# Image Acquisition and Analysis in Neuroscience Winter Term 2025/26



# Chapter 1: Organization, Overview, Neuroanatomical Background

Prof. Dr.-Ing. Thomas Schultz

URL: http://cg.cs.uni-bonn.de/schultz/

E-Mail: <a href="mailto:schultz@cs.uni-bonn.de">schultz@cs.uni-bonn.de</a>

Office: Friedrich-Hirzebruch-Allee 6, Room 2.117



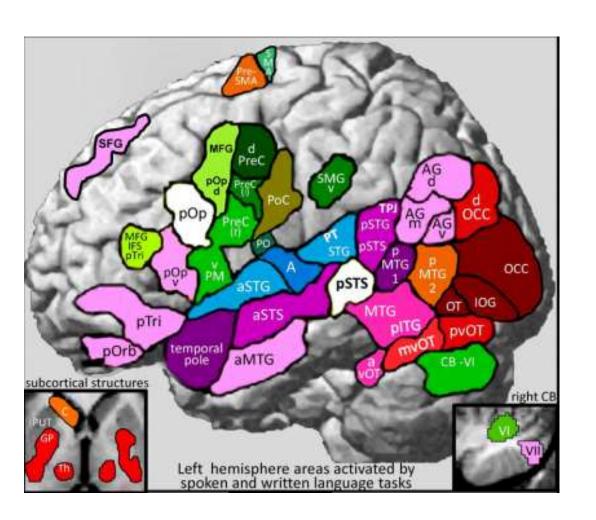
#### **1.1 Course Contents**

#### **Neuroimaging and Brain Function**



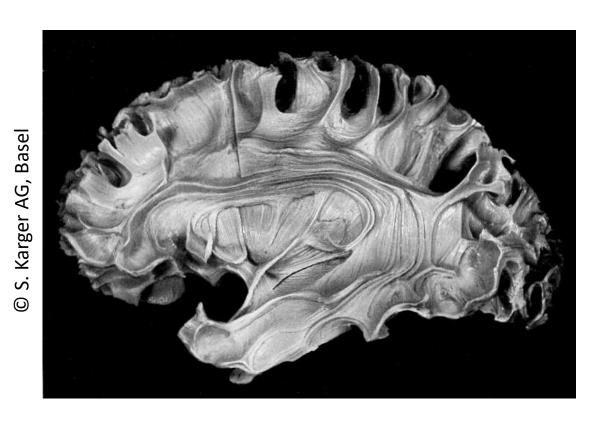
MR response to flashing visual stimulus

Red: Increased Blue: Decreased MR Signal



A detailed map of brain regions involved in understanding and producing language

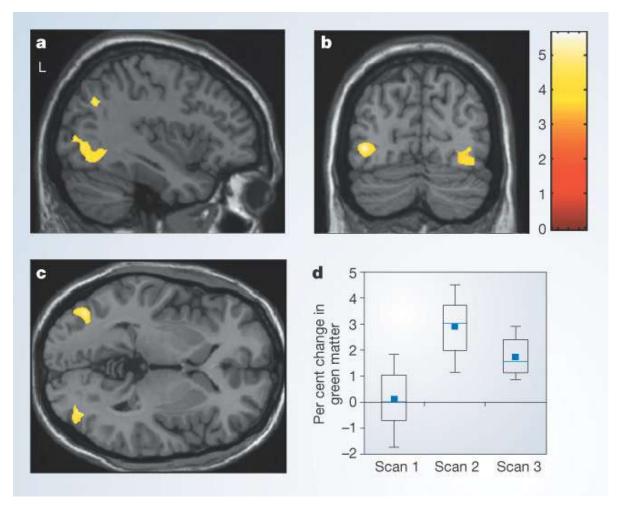
# **Neuroimaging and Brain Structure**



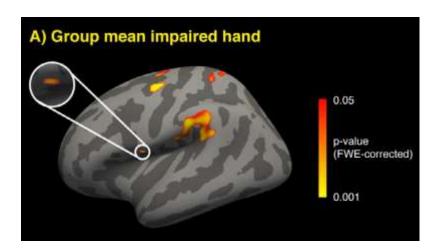
Photograph of a Klingler Dissection

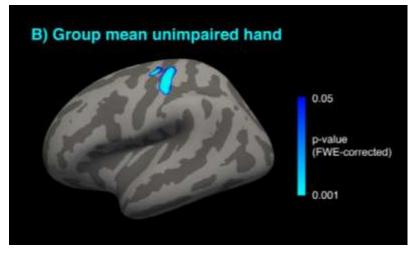
Tractography of my sister's brain

# **Neuroimaging and Plasticity / Learning**



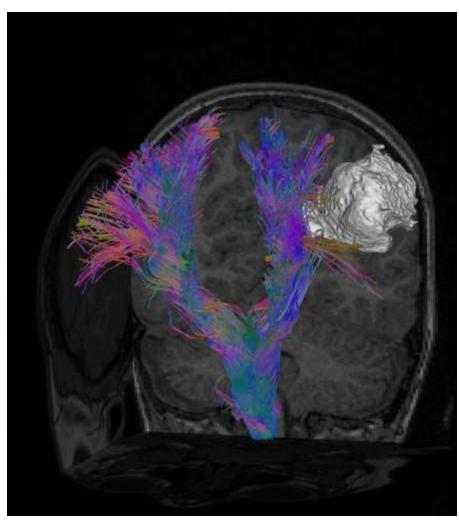
Gray matter increase when learning how to juggle



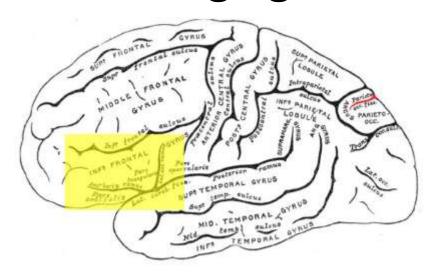


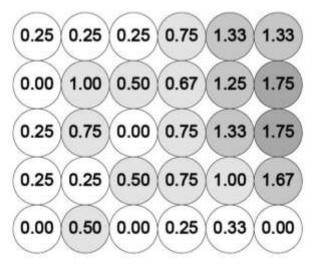
Motor areas in epilepsy patients after hemispherotomy

# **Clinical Applications of Neuroimaging**



Motor tracts in a tumor patient





Sample score for one subject

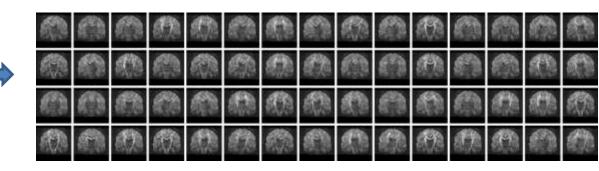
**TMS Results** 

#### **The Computational Neuroimaging Pipeline**

#### **Acquisition**

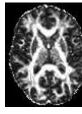


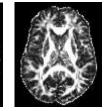




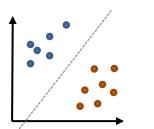


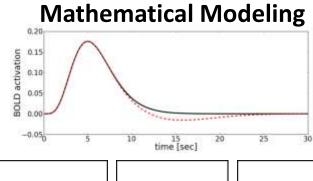


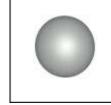




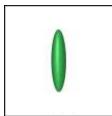
**Hypothesis Testing** 





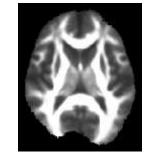






**Segmentation** 





**Atlas Construction** 

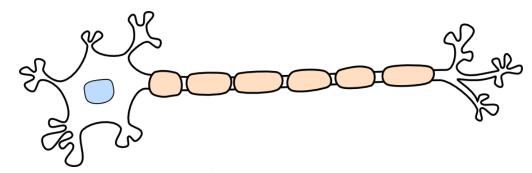
**Machine Learning** 

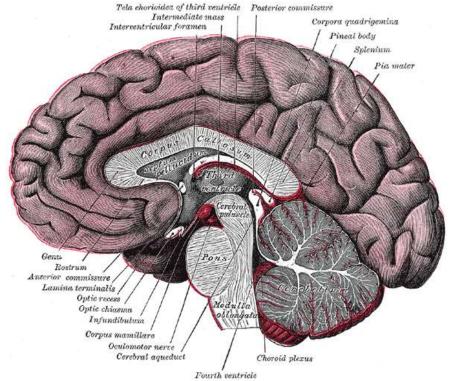
#### **Foundations of Neuroanatomy**

#### Today

- Structure and functional units of the brain
- From whole brain to cellular level



