

# Master's specialisation in Neurophysics

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https://www.ru.nl/opleidingen/master/neurophysics



# **Master's specialisation in Neurophysics**



This specialisation is part of the Master's programme(s) in **Physics and Astronomy** 

It offers a flexible and interdisciplinary programme, which challenges you to unravel the workings of the most complex system known to us, the human and animal brain, using experimental, theoretical, and computational methods from the natural sciences.

# Focus:

This a unique program in the Netherlands. We cover the full spectrum from behavioural studies with human subjects (psychophysics), computational studies of advanced brain models (neuroinformatics, computational neuroscience), to theoretical studies on intelligent systems and behaviour (machine learning, robotics, artificial intelligence, data science), and electrophysiological studies (the 'hardware')

# For whom:

Students with a bachelor diploma in Physics, Science, but also Biomedical Engineering, Mathematics, or similar













"To understand ANY information-processing system, it has to be studied at **three** complementary levels, all equally necessary" (David Marr, '82):

- L1: What is the function of the system? Why does it do what it does? What benefit does it acquire? Which problem (usually, for survival) does it solve? How does it do it? In Neuroscience, this is the research topic of Psychophysics (the goal)
- L2: What is the optimal algorithm, computational principle, that underlies the observed behavior? Importantly, how can the system acquire such behavior through unsupervised learning? This is the field of Computational neuroscience and Machine Learning (the software...)
- L3: How are the algorithm(s) and behaviour(s) implemented in the system? In Neuroscience, this is the topic of Neurophysiology (the hardware...)

The Neurophysics specialisation at DCN studies all three levels.







# Why study Neurophysics at Radboud University?

- A multidisciplinary field, merging neurobiology, physical chemistry, informatics, mathematics, and physics. You become an analytic, independent academic with relevant skills, prepared for near-future technologies (AI, data science, etc.)
- Large flexibility in designing your own study program, depending on your personal preferences (more experimental, theoretical, or more neurobiological, biochemical, etc.), through a wide variety of elective courses.
- Possibilities for external internships, e.g. at Philips (Brain, Body and Behavior division), several MSE companies, Maartens Kliniek (revalidation), RadboudUmc, but also at the Instituto Técnico Superior in Lisbon (robotics), Western Univ. at London, Ontario, etc. etc..
- Possibility to incorporate a minor data science into your master program
- Possibility to obtain a double master diploma: in Physics and Astronomy (your principal diploma) and Cognitive Neuroscience (60 ec courses at the CNS master; total 180 ec)



# **Curriculum Master's specialisation in Neurophysics**

Compulsory courses Physics and Astronomy (7 EC)

Compulsory courses Neurophysics

Specialisation electives\*

Free electives\*\*

Internship





(15 EC)

\*e.g. Advanced Computational neuroscience (6 EC), Adv. Machine Learning (6 EC), Quantitative Brain Networks (3 EC), Psychophysics 2 (6 EC)

\*\*e.g. Track in Data Science (18 EC), courses from the CognNeurosci master, other Physics courses (e.g. statistical physics), some catch-up bachelor courses



# **Compulsory courses Master's specialisation in Neurophysics**

**Compulsory Physics courses (7 ec):** 

Electrodynamics (3 ec), Philosophy (3 ec), Professional Preparation (1 ec)

**Compulsory Neurophysics courses (15 ec):** 

**Course 1** Neurobiophysics (3 ec) / Optimal sensory encoding; Optimal motor control;

**Course 2** Computational Neuroscience (3 ec) / nonlinear dynamics; information theory

Course 3 Machine Learning (3 ec) / data modeling; inference

**Course 4** Neuroscience Review (6 ec) / Literature study; your own topic; report writing









# **Track in Computational Data Science (CDS)**

#### **Mandatory Courses:**

Numerical methods (3ec),

Advanced programming (3ec), Machine learning (3ec)

#### **Electives IMM**

Quantum chemistry (3ec) Quantum dynamics (3ec) Molecular modeling (3ec) Pattern recognition for Natural science (3ec)



#### **Electives IMAPP**

Monte Carlo Techniques (6ec) Data analysis (3ec) Machine learning in particle physics and astronomy (3ec) Astronomical Data analysis and instrumentation (3ec)



#### **Electives DCN**

Advanced machine learning (6ec) Computational neuroscience (6ec) Machine Learning in practice (6ec)







# **Research Master's specialisation in Neurophysics**

This specialisation is embedded in the Donders Centre for Neuroscience (DCN@FNWI).

# **Research departments and topics at our Centre**

- Biophysics: Psychophysics (Van Opstal, Van Wezel, Van Wanrooij, vacancy) Machine Learning, Optimal Control, Data science (Kappen)
  L1+2
- Neuroinformatics: Computational modelling (Tiesinga), Electrophysiological and modelling studies of the memory system (Battaglia). L2+3
- Neurophysiology: Neural implementation of sensorimotor behaviors (Celikel, Englitz, Zeldenrust).
- Applications: Sensory and motoric patients (hearing, vision, balance, motoric) Forensic analysis through machine learning (Bonaparte) Bits and Brains (with Solid-State Physics); Human Brain Project. L1+2

#### Facilities

- Six fully equipped psychophysical labs (visual, auditory, vestibular), EEG/fNIRS lab
- Animal facilities with high data throughput recording systems
- Computer facilities for large-scale computational modelling studies
- The Donders Neuroimaging facilities (MEG, fMRI)

studies Radboud Unive

# Internships Master's specialisation in Neurophysics Relevant departments at Radboud University

# **Science faculty**

Dept. of BiophysicsDept. of Neuroinformatics

Dept. of Neurophysiology

- (PI's: Van Opstal, Kappen, Van Wezel, Van Ee, Noppeney, Coolen)
  - (PI's: Tiesinga, Battaglia, vacancy)
    - (Pl's: Celikel, Englitz, Zeldenrust)
- Donders Center for Cognitive Neuroimaging (PI: Norris)

# **Medical faculty**

- Dept. of Cognitive Neuroscience (Goossens)
- Depts. of Otolaryngology (Snik) and Neurology/Clinical Neurophysiology (Bloem)

# **Social sciences**

• Sensorimotor Lab (Medendorp)

# **Universities abroad (examples)**

- Western Univ. in London, Ontario, Brain and Mind Institute (Corneil; systems neuroscience)
- Instituto Técnico Superior de Lisboa (Bernardino; robotics)
- Max Planck Institute in Frankfurt (Fries; primate neurophysiology)

# **Companies (examples)**

- Philips Eindhoven (Van Ee)
- Other companies (Artinis (fNIRS), TMSi (EEG), hearing aid/cochlear implant companies )











# Admission requirