anterior two thirds of his hippocampi,
parahippocampal cortices and entorhinal cortices
in an attempt to cure his epilepsy

Surgery was successful in controlling his epilepsy
severe side effect: he became unable to form new memories

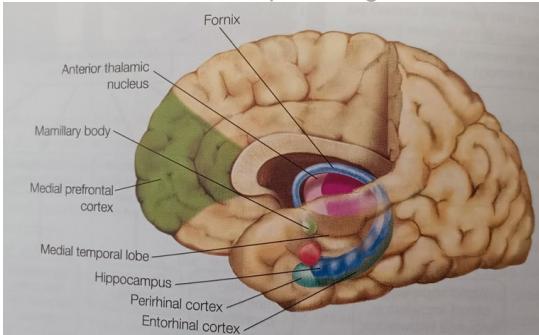
H.M. was widely studied from late 1957 until his death in 2008

Lesion studies:

What we can learn from brain surgeries



Source: wikipedia.org

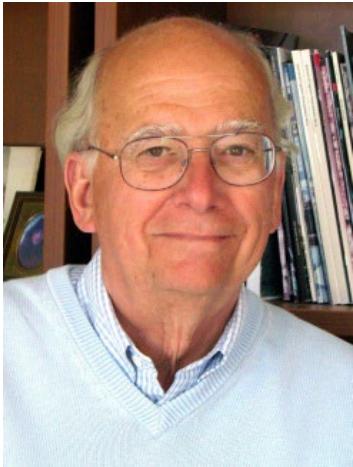


Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

His case played an important role in:

- development of theories that explain the link between brain function and memory
 - development of cognitive neuropsychology branch of psychology that aims to understand how the structure and function of the brain relates to specific psychological processes
-
- Unable to form new explicit memories: experiences
 - Only short-term memory of a few minutes
 - Still able to learn new motor skills: playing an instrument

Lesion studies: What we can learn from brain surgeries



Michael Gazzaniga, Professor of psychology
born 1939

one of the leading researchers in cognitive neuroscience and
the study of the neural basis of mind

Source:
<https://psych.ucsb.edu/people/michael-gazzaniga>

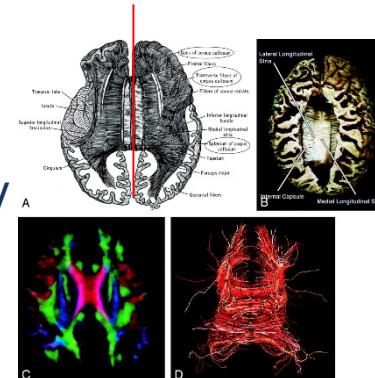
Split-brain patients:
Dissection of the corpus callosum to treat epilepsy

-> Patient W.J.

Jellison, B. J., Field, A. S., Medow, J., Lazar, M., Salamat, M. S., & Alexander, A. L. (2004). Diffusion tensor imaging of cerebral white matter: a pictorial review of physics, fiber tract anatomy, and tumor imaging patterns. *American Journal of Neuroradiology*, 25(3), 356-369



Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014



Cut brain along medial longitudinal fissure

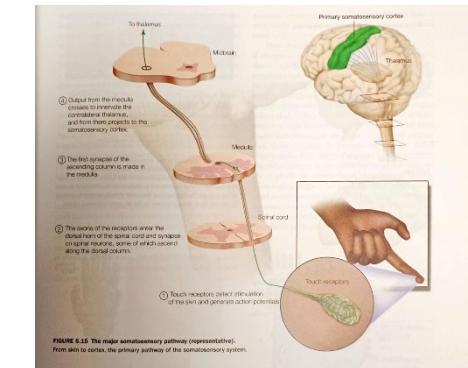
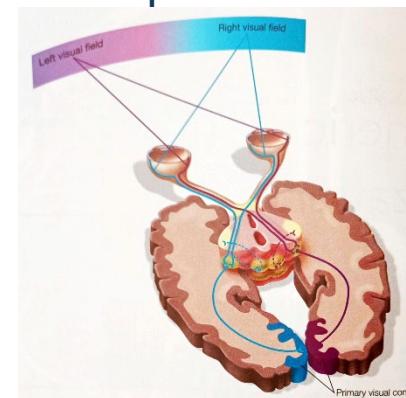
Patient W.J.

- World War II paratrooper who got hit in the head with a rifle butt, after which he started having seizures
- Before his operation to try to fix the seizures, Gazzaniga tested his brain functions
- presenting stimuli to the left and right visual fields and identifying objects in his hands that were out of view. W.J. was able to perform these tasks perfectly
- -> Dissection of the corpus callosum

Important: sensory and motor pathways cross in the brain

-> right visual field, right hand input -> processed in left cortex

-> left cortex controls right hand

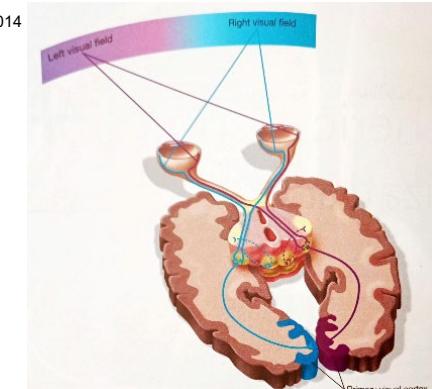


Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

Patient W.J.

- After surgery: both hemispheres could not communicate with each other
 - stimuli presented to the right visual field: could verbally report what he had seen
 - stimuli presented to the left visual field: could not verbally report but press left button (right hemisphere)
- > lateralization of brain functions -> later in lecture
- conflicts between the hemispheres: left hand opens a door, right hand tries to stop left hand

Cognitive neuroscience,
Gazzaniga, Ivry, Mangun, 2014





Antonio Damasio, Professor of psychology, philosophy, neurology born 1944

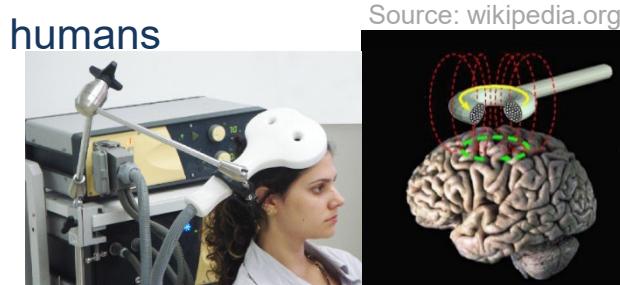
- Created world's largest data base of brain injuries
- Identified brain regions crucial to maintain different degrees of consciousness
- Explores relationship between brain and consciousness
- Developed his own theory how consciousness emerges in the brain
- Damasio's research in neuroscience has shown that emotions play a central role in social cognition and decision-making

Source: wikipedia.org

Non-invasive lesion studies

Transcranial magnetic stimulation (TMS)

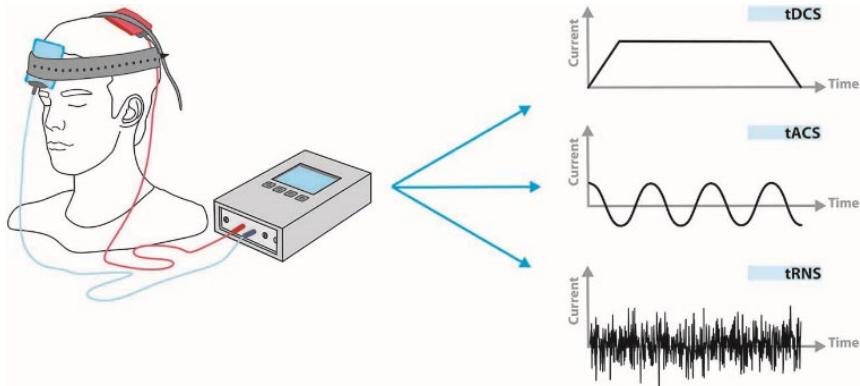
- changing magnetic field used to cause electric current at a specific area of the brain through electromagnetic induction
 - electric pulse generator connected to a magnetic coil, which is connected to the scalp
 - stimulator generates changing electric current within the coil which induces a transient magnetic field
 - magnetic field causes a second inductance of inverted electric charge within the brain itself -> hyperactivity -> area temporally switched off due to refractory period
- exact mechanisms of neural discharge not well understood
- used clinically to measure function of specific brain circuits in humans
- e.g. used to treat tinnitus



Source: wikipedia.org

Transcranial direct current stimulation (tDCS)

- Already the old Greeks used this method (electric torpedo fish) to numb people during and to alleviate pain during birth
- Today: two small electrodes (1-2mV)
- Neurons below the anode become depolarized -> more excitable
- Neurons below cathode become hyperpolarized -> less excitable
- Used to treat neurological conditions (e.g. chronic pain)
- > huge advantage of tDCS and TMS: people are their own control group



https://www.frontiersin.org/files/Articles/235394/fnhum-11-00159-HTML/image_m/fnhum-11-00159-g001.jpg

Lesion studies in animal experiments

- Frequently performed in animal experiments with cats or rodents
- Provides opportunity to systematically compare different lesions
- To draw conclusions about function of certain parts of the brain

Lesion studies in AI



RESEARCH ARTICLE

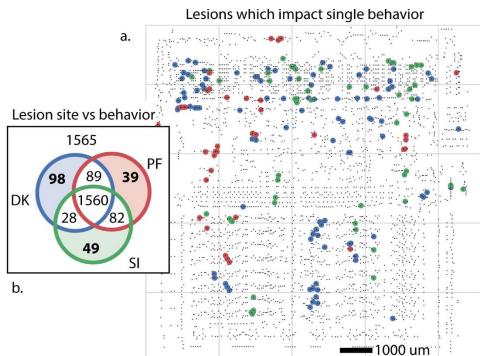
Could a Neuroscientist Understand a Microprocessor?

Eric Jonas^{1*}, Konrad Paul Kording^{2,3}

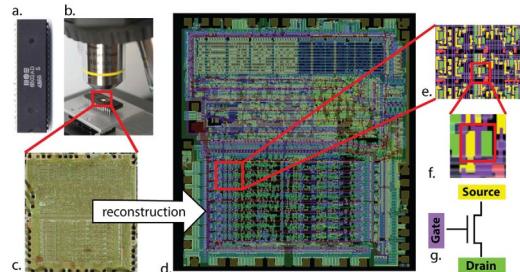
Jonas, E., & Kording, K. P. (2017). Could a neuroscientist understand a microprocessor?. *PLoS computational biology*, 13(1), e1005268.

Lesion studies in AI

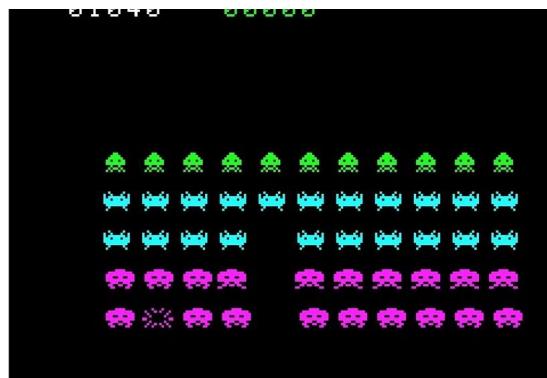
- Emulated micro-processor (MOS 6502) as model system -> used for Apple I, Commodore 64, Atari Video Game system
- Behavior of the model system -> Donkey Kong, Space invaders, Pitfall
- Perform experiments on this model



- Lesion each transistor individually
- In some cases the games do not boot



Jonas, E., & Kording, K. P. (2017). Could a neuroscientist understand a microprocessor?. *PLoS computational biology*, 13(1), e1005268.



Jonas, E., & Kording, K. P. (2017). Could a neuroscientist understand a microprocessor?. *PLoS computational biology*, 13(1), e1005268.

<https://www.spiegel.de/geschichte/30-jahre-space-invaders-a-947371.html>

Lesion studies in AI

- In contrast to biological brains, AI systems can be completely read out
- Location and expansion of lesion can be controlled
- Lesioning of individual neurons, connections or layers to reverse-engineer function of an artificial deep neural network
- However if lesion studies are the right way to unravel the brain/AI is questionable

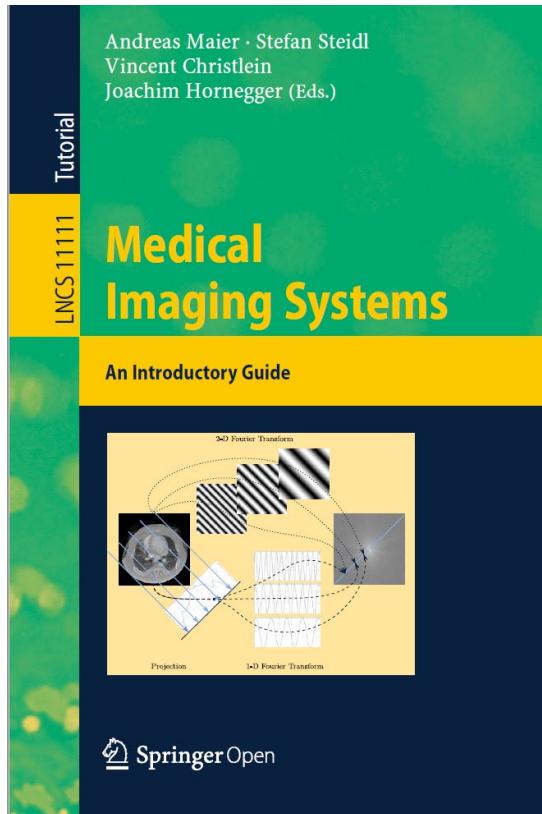


RESEARCH ARTICLE
Could a Neuroscientist Understand a
Microprocessor?

Eric Jonas^{1*}, Konrad Paul Kording^{2,3}

No!

Neuroimaging: Brain structure and function



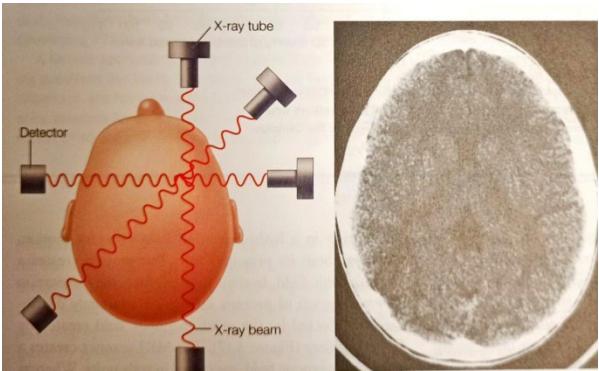
Methods to analyze Brain structure

Methods used to investigate Brain Structure

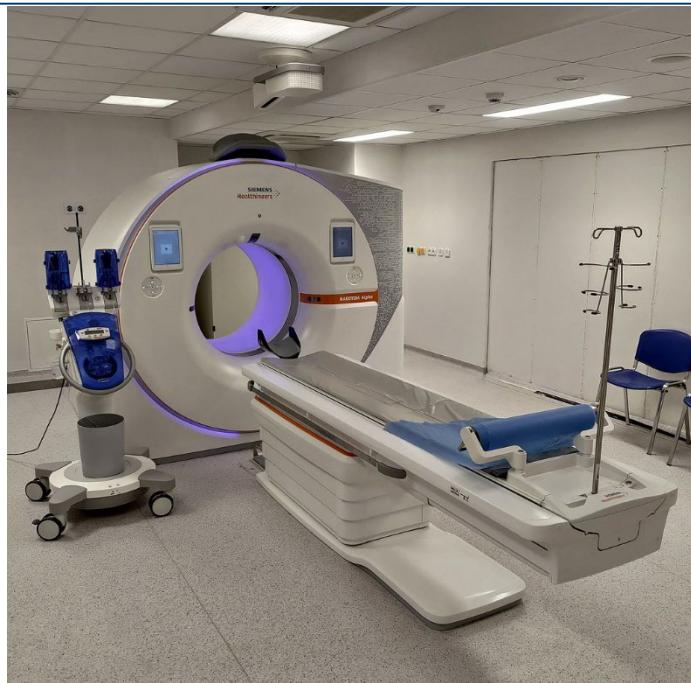
- Computed Tomography (CT)
- Magnetic Resonance Imaging (MRI)
- Diffusion Tensor Imaging (DTI, special form of MRI)
- Photo-Acoustic Imaging

Computed Tomography (CT)

- Commercially introduced in 1983
- Normal X-ray (Röntgen) -> 2D images
- Sensor and X-ray emitter rotate
- CT: Calculate 3D reconstruction from 2D images (spatial resolution: 0.5-1cm)



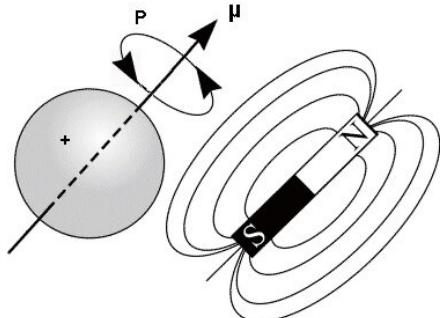
Cognitive neuroscience, Gazzaniga, Ivry,
Mangun, 2014



https://en.wikipedia.org/wiki/CT_scan#/media/File:Modern%CT_v%C3%BDpo%C4%8Detn%C3%ADtomografie_s_p%C5%99%C3%ADmo_digit%C3%A1ln%C3%ADdetek%C3%A9rentgenov%C3%A9ho_z%C3%A1%C5%99en%C3%A9D.jpg

Magnetic Resonance Imaging (MRI)

- Far better spatial resolution than CT (below 1mm)
- Exploits the magnetic properties of protons (hydrogen ions in water)
- Protons have a spin -> small magnets



https://www.researchgate.net/publication/336777823_The_nuclear_magnetic_resonance_and_the_magnetic_resonance_imaging_process_Introducing_random_differential_equation_systems_for_Bloch_equations_model/figures?lo=1



https://en.wikipedia.org/wiki/Magnetic_resonance_imaging#/media/File:Siemens_Magnetom_Aera_MRI_scanner.jpg

Costs around 1 Million \$ per Tesla!

Sarracanie, M., LaPierre, C. D., Salameh, N., Waddington, D. E., Witzel, T., & Rosen, M. S. (2015). Low-cost high-performance MRI. *Scientific reports*, 5(1), 15177.

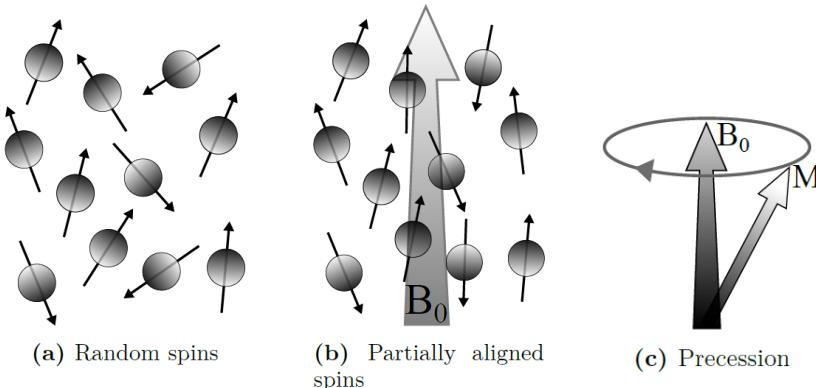
Earth magnetic field: $\sim 40\mu\text{T}$

Grappone, J. M., Biggin, A. J., & Hill, M. J. (2019). Solving the mystery of the 1960 Hawaiian lava flow: implications for estimating Earth's magnetic field. *Geophysical Journal International*, 218(3), 1796-1806.

Magnetic Resonance Imaging (MRI)- Step-by-Step

- 1. Step:

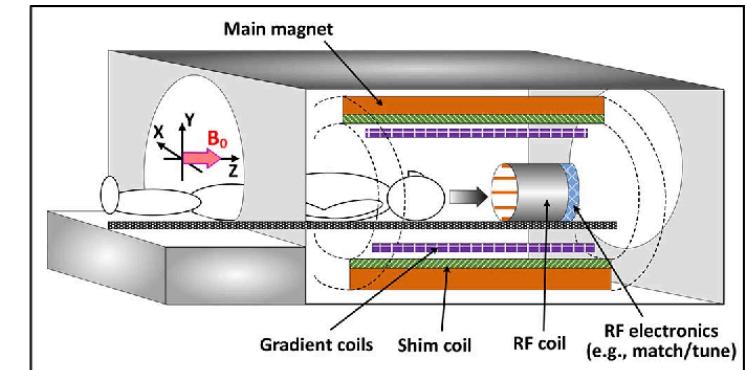
- A huge magnetic field (**B₀**) is applied (now up to 7T, Main Magnet)
- Protons partially align in magnetic field B₀ of scanner (for 1T only 3 of 1 Million)
- Protons do not align instantaneously
- Precession of net magnetization M (M: sum of all aligned protons) around B₀



Maier, A., Steidl, S., Christlein, V., & Hornegger, J. (Eds.). (2018). Medical imaging systems: An introductory guide.

$$f_\ell = \gamma \cdot \|B_0\|$$

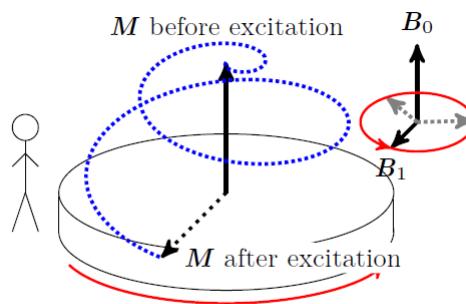
Frequency of precession: **Larmor Frequency**



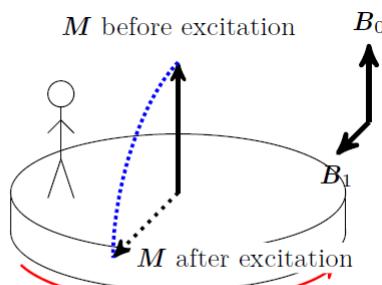
Sohn, S. M., DelaBarre, L., Gopinath, A., & Vaughan, J. T. (2014). RF head coil design with improved RF magnetic near-fields uniformity for magnetic resonance imaging (MRI) systems. *IEEE transactions on microwave theory and techniques*, 62(8), 1784-1789.