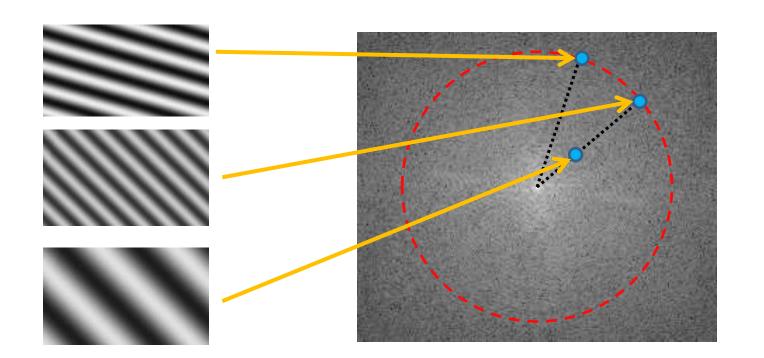


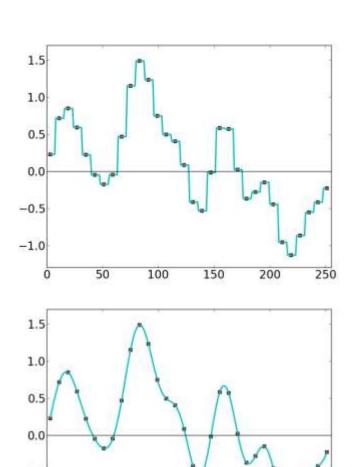


# Fourier Transform / Signal Processing

#### Thursday and next week

- Important Fourier theorems and intuition
- Sampling and reconstruction of (image) signals





100

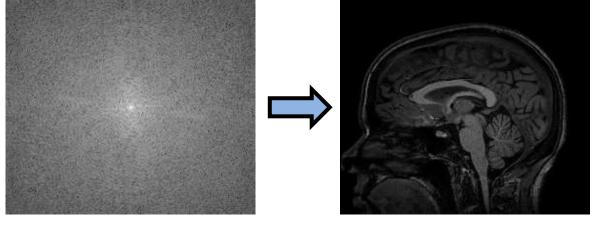
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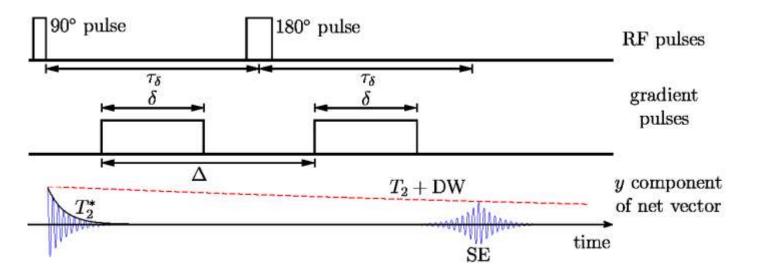
#### MR Acquisition and Reconstruction

#### Rest of October

- MR image formation and reconstruction
- Different types of contrast
- Artifacts



*k*-space Image space

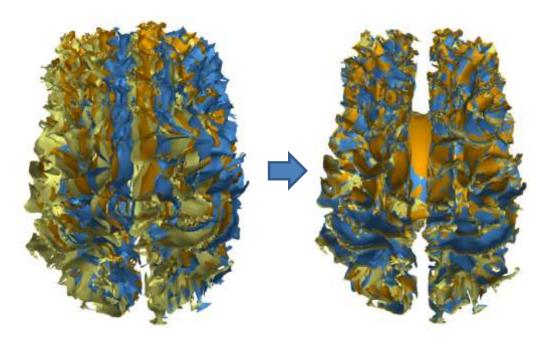


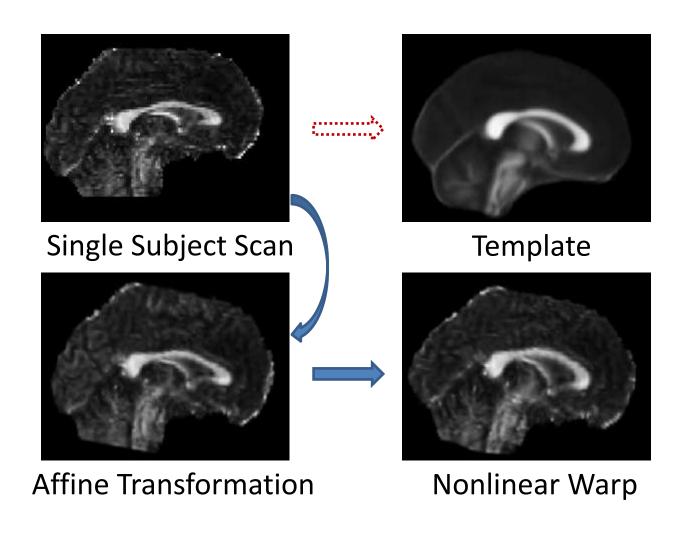


# **3D Image Registration**

#### First half of November

- Cost functions and their optimization
- Diffeomorphic registration
- Brain atlases

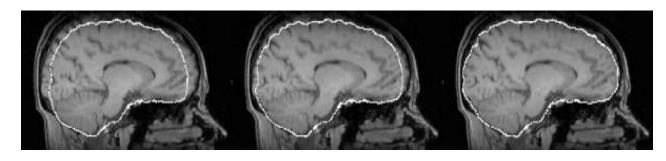




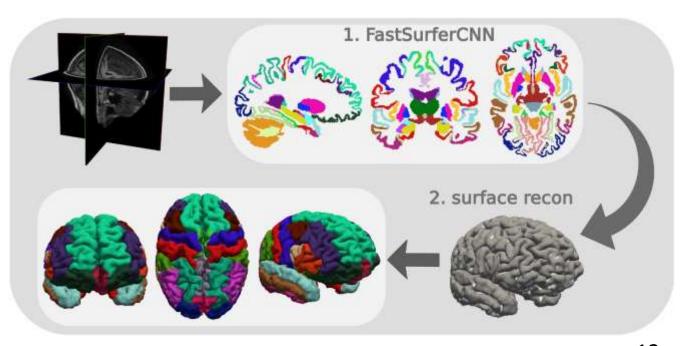
# **3D Image Segmentation**

#### November / December

- Brain extraction
- Tissue type segmentation
- Cortical surface parcellation
- Markov Random Fields
- Deep Learning
- Statistical inference in group studies



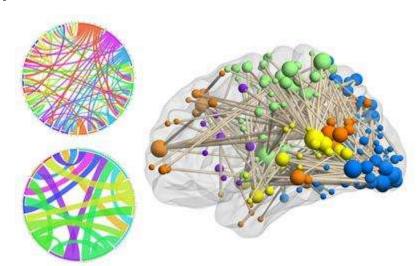
[Smith 2002]

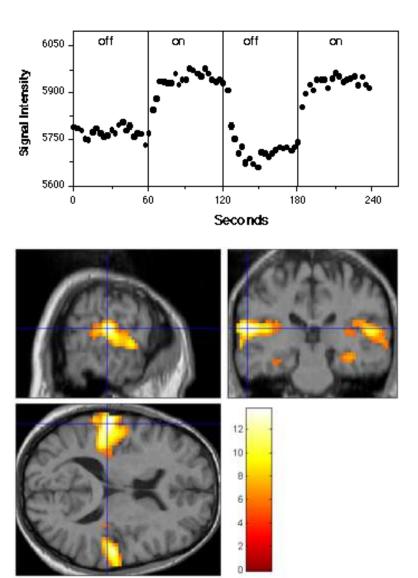


# **Analysis of Functional MRI (fMRI)**

#### December

- BOLD mechanism
- Mathematical modeling
- Image processing pipeline
- Statistical inference
- Graph models

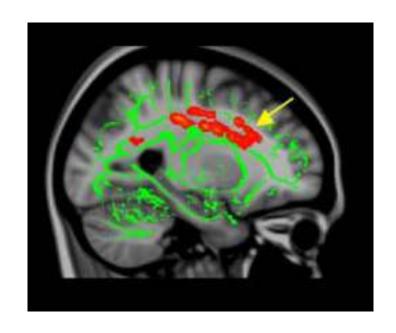


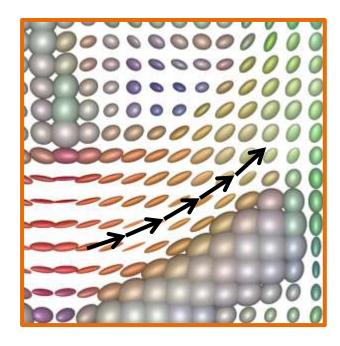


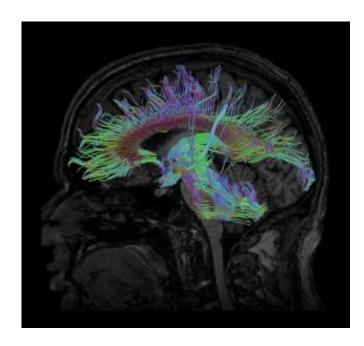
# **Analysis of Diffusion MRI (dMRI)**

#### January

- Measuring water self-diffusion to break MRI resolution limit
- Fiber tracking
- Quantitative analysis



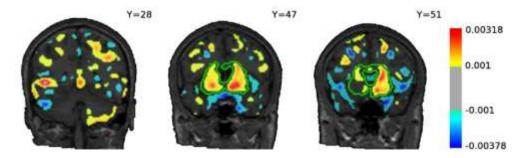




# **Supervised Classification and Regression**

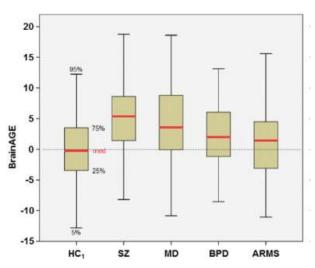
#### End of January

- Applications such as
  - Computer Aided Diagnosis
  - Estimating BrainAge



[Nieuwenhuis et al. 2012]