Magnetic Resonance Imaging (MRI)- Step-by-Step

- 2 .Step:
 - Excitation of the aligned magnets
 - B_1 is applied (magnetic field orthogonal to B_0 and resonance frequency of M)

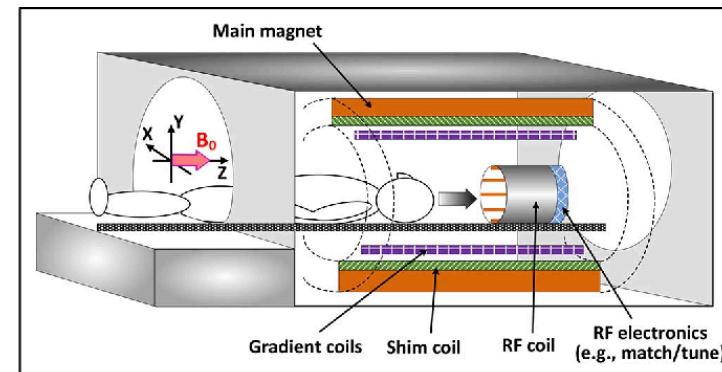


(a) "World" frame of reference



(b) Rotating frame of reference

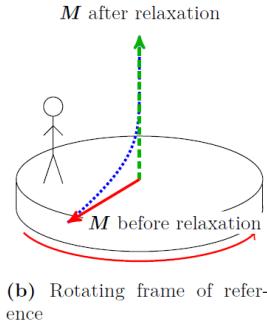
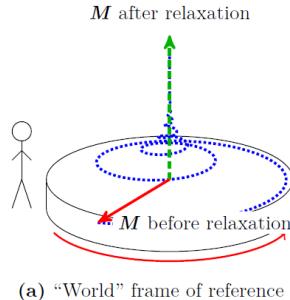
Maier, A., Steidl, S., Christlein, V., & Hornegger, J. (Eds.). (2018). Medical imaging systems: An introductory guide.



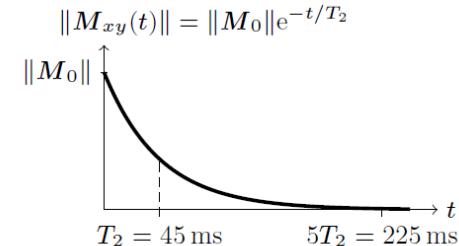
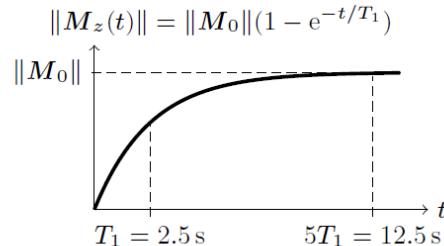
Sohn, S. M., DelaBarre, L., Gopinath, A., & Vaughan, J. T. (2014). RF head coil design with improved RF magnetic near-fields uniformity for magnetic resonance imaging (MRI) systems. *IEEE transactions on microwave theory and techniques*, 62(8), 1784-1789.

Magnetic Resonance Imaging (MRI)- Step-by-Step

- 3 .Step:
 - B1 is turned off
 - M realigns with B0 -> relaxation
 - T1: Time it takes to re-increase the z-component of the net magnetization Mz
 - T2: time it takes to re-decrease the xy-component of Mxy

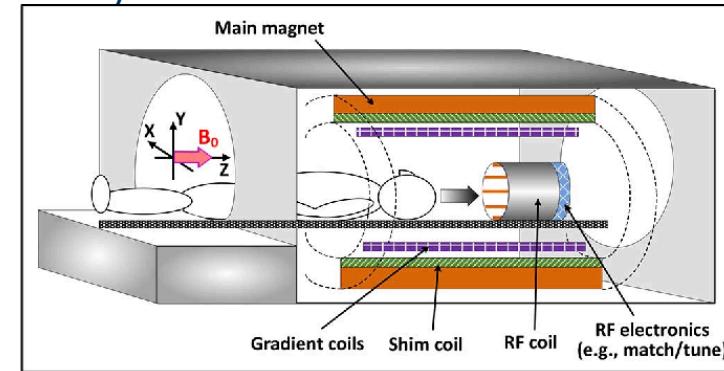


Maier, A., Steidl, S., Christlein, V., & Hornegger, J. (Eds.).
 (2018). Medical imaging systems: An introductory guide.



(a) Longitudinal magnetization recovery

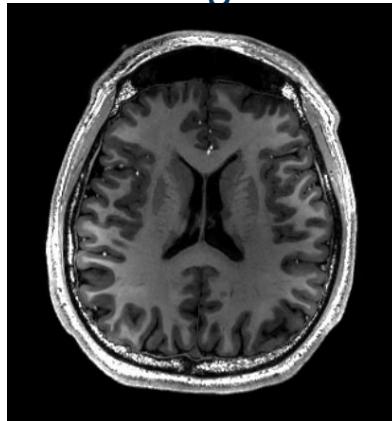
(b) Transverse magnetization decay



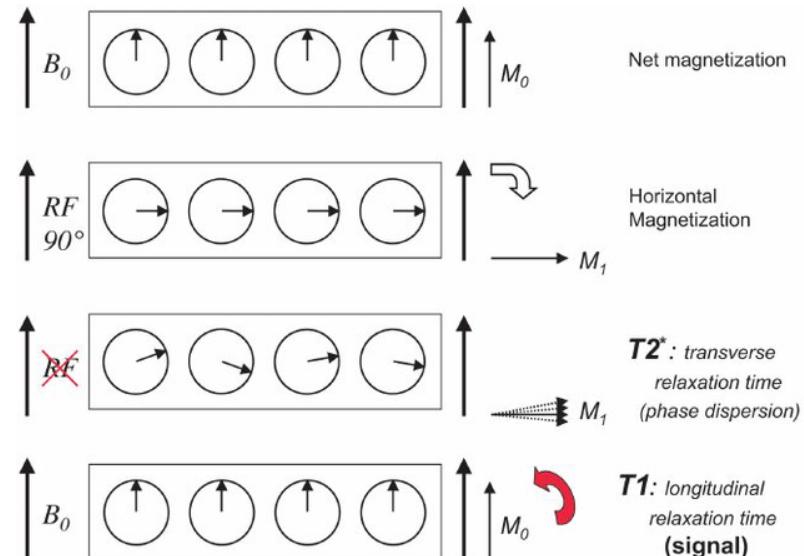
Sohn, S. M., DelaBarre, L., Gopinath, A., & Vaughan, J. T. (2014). RF head coil design with improved RF magnetic near-fields uniformity for magnetic resonance imaging (MRI) systems. *IEEE transactions on microwave theory and techniques*, 62(8), 1784-1789.