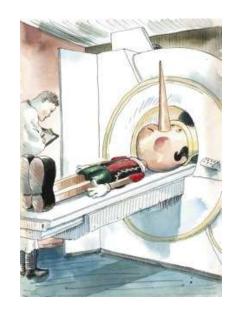
- Reconstructing images a subject looked at in the scanner
- Lie detection



[Koutsouleris et al., 2013]



[Takagi/Nishimoto, 2023]



New Yorker, 2007

#### Visit a Scanner!

• I am planning a visit at Theodor Rüber's lab at Life&Brain (UKB campus), including their MR scanner, during the lecture slot on

#### **February 2, 2026**





#### **Prerequisites**

- Basic mathematical background (calculus, linear algebra)
- Some programming background
  - We will use Python, which is easy to learn even if you don't know it
- Helpful if you already know about signal or image processing, machine learning, and/or statistics, but not required
  - All important facts explained in this lecture

# **Learning Goals**

- Learn about the computer science methods behind neuroimaging studies
  - Image processing, mathematical modeling, statistics, machine learning
- Ability to solve small problems in image analysis, to work in small teams and present your results
- Understand how neuroimaging results can (and cannot) be interpreted
- Prepare for a potential lab, seminar, MSc or even PhD thesis in the field

# 1.2 Organization

#### Lectures

- Lectures will take place
  - Mon 14:15-15:45 in HS 3 (Lecture Hall Building Campus Poppelsdorf)
  - Thu 14:15-15:45 in HS 3 (Lecture Hall Building Campus Poppelsdorf)
- As long as in-class participation remains sufficiently high, I am planning to make lecture recordings available
  - In case I should need to replace one or two live lectures with prerecorded videos, this will be announced in advance.
- Slides, assignments, forum via eCampus
  - Please sign up there as an attendee

#### **Exercises**

- 6 Exercises (mixed theory / programming)
  - You will have at least one week to work on them
  - Discussion will replace a lecture slot. Tentative dates:
    - 2025: Mon Nov 10, Thu Nov 20, Thu Dec 4, Mon Dec 15
    - 2026: Thu Jan 15, Mon Jan 26
- Please work in teams of 2-3
- Requirement for being admitted to the exam:
  - At least 50% of overall points
  - Presenting at least one answer in class

# **People**



Lecture:
 Prof. Dr. Thomas Schultz

 schultz@cs.uni-bonn.de



• Exercises:

Annika Mikliss

mikliss@cs.uni-bonn.de

#### **Credit**

- Based on exam at the end of the semester
  - If number of participants permits, it will be oral with flexible dates
- MSc students in Computer Science / Cyber Security at the University of Bonn will register via basis and receive 6 ECTS credits
- The class is cross-listed for MSc students in Media Informatics or HCIS (RWTH Aachen) with 6 ECTS credits
- Do we have any students from other programs?

# Advertisement: Lecture by Prof. Stöcker

- Our lecture includes a short introduction to MR physics
  - At a level that is appropriate for computer scientists
- Lecture by Prof. Tony Stöcker for MSc Physics goes into much more detail:
  - Physics in Medicine: Physics of Magnetic Resonance Imaging
  - Tue 10-12h, Thu 16-18h, SR I (Nußallee 14-16)
  - Find more details on basis

# 1.3 Foundations of Neuroanatomy

#### The Human Brain in Numbers

**Avg Volume:** 

1300 cm<sup>3</sup>



**Avg Mass:** 

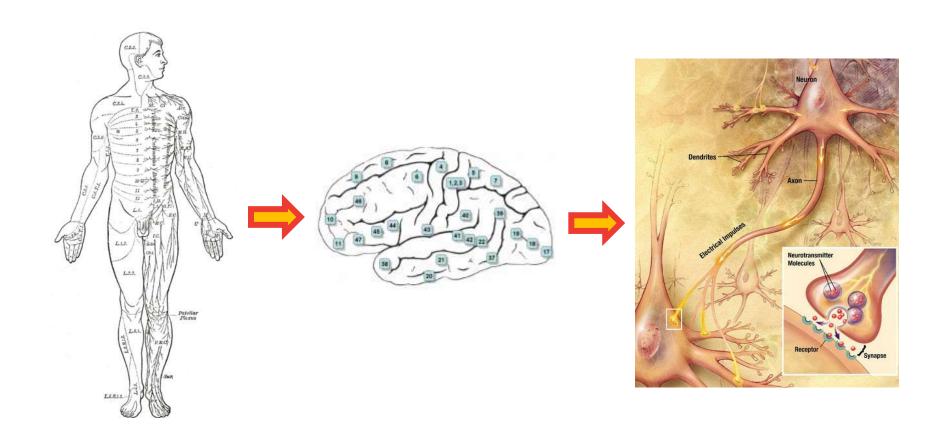
1.5 kg

Uses **up to 20%** of the body's energy supply

120 billion
neurons,
making ≈10<sup>14</sup>
connections

# A Top-Down Approach

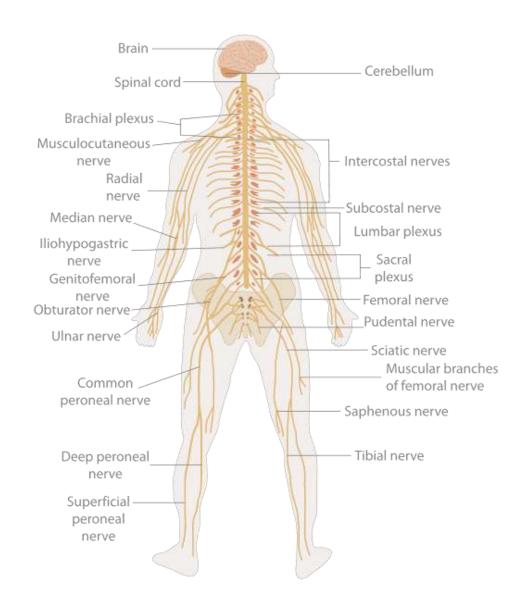
We will start by looking at the nervous system as a whole and work our way down to its individual cells



# The Nervous System

The nervous system has two main parts:

- Central Nervous System (CNS)
  - Brain
  - Spinal cord
- Peripheral Nervous System (PNS)
  - Sensory (afferent) and motor (efferent) neurons



# PNS: Somatic vs. Autonomic System

- **Somatic nervous system** (soma=body) innervates skin, muscles, and joints. It is responsible for transmitting their sensory stimuli and for their voluntary control.
- Autonomic nervous system receives information about the body's internal state. It innervates glands (Drüsen), viscera (innere Organe) and blood vessels, without voluntary control.

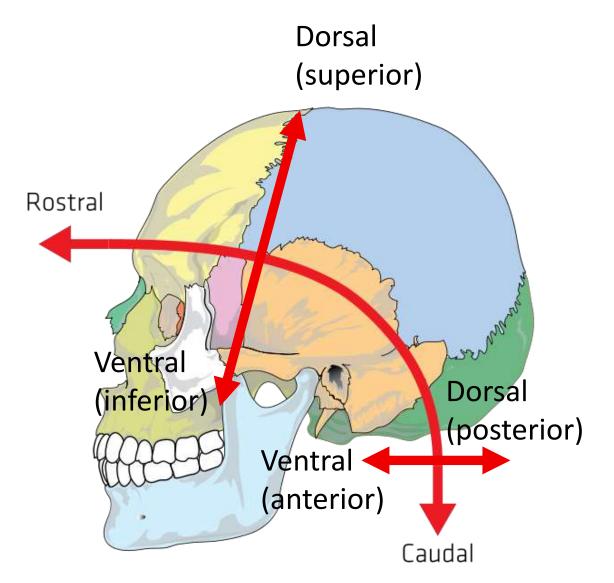
#### **Axes**

#### Anatomical axes in the head:

- left / right
- rostral / caudal
- dorsal / ventral

# More common in 3D imaging:

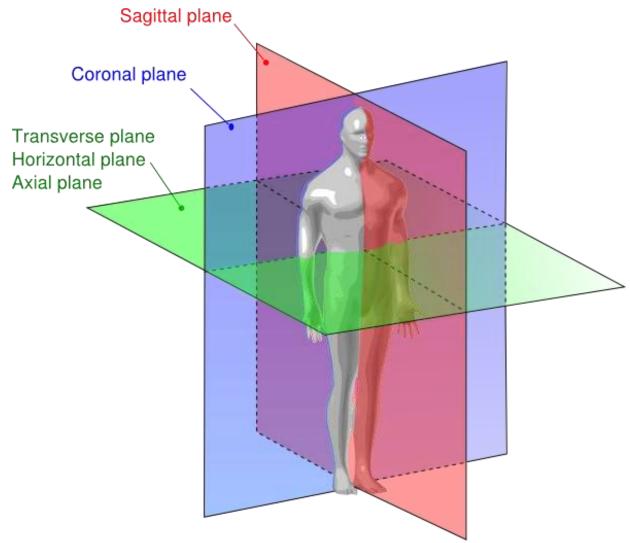
- anterior / posterior
- superior / inferior



#### **Planes**

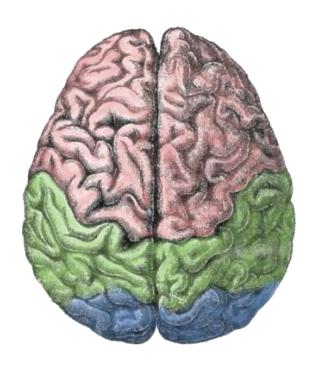
In MR imaging, the body planes commonly coincide with the following coordinate axes:

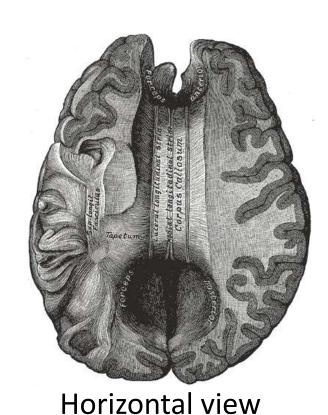
- Sagittal: yz
- Coronal: xz
- Axial: xy



#### Hemispheres

The longitudinal fissure subdivides the brain into left and right hemisphere, connected by the corpus callosum





Gents
Rostrum
Anterior commissure
Lamina terminalis
Optic chiaema
Infundibulum
Corpus mamillare
Oculomotor nerve
Cerebral aqueduct
Fourth ventricis

Tela chorioidea of third ventricle Posterior commissure

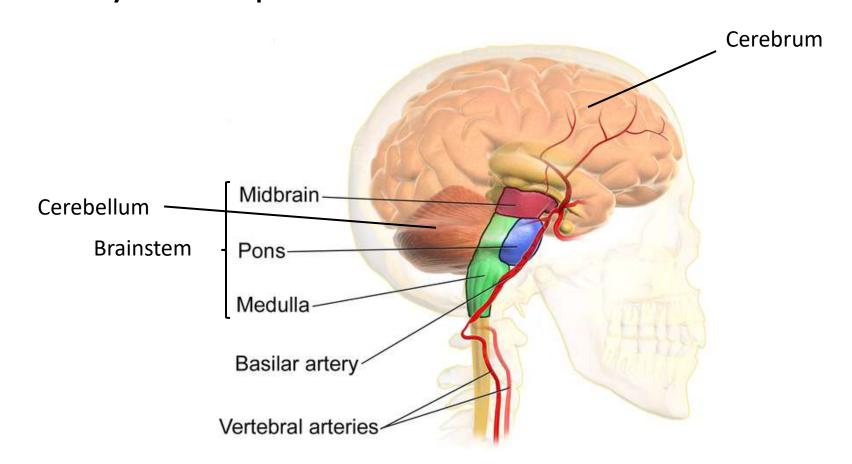
Corpora quadrigemina | Pineal body

Pia mater

Mid-sagittal view

# **Macroscopic Structure of the Brain**

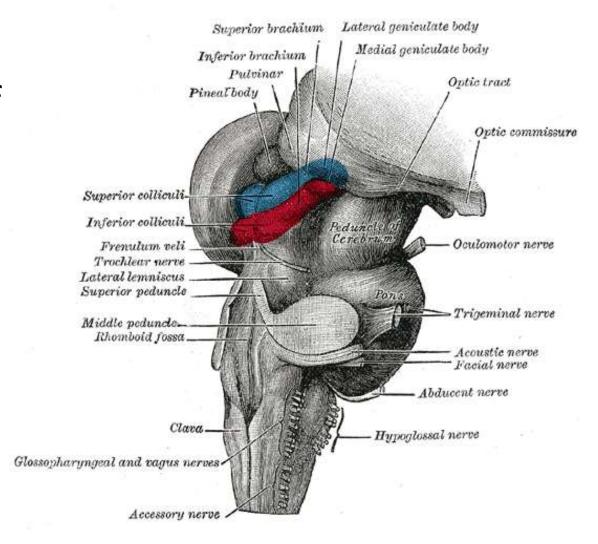
A macroscopic subdivision of the brain is made based on evolutionary development:



#### The Brainstem

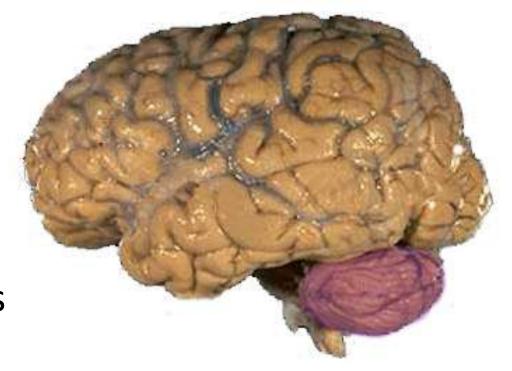
#### Oldest part of the brain

- Connects the brain to the rest of the body
  - Continuation of the spinal cord
  - Cranial nerves leave or enter (e.g., face/neck)
- Key role for control of respiration, blood pressure, heart rate
- Damage almost always life threatening



#### The Cerebellum

- Roughly 10% of the brain volume, but contains half of the neurons in the CNS
- Regulates motion by integrating information from motion and sensory systems
  - Posture, balance, coordination
- Also contributes to non-motor language skills, decision making, and emotion



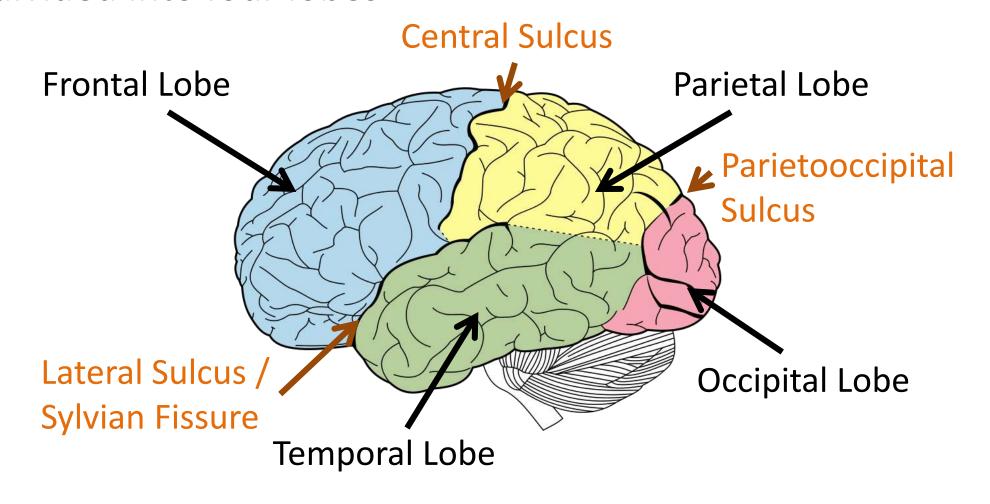
#### The Cerebrum

- High-level functions such as memory, attention, perceptual awareness, thought, language, and consciousness
- Consists of:
  - Cerebral Cortex
  - Hippocampal Formation
  - Amygdala
  - Basal Ganglia



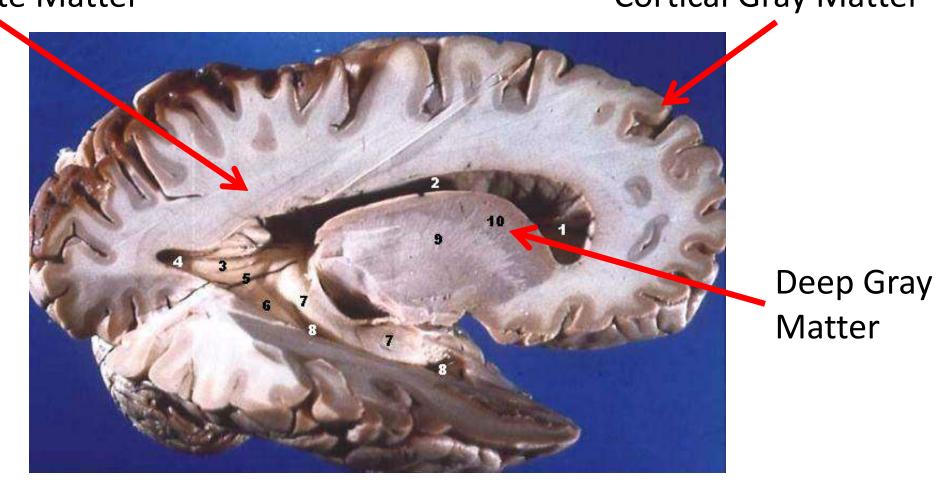
#### **Lobes of the Cerebrum**

Based on macroscopic landmarks, the cerebrum is further subdivided into four lobes