Magnetic Resonance Imaging (MRI)- Simple Summary

- 1) Protons align in magnetic field of scanner
- 2) Protons are disturbed by radio waves (RF coil)
- 3) Protons re-align in magnetic field and emit energy via radiation (RF coil switched off)
- 4) Sensor detects the radiation emitted by the change of orientation of proton spins



https://en.wikipedia.org/wiki/Magnetic_resonance_imaging_of_the_brain#/media/File:MRI_of_Human_Brain.jpg



https://www.researchgate.net/publication/228686551_Principles_of_Functional_Magnetic_Resonance_Imaging_and_its_Applications_in_Cognitive_Neuroscience/figures?lo=1

Diffusion Tensor Imaging (MRI)

- Measure the motion of water contained in axons
- Used to unravel the wiring scheme of the brain (connectome)

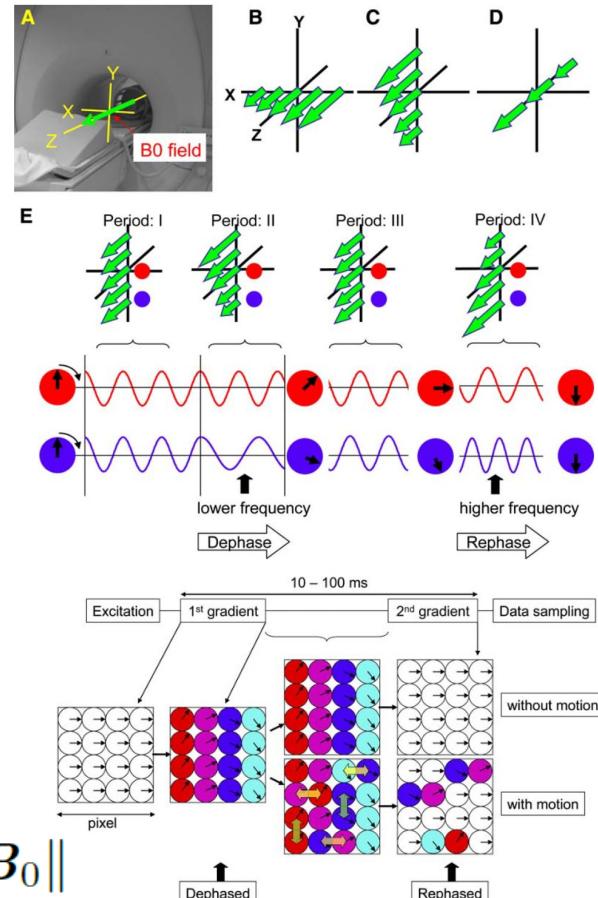
Idea (just an overview):

- 1) Change the precessing frequency (Larmor frequency) by magnetic field gradient -> dephase protons
- 2) Magnetic field gradient in opposite direction -> rephase protons (only if they did not move) -> signal change shows movement of protons
- Diffusion of water in brain is not isotropic because myelinated axons restrict the diffusion of water

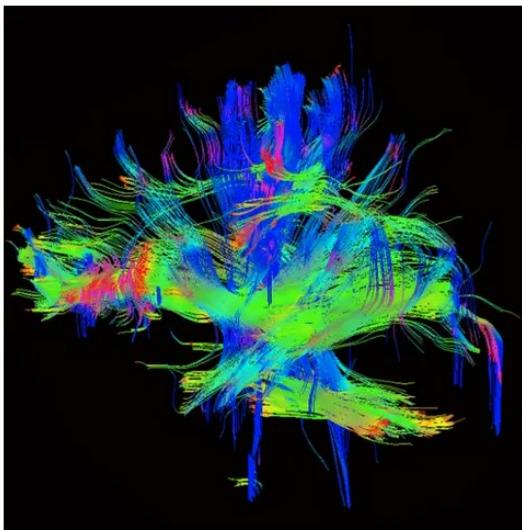
Mori, S., & Zhang, J. (2006). Principles of diffusion tensor imaging and its applications to basic neuroscience research. *Neuron*, 51(5), 527-539.

O'Donnell, L. J., & Westin, C. F. (2011). An introduction to diffusion tensor image analysis. *Neurosurgery Clinics*, 22(2), 185-196.

$$f_{\ell} = \gamma \cdot \|B_0\|$$



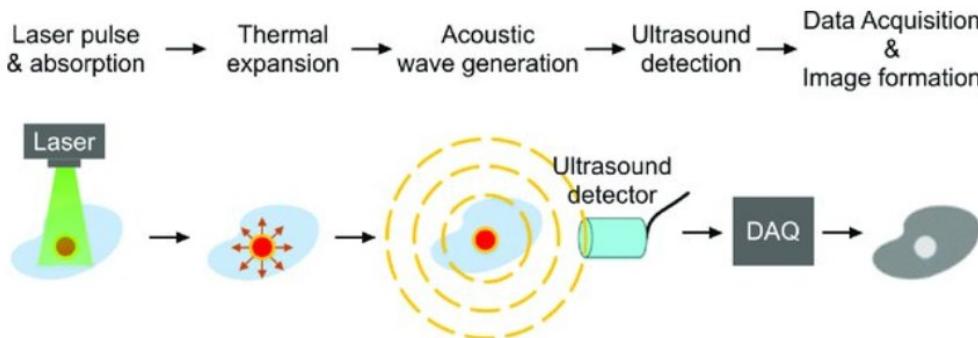
Diffusion Tensor Imaging (MRI)



- Calculate a 3D diffusion tensor
- Colors represent the direction of major eigen-vector of the diffusion tensor
- White matter tracts (including injuries) of brain can be shown

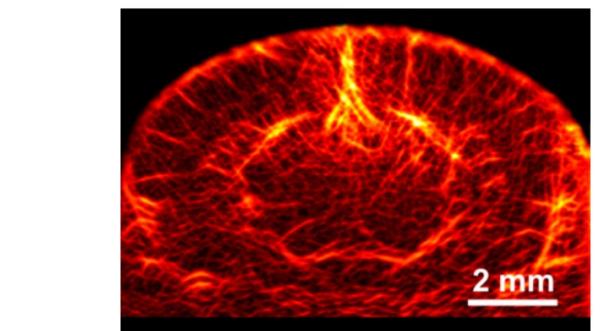
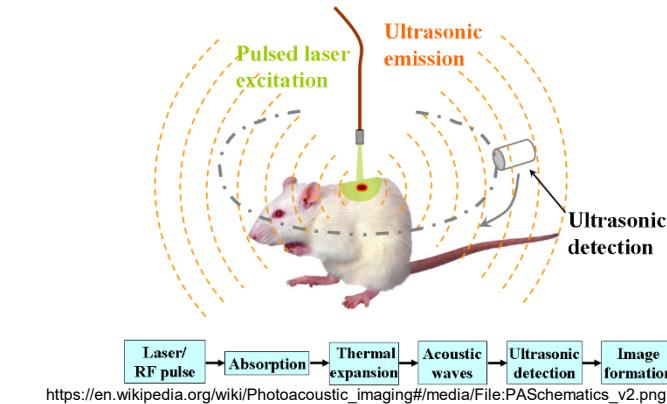
Photo-Acoustic Imaging (Opto-Acoustic Imaging)

- Absorption of laser pulse in tissue
- Thermal expansion -> sound wave
- Ultra-sound detector receives sound waves
- Could already be used to track brain function (blood flow etc.)



https://www.researchgate.net/publication/334706068_Review_of_Cost_Reduction_Methods_in_Photoacoustic_Computed_Tomography/figures?lo=1

Steinberg, I., Huland, D. M., Vermesh, O., Frostig, H. E., Tummers, W. S., & Gambhir, S. S. (2019). Photoacoustic clinical imaging. *Photoacoustics*, 14, 77-98.