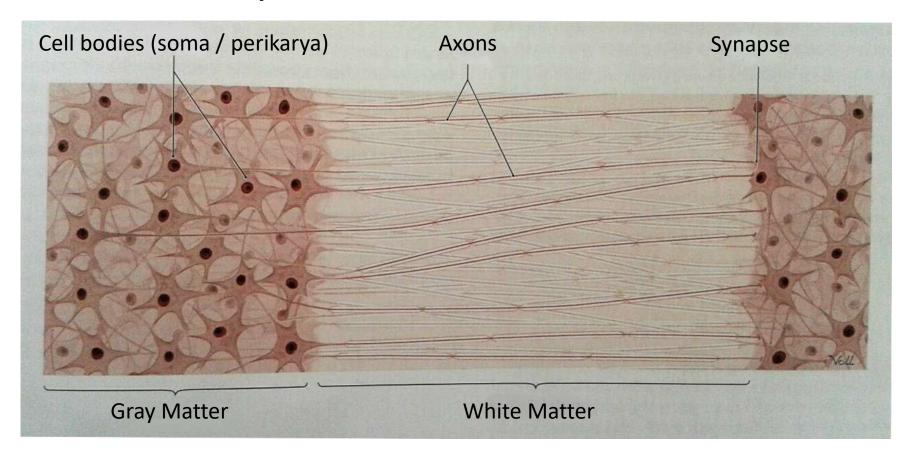
### **Gray Matter vs. White Matter**

In brain dissections, some parts appear gray, others look white
 White Matter
 Cortical Gray Matter



# **Gray vs. White: Histology**

- Gray matter mainly consists of the cell bodies
- White matter mainly consists of axons



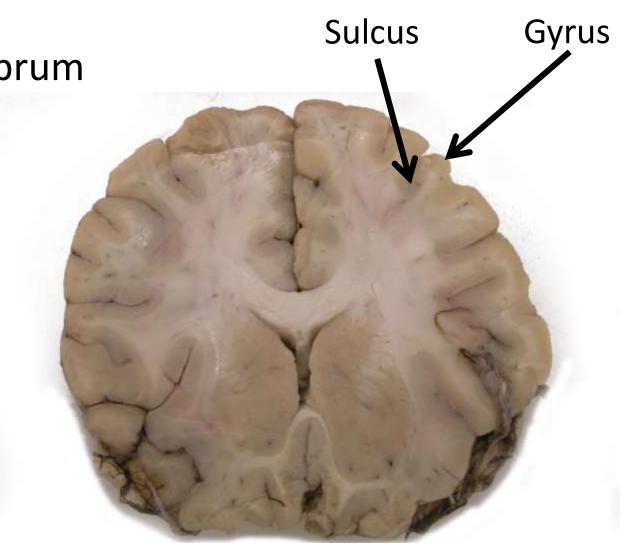
# [Rajalakshmi L Nair et al., 2006

#### The Cerebral Cortex

 Cortex = gray matter at the outermost part of the cerebrum

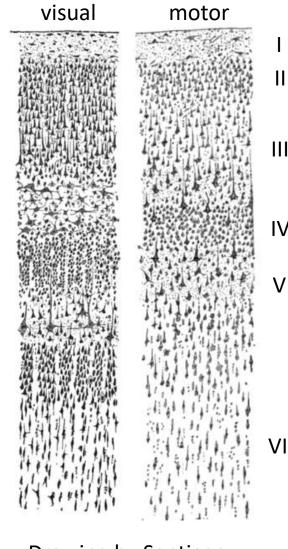
- Highly folded
  - Gyri (elevations)
  - Sulci (grooves)
- Thickness: 2-4 mm
- Area: 2500 cm<sup>2</sup>

≈4 A4 sheets



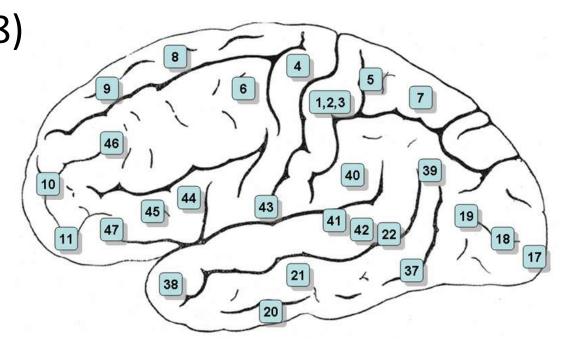
#### **Structure of the Cortex**

- Horizontal layers:
  - In 95% of the cortex (neocortex/ Isocortex), at least six layers
    - Differ in visual appearance and connectivity (e.g., input / output, brain region)
  - In remaining 5% (allocortex), less than six layers
- Vertical columns:
  - Based on overlapping input
  - Diameter: 200-800 μm



#### **Brodmann's Areas**

 Korbinian Brodmann (1868-1918) subdivided the cortex into more than 50 distinct areas, based on the neuronal layering



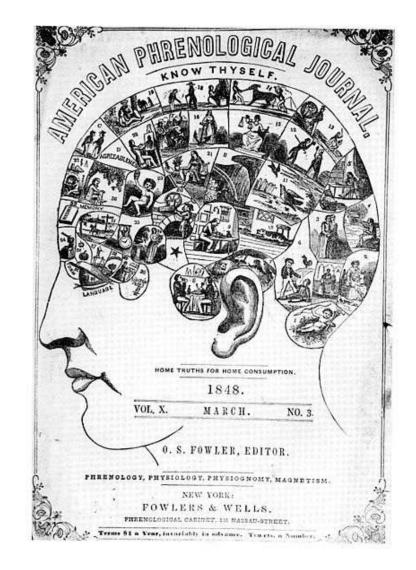
- Discussed and refined over time, still in use
- Many areas have been found to correspond to functional units

# **Functional Localization and Integration**

- Different parts of the brain specialize in different functions.
   This can be seen from:
  - Connectivity: Visual cortex receives input from eyes, motor cortex connects to the muscles etc.
  - Damage to local regions affects certain functions, but leaves others intact
  - Imaging methods that will be discussed in this lecture visualize which regions are "activated"
- **But:** The brain is highly connected, and complex functional networks that involve many regions are required for most non-trivial perception or behavior

# **Historical Note: Phrenology**

- Phrenology ("knowledge of the mind") is a pseudoscience developed by Franz Joseph Gall in 1796 and widely popular in the early 19<sup>th</sup> century
- Tried to correlate mental ability and traits of character with cranial shape, which was thought to reflect over- or underdeveloped brain regions
- Lost credibility in 1840s and induced great skepticism about functional localization in general



#### **Historical Note: Paul Broca and David Ferrier**

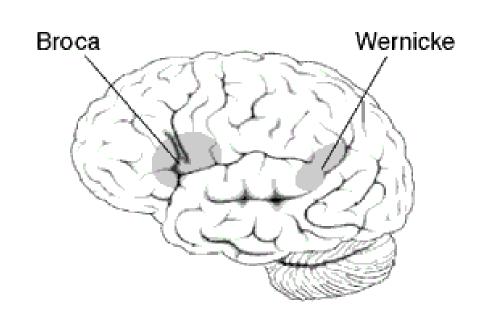
Two scientists were instrumental in restoring confidence in functional localization:

- **1861:** Paul Broca dissects the brain of a patient ("Monsieur Tan") with a specific and limited loss of speech production and a clearly circumscribed lesion
- **1881:** Working with macaque monkeys and dogs, David Ferrier demonstrates that specific behavior can be evoked by stimulation and destroyed by surgical lesions

#### **Broca's and Wernicke's Areas**

Two language-specific areas in the left hemisphere:

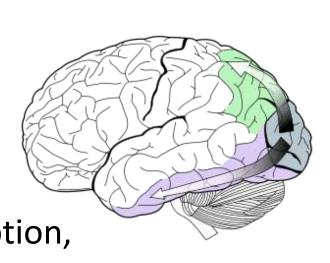
- Broca's area (Brodmann 44/45)
  - Important for producing speech
  - Injury leads to slow and halted speech
- Wernicke's area (Brodmann 22)
  - Important for understanding speech
  - Injury can lead to meaningless "word salad"
- Homotopic areas in right hemisphere relevant for emotional content of speech



#### **Visual Cortex**

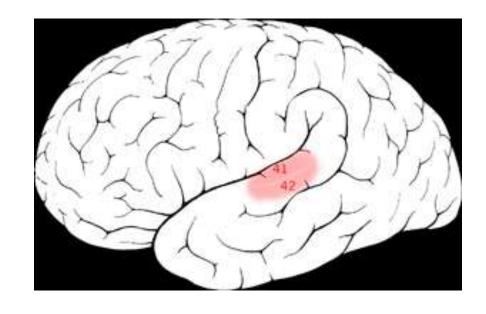
- Primary visual cortex in Brodmann area 17
- Contralateral response:
  - Right hemisphere receives input from left visual field

- Higher-level processing:
  - Dorsal stream ("where", fast, guides behavior)
  - Ventral stream ("what",
     slower, conscious perception,
     recognition, memory)



# **Auditory Cortex**

- Primary auditory cortex in Brodmann areas 41 and 42
- Strictly contralateral response in some mammals (e.g., rats), but not in humans; might be due to development of language