Zhang, P., Li, L., Lin, L., Hu, P., Shi, J., He, Y., ... & Wang, L. V. (2018). High-resolution deep functional imaging of the whole mouse brain by photoacoustic computed tomography *in vivo*. *Journal of biophotonics*, 11(1), e201700024.

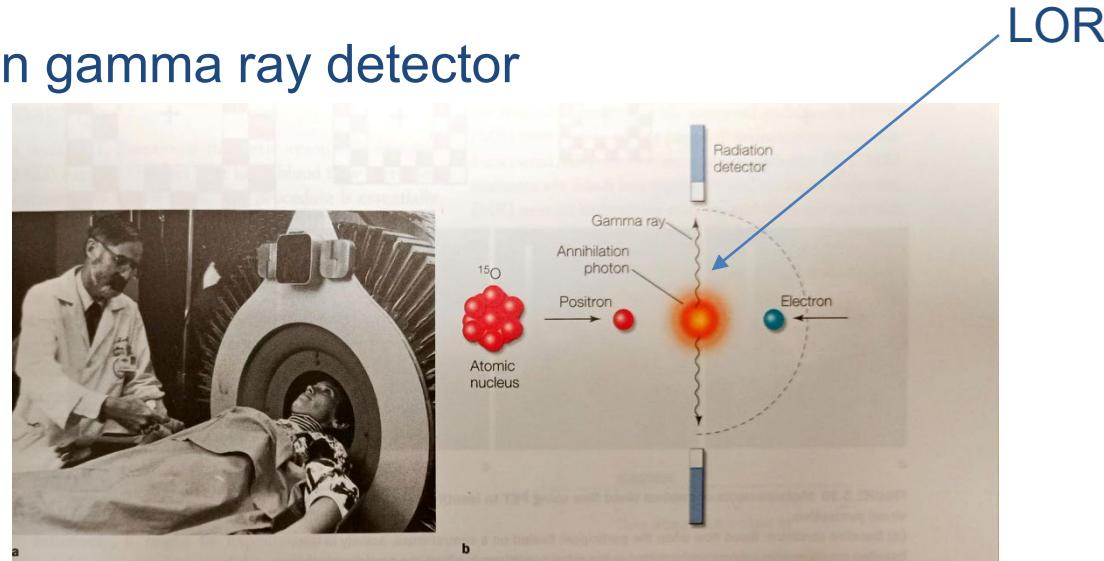
Methods to analyze Brain processes (function)

Methods used to investigate Brain Function

- EEG, MEG, Single Cell Recordings etc. -> electrophysiology lecture -> good temporal resolution but bad spatial resolution
- Positron Emission Tomography (PET)
- Functional Magnetic Resonance Imaging (fMRI)
- Functional Near Infrared Spectroscopy (fNIRS)

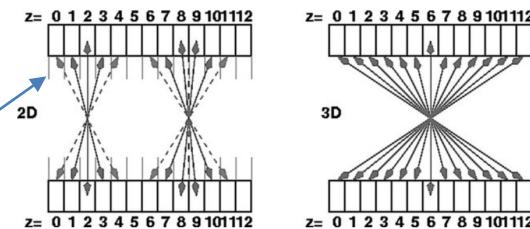
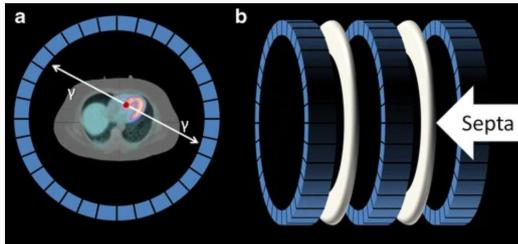
Positron Emission Tomography (PET)

- Measure local variations in cerebral blood flow
- Radioactive “tracer” is injected (^{15}O)-> decays and emits positron
- Positron annihilates with electron -> two photons (gamma rays) are produced
- Photons are measured in gamma ray detector
- LOR: Line of response



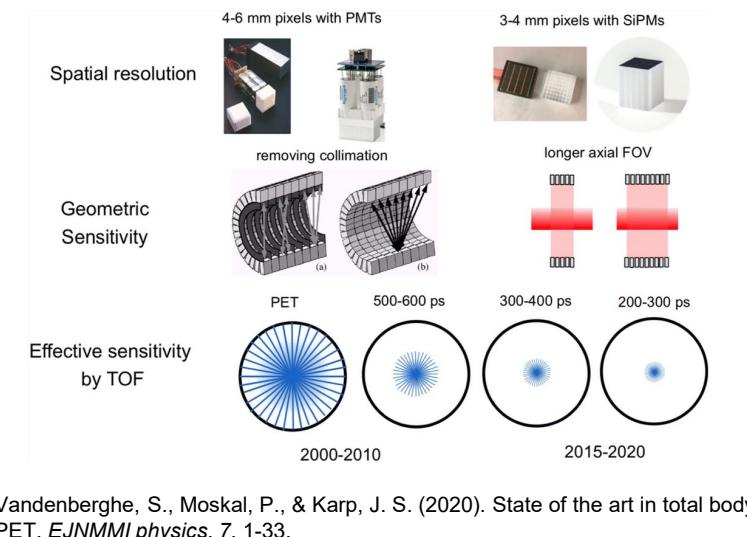
Positron Emission Tomography (PET): Reconstruction

- Better detectors were developed -> higher efficiency and better spatial resolution
- 2D->3D System -> coincidence events can be detected across several detector rings
- Time of flight analysis was introduced (TOF) -> Where did event occur along the LOR



Boyden, T. F., & Murthy, V. L. (2014). Risk Stratification with Cardiac Rubidium-82 Positron Emission Tomography. *Current Cardiovascular Imaging Reports*, 7, 1-10.