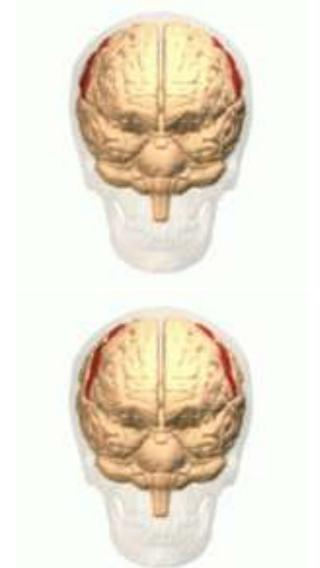


 Dorsal "where" and ventral "what" path similar to visual system

# Somatic Motor and Sensory Cortex matosensory cortex ouch pain and limb position) is in

# Primary somatosensory cortex (sense of touch, pain, and limb position) is in the postcentral gyrus (Brodmann 1/2/3)

• Primary motor cortex is in the precentral gyrus (Brodmann 4)

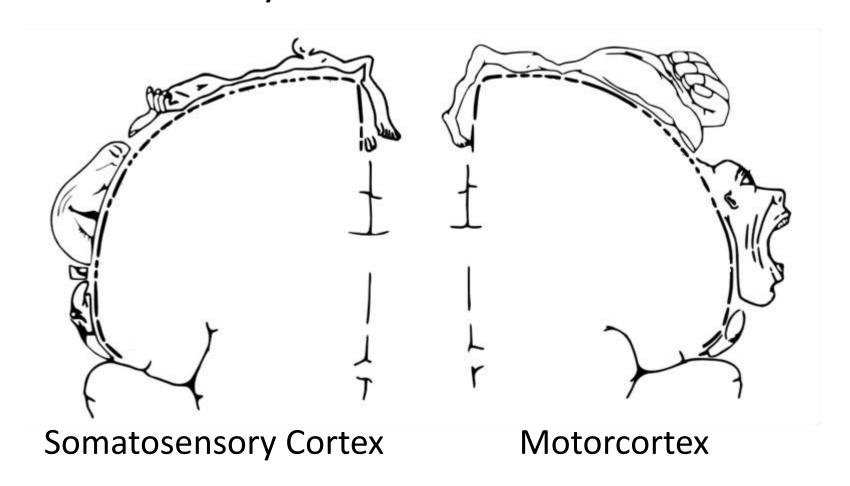


@ wikimedia commons

mage Source: Was a bee

#### The Homunculus

Different parts of the body are represented at different locations along the somatosensory or motor cortex

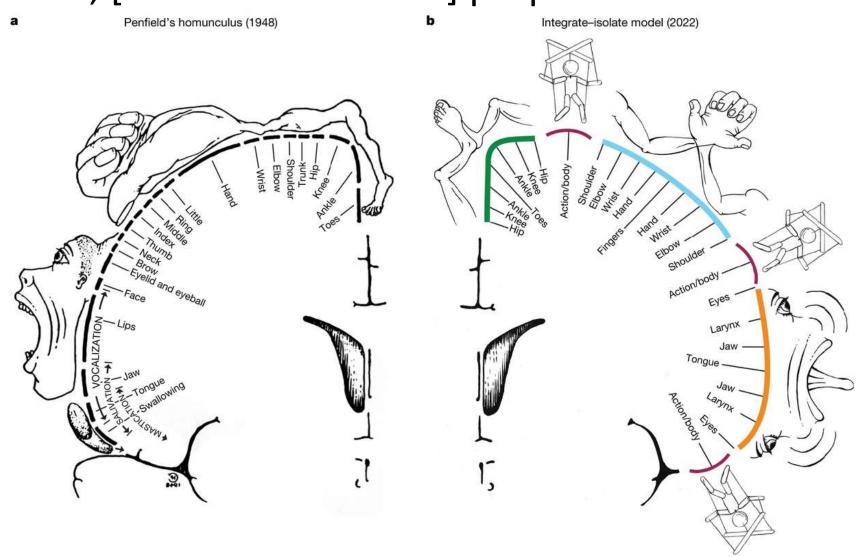


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# The Interrupted Homunculus

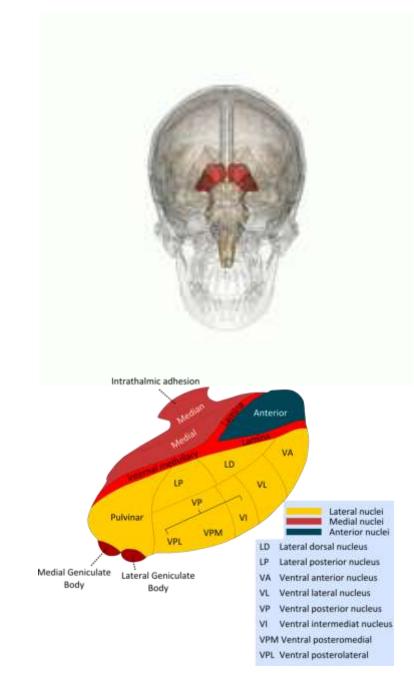
• Based on functional MRI, [Gordon et al. 2023] propose that

- the homunculus is interrupted by a somato-cognitive action network (SCAN)
- motor effector regions have a concentric organization

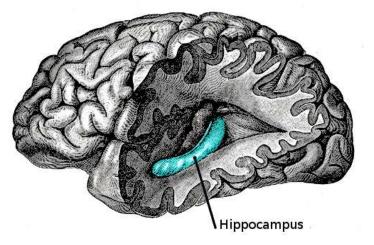


#### The Thalamus

- Deep gray matter structure
- Two halves, connected in the thalamic adhesion
- Consists of many small nuclei
  - Defined by separating laminae (myelinated axons) or cell architecture
- Serves as a relay for sensory input
  - Exception: Olfaction (sense of smell)
  - Also involved in some motor pathways
- Diffuse projections regulate cortical activity



# Hippocampus, Amygdala, Basal Ganglia

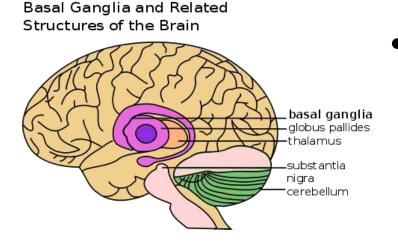


Hippocampus

 Plays a role in consolidating shortterm to long-term memory and in spatial navigation

### Amygdala

Plays a role in memory and emotions



- Basal Ganglia
  - Group of strongly connected nuclei
  - Role in procedural learning, forming of habits, action selection

#### White Matter Architecture

- White matter consists of elongated axons that transmit information between different parts of the brain
- Axons are organized in fiber bundles
  - Association Fibers: Within the same hemisphere
    - Short: Connecting adjacent gyri ("U-fibers")
    - Long: Connecting more distant parts
  - Commissural Fibers: Connect the hemispheres
  - Projection Fibers: Connect cortex with lower parts of the brain or the spinal cord

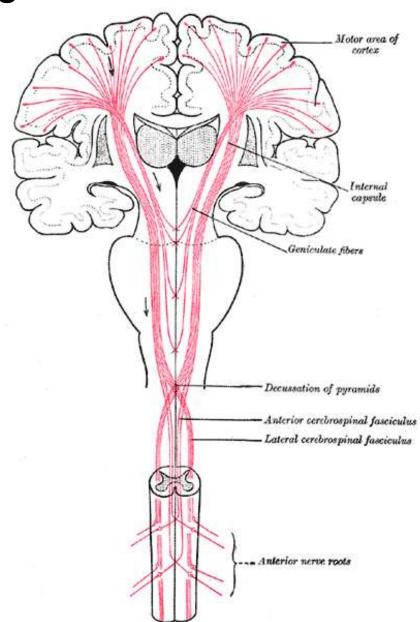
**Projection Fibers** 

#### • **Efferent:** Motor tract

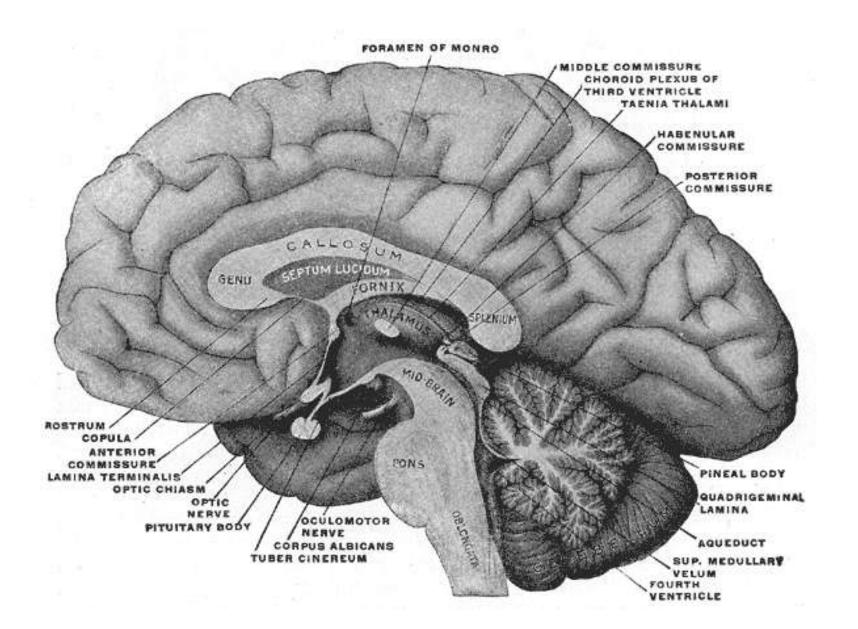
- Corticospinal fibers
- Geniculate fibers
- Corticopontine fibers