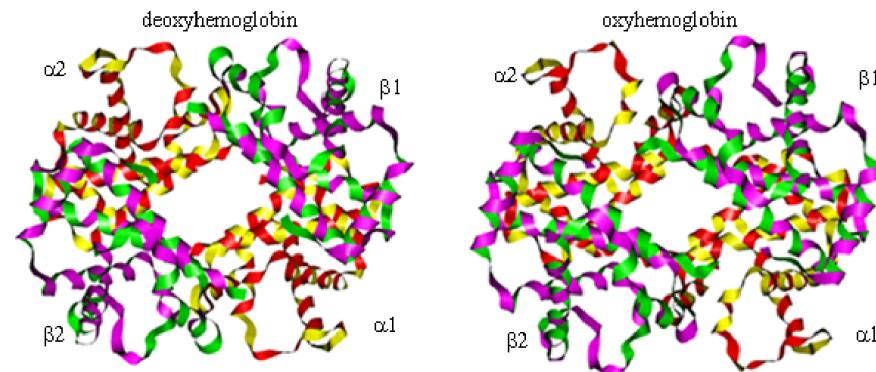
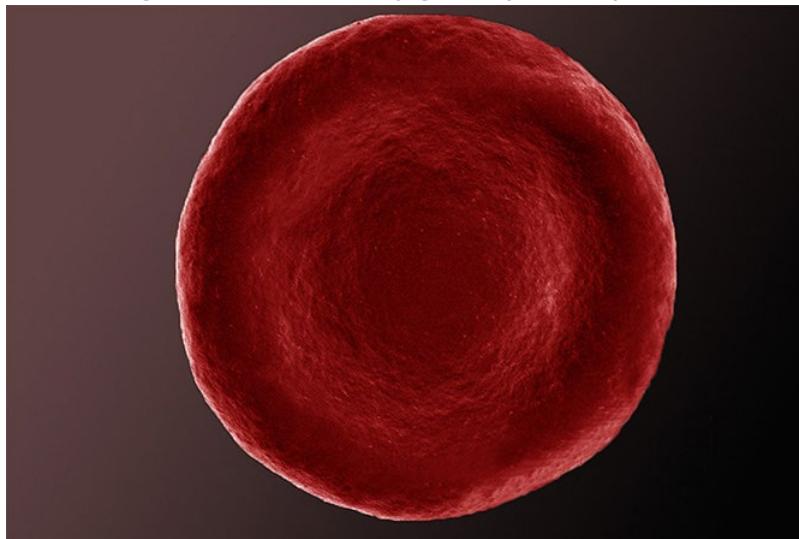
Volkow, N. D., Mullani, N. A., & Bendriem, B. (1988). Positron emission tomography instrumentation: an overview. *American journal of physiologic imaging*, 3(3), 142-153.



Vandenberge, S., Moskal, P., & Karp, J. S. (2020). State of the art in total body PET. *EJNMMI physics*, 7, 1-33.

Functional Magnetic Resonance Imaging (fMRI)

- Principle is similar as for MRI
- Exploits the magnetic properties of the blood pigment (hemoglobin) of the blood cells
- Hemoglobin transports oxygen in blood
- Hemoglobin with oxygen (HbO_2) and no oxygen (Hb)

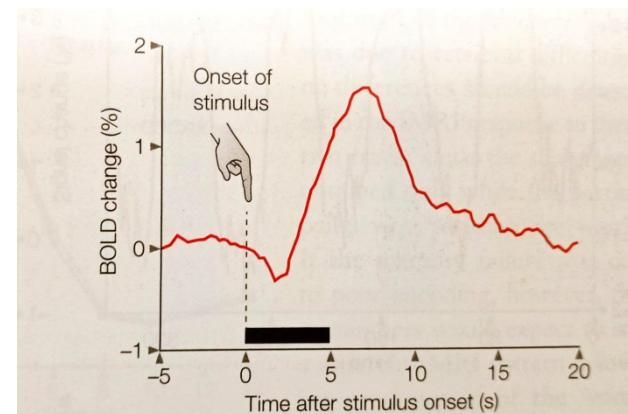
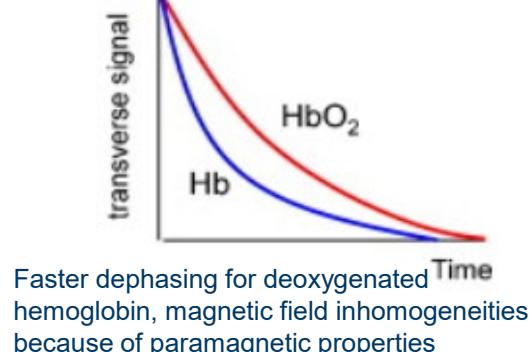
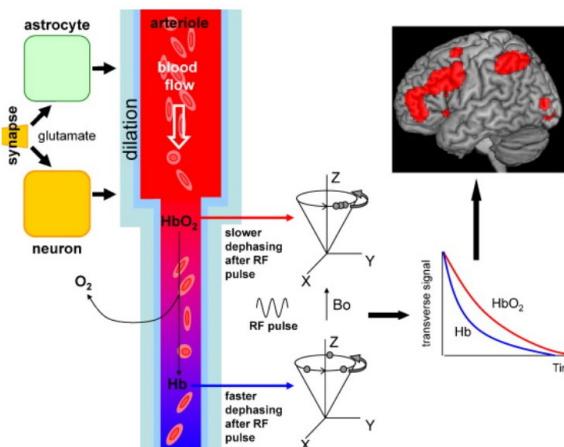


Meiyappan, S., Raghavan, R., Viswanathan, R., Yu, Y., & Lawton, W. (1999). Proteinmorphosis: A mechanical model for protein conformational changes. In *Biocomputing'99* (pp. 341-353).

<https://www.cell.com/pictureshow/erythrocytes>

Functional Magnetic Resonance Imaging (fMRI)

- Deoxygenated hemoglobin is paramagnetic oxygenated not
- Higher T2 value for oxygenated hemoglobin (transverse magnetization)
- Typical BOLD response:
 - Step 1) energy consumption (Hb)
 - Step 2) new oxygenated blood arrives (HbO_2)



Cognitive neuroscience, Gazzaniga, Ivry, Mangun, 2014

Harris, J. J., Reynell, C., & Attwell, D. (2011). The physiology of developmental changes in BOLD functional imaging signals. *Developmental cognitive neuroscience*, 1(3), 199-216.

Functional Magnetic Resonance Imaging (fMRI): Limitations

- Advantage: Has a good spatial resolution (~1mm)
- Disadvantages: Metabolic Signal (blood oxygenation), bad temporal resolution
- -> difficult to do experiments with fast occurring stimuli such as speech
- Some approaches exist to use fMRI for research on language processing -> it is necessary to carefully consider the limitations of that technique

www.nature.com/scientificdata

scientific data

OPEN

DATA DESCRIPTOR

A natural language fMRI dataset for voxelwise encoding models

Amanda LeBel¹, Lauren Wagner², Shalée Jain², Aneesh Adhikari-Desai^{2,4}, Bhavin Gupta², Allyson Mergenthaler¹, Jerry Tang², Lixiang Xu⁵ & Alexander G. Huth^{3,4} 

¹Max Planck Institute for Biological Cybernetics, Tübingen, Germany; ²University of California, Berkeley, CA, USA; ³University of Texas at Austin, TX, USA; ⁴University of Texas at Austin, TX, USA; ⁵University of Southern California, Los Angeles, CA, USA

articles

Neurophysiological investigation of the basis of the fMRI signal

Nikos K. Logothetis, Jon Pauls, Mark Augath, Torsten Trinath & Axel Oeltermann

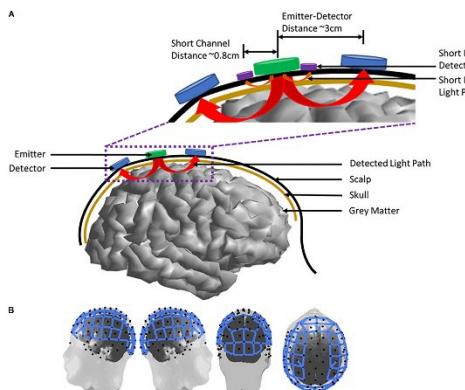
Max Planck Institute for Biological Cybernetics, Spemannstrasse 38, 72076 Tuebingen, Germany