#### Afferent:

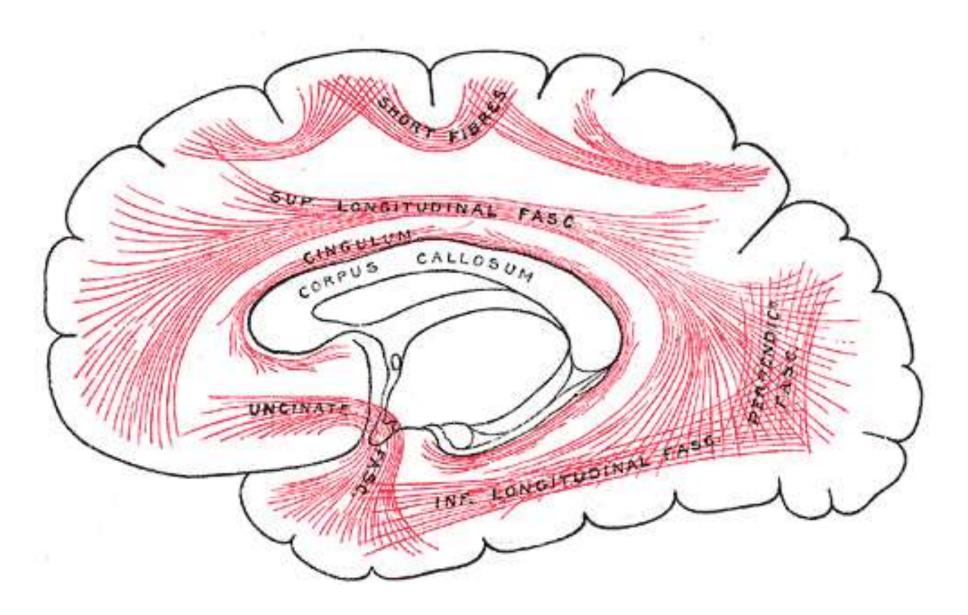
- Optic and acoustic tracts
- Superior cerebellar peduncle
- Thalamocortical tracts



#### **Commissural Fibers**

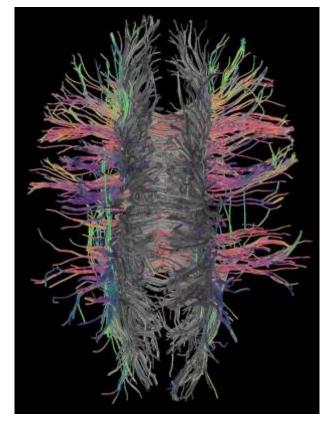


# **Association Fibers**



# **Studying the Connectome**

- Connectome = complete map of the connections in the human brain
- Even larger-scale than Genome  $(3x10^9 \text{ base pairs vs. } \approx 10^{14} \text{ synapses})$
- NIH Human Connectome Project
  - 1,200 healthy adults
  - Specific follow-up projects
- Rhineland Study (DZNE): Prospective study on healthy ageing, plans to follow up on more than 20,000 participants for decades

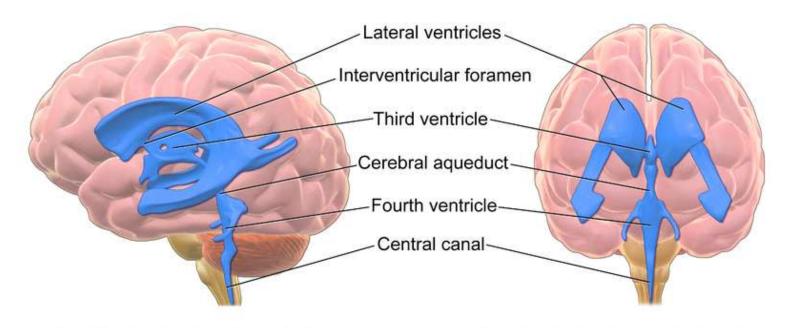


[Schultz/Seidel 2008]

# The Ventricular System

- Ventricles = system of cavities, filled with cerebrospinal fluid
- Continuous with central canal of spinal cord

#### Ventricles of the Brain



# Cells in the Nervous System

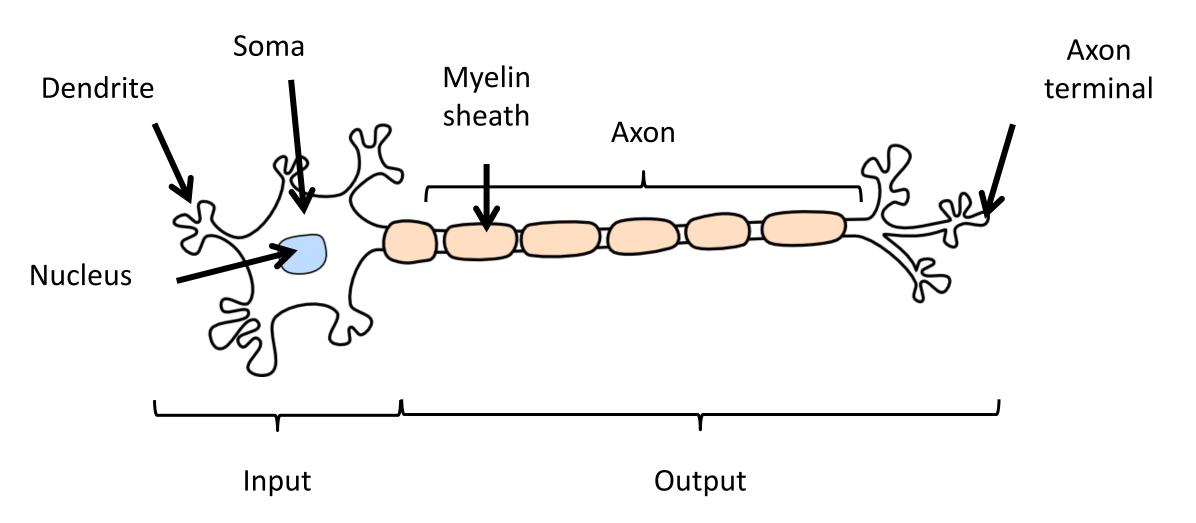
#### Neurons

- Receive, integrate, transmit information
- Operate through electrical impulses
- Communicate through chemical signals

#### Glia Cells

- Support neurons
  - structurally and by providing nutrients
  - Eliminate pathogens or dead cells, maintain homeostasis
- Form insulating myelin sheaths
- Ratio of glia cells to neurons varies across the brain

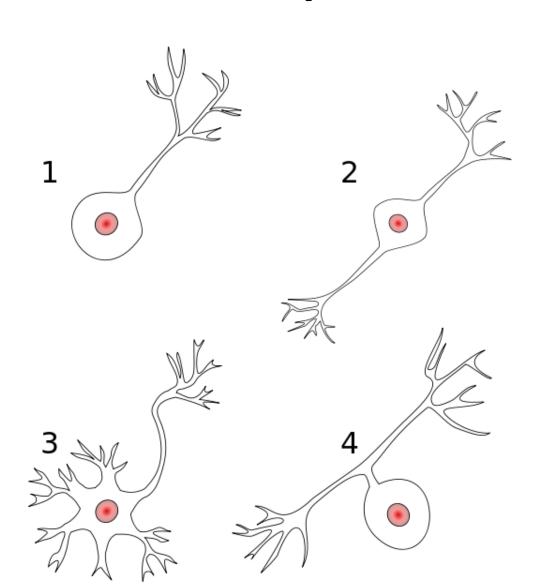
#### **Basic Structure of a Neuron**



# **Polarity**

Unipolar: Axon, but no dendrite; least common in the human NS

Multipolar: Single axon, multiple dendrites; interneurons or projection neurons



**Bipolar:** Axon and Dendrite; many sensory neurons

Pseudounipolar:
Occur in peripheral sensory system; act as a bipolar neuron

# **Special Types of Neurons**

#### Sensory Neuron

- Activated by sensory input
  - Sound, light, heat, physical contact
- The retina consists of brain tissue and is considered part of the central nervous system

#### Motorneuron (effector)

- Ends at a muscle and causes it to contract
- Single neuron can innervate multiple muscle fibers (forming a motor unit)
- Reflex: Coupling of sensory to motorneurons at the level of the spinal cord

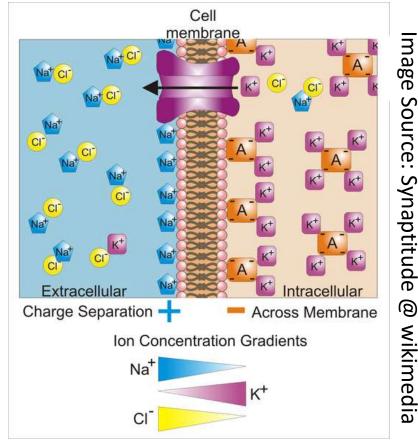
#### **Function of the Neuron**

 The basic function of a neuron is a spatiotemporal integration of its inputs, and a binary ("all-or-nothing") action potential as

an output

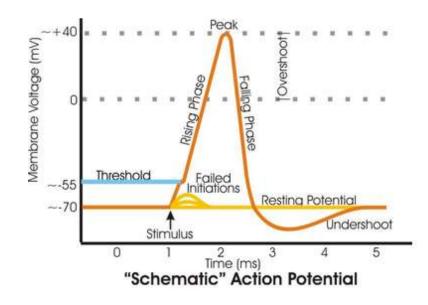
 Based on electrically charged ions within and outside the cell