Control experiments:

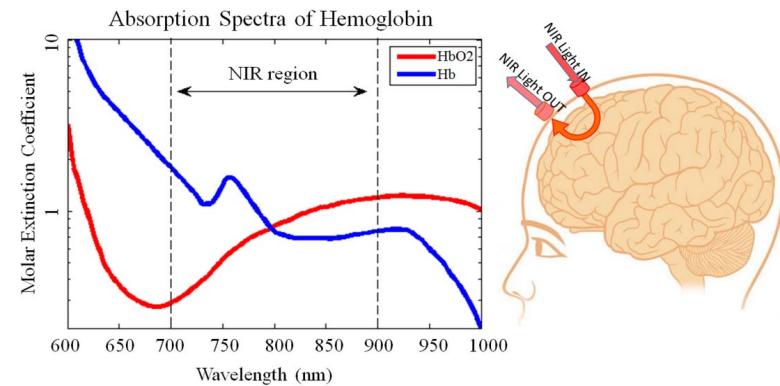
- Combined Intracranial recordings and fMRI
- fMRI reflects well the overall activity of the neurons
- Low-passed filtered version of it

Functional Near Infrared Spectroscopy (fNIRS):

- Measures also the fraction of oxygenated and deoxygenated hemoglobin -> not via magnetic properties
- Infrared emitter shines near infrared light (700 nm-900nm) through the skull which is refracted at brain
- Skull and skin is transparent for this wavelengths
- Light is absorbed by hemoglobin depending on oxygenation



Chen, W. L., Wagner, J., Heugel, N., Sugar, J., Lee, Y. W., Conant, L., ... & Whelan, H. T. (2020). Functional near-infrared spectroscopy and its clinical application in the field of neuroscience: advances and future directions. *Frontiers in neuroscience*, 14, 724.



Abtahi, M., Amiri, A. M., Byrd, D., & Mankodiya, K. (2017, April). Hand motion detection in fNIRS neuroimaging data. In *Healthcare* (Vol. 5, No. 2, p. 20). MDPI.

Conclusion

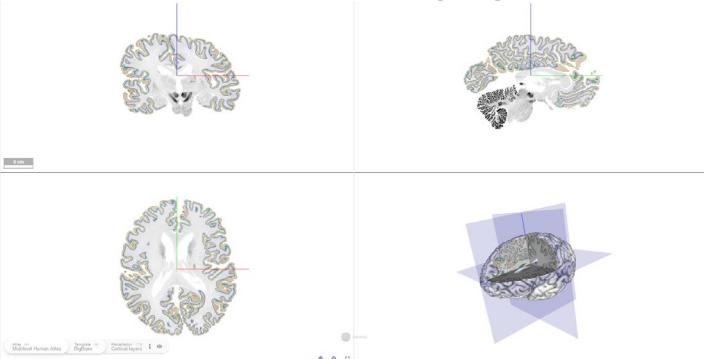
Feature	EEG	MEG	ECoG	Intracortical Recording	fMRI	fNIRS	PET
Activity type	Electrical	Magnetic	Electrical	Electrical	Metabolic	Metabolic	Metabolic
Measurement type	Direct	Direct	Direct	Direct	Indirect	Indirect	Indirect
Invasiveness	Non-invasive	Non-invasive	Invasive	Invasive	Non-invasive	Non-invasive	Invasive
Portability	Yes	No	Yes	Yes	No	Yes	No
Temporal resolution	~ 0.05 s	~ 0.05 s	~ 0.003 s	~ 0.003 s	~ 1 s	~ 1 s	1–2 min
Spatial resolution	~ 10 mm	~ 5 mm	~ 1 mm	~ 0.5 mm (LFP) ~ 0.1 mm (MUA) ~ 0.05 mm (SUA)	~ 1 mm	~ 5 mm	~ 4 mm
BCI applicability	Acceptable spatio-temporal resolution with high-density electrodes	Mobility constraint	Unfavorable for healthy BCI users	Unfavorable for healthy BCI users	Slow and mobility constraint	Slow, but mobile and a potential alternative to fMRI	Limited potentiality

EEG, electroencephalography; MEG, magnetoencephalography; ECoG, electrocorticography; fMRI, functional magnetic resonance imaging; fNIRS, functional near infrared spectroscopy; PET, positron emission tomography.

Saha, S., Mamun, K. A., Ahmed, K., Mostafa, R., Naik, G. R., Darvishi, S., ... & Baumert, M. (2021). Progress in brain computer interface: Challenges and opportunities. *Frontiers in Systems Neuroscience*, 15, 578875.

Essence of many different imaging techniques to from an open Brain Atlas

- Human Brain Project: EU Flagship Initiative -> brings together heterogeneous neuroscience data from different imaging techniques
- Provide information of cyto-architectonics and different neuroimaging techniques (e.g. DTI)



Bjerke, I. E., Øvsthus, M., Papp, E. A., Yates, S. C., Silvestri, L., Fiorilli, J., ... & Bjaalie, J. G. (2018). Data integration through brain atlasing: Human Brain Project tools and strategies. *European Psychiatry*, 50, 70-76.

EBRAINS

Data Brain atlases Modelling, simulation & computing Validation & inference Health research platforms

Reference atlases

- Get started
- | Human brain
- Monkey brain
- Rat brain
- Mouse brain
- Brain atlas resources

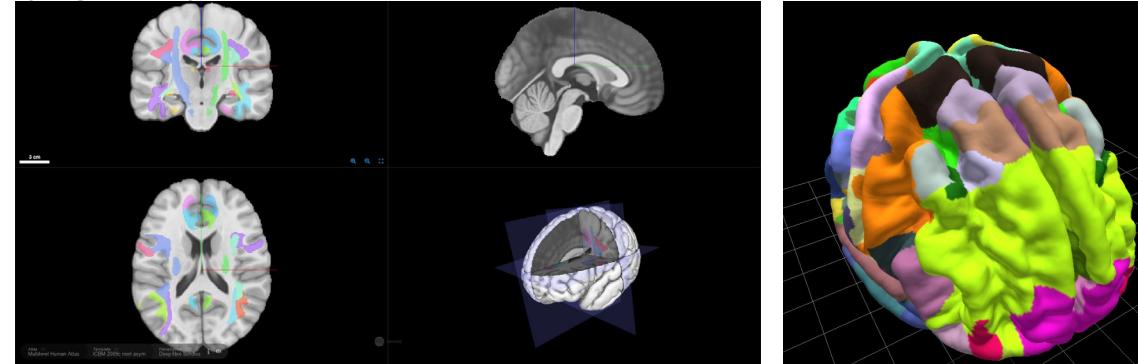
APIs

Data integration

Human Brain Atlas

Overview Resources

A detailed atlas of the human brain that integrates information on brain structure, function, and connectivity across multiple modalities and spatial scales.



<https://www.humanbrainproject.eu/en/science-development/focus-areas/brain-atlases/>