 At the baseline, the semipermeable cell membrane leads to an unequal distribution of ions, and to a negative potential (-70mV) of intracellular compared to extracellular space



#### **Action Potential**

- Incoming activations can depolarize the membrane
  - At -55mV, voltage-gated ion channels open, and sodium flows into the cell, leading the membrane potential to quickly rise to +40mV

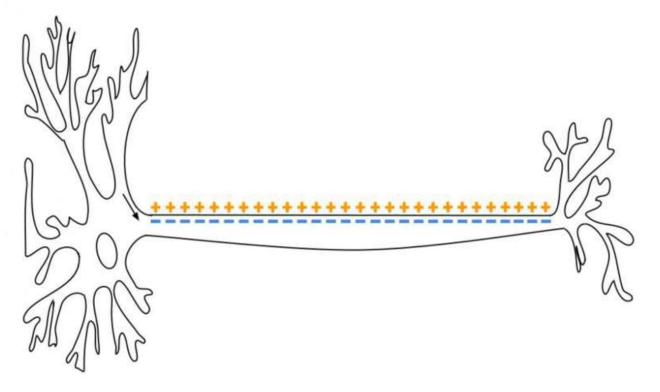


- Increased potential causes sodium channels to close again and potassium channels to open, leading to a rapid decrease and hyperpolarization
- It takes time for potassium channels to close and sodium channels to become active again, leading to a refractory period in which no further action potentials can take place

# lmage Source: Lauren Taylor

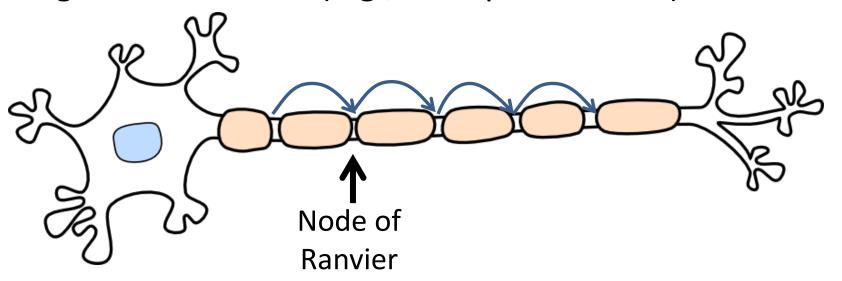
# **Action Potential Propagation**

- Action potentials originate at the axon hillock and travel along the axon
  - Refractory period prevents retrograde propagation



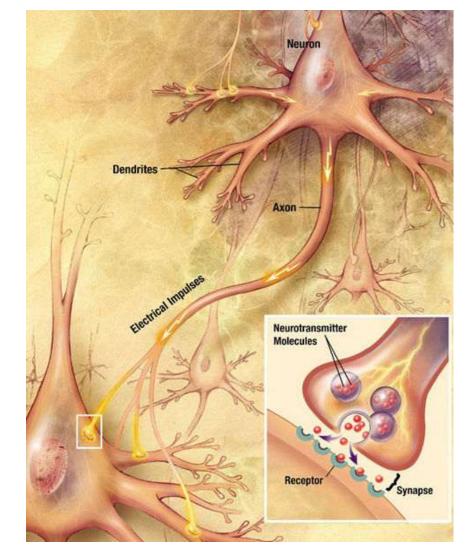
# Myelination

- Myelin acts as electrical insulation, leading to saltatory conduction
  - "Hopping" from one node of Ranvier to the next
  - Accelerates conduction by a factor of ≈10
  - Provided by Schwann cells (PNS), oligodendrocytes (CNS)
  - Generated during brain maturation, destroyed by some types of neurodegenerate disease (e.g., Multiple Sclerosis)



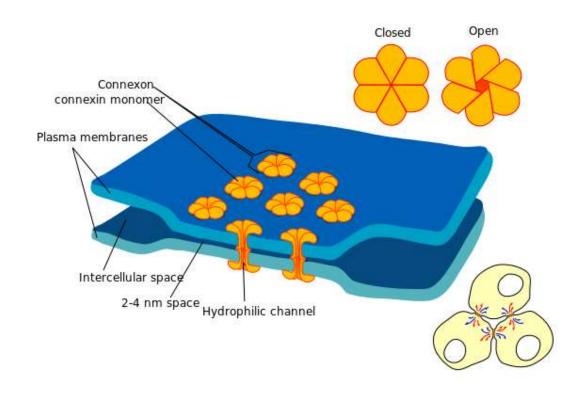
# **Synapses**

- Axons communicate across a short distance of extracellular space, the synaptic clef
  - A synapse is formed by the axon terminal of the pre-synaptic (transmitting) neuron and the dendrite of the post-synaptic (receiving) one
  - Communication across synapses is mostly by release of a chemical (neurotransmitter) whose release is triggered by a pre-synaptic action potential



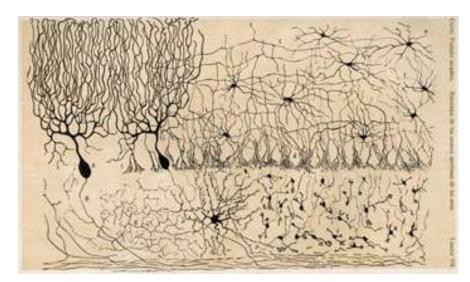
# **Gap Junctions**

- In the retina, some neurons are connected directly, through gap junctions
- Differences from chemical synapses:
  - Faster transmission
  - Always excitatory
  - Can work in either direction
  - ≈10x smaller gap

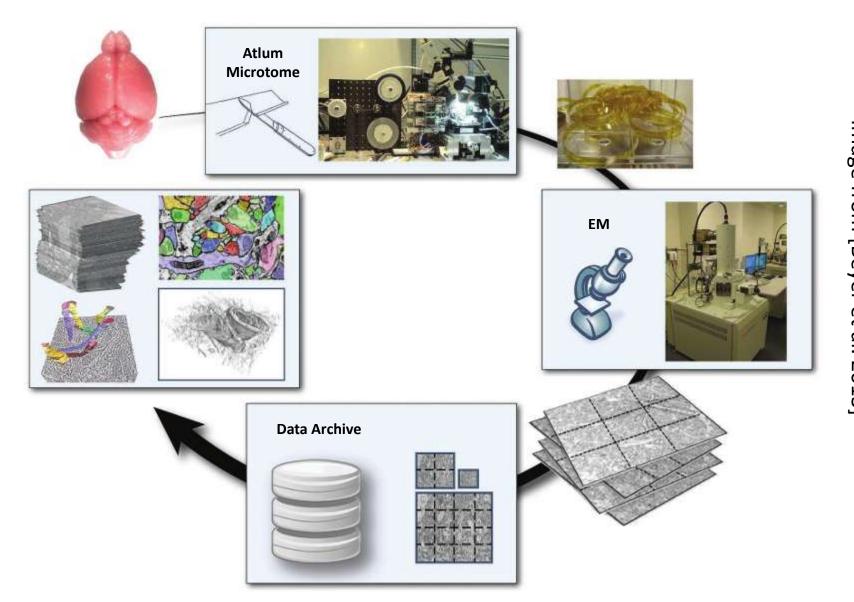


# **Historical Note: Discovering the Neuron**

- Historically, the brain was thought of as a syncytium, an assembly of cells that are in close and direct connection
- In 1839, Schwann and Schleiden first publish the idea that the central nervous system consists of distinct cells
- Stains developed by Camillo Golgi and Santiago Ramon y Cajal confirm this theory. They share the Nobel prize for physiology or medicine (1906)
- The term "neuron" is coined in 1891 by Heinrich Wilhelm Waldeyer



#### The Connectome at Cellular Level



lmage from [Beyer et al. 2013]

# **Summary: Neuroanatomy**

#### You should now understand:

- The basic structure of the nervous system
  - Central vs. peripheral
- The basic structure of the **brain** 
  - Macrostructure, e.g., brainstem vs. cerebellum vs. cerebrum, cortical lobes
  - Basic function of some parts of the brain
  - Gray matter vs. white matter
  - Structure of the cortex
- Morphology and function of individual neurons

# **Further Reading**

- John H. Martin: Neuroanatomy Text and Atlas. 4<sup>th</sup> edition, McGraw Hill, 2012
- Stanley Finger: *Minds behind the brain. A history of the pioneers and their discoveries.* Oxford University Press, 2000

#### References

- Suzana Herculano-Houze: The Human Brain in Numbers: A Linearly Scaled-up Primate Brain. Front Hum Neurosci. 2009 3:31
- Joseph T. Devlin et al: Functional Asymmetry for Auditory Processing in Human Primary Auditory Cortex. The Journal of Neuroscience 2003 23(37):11516–11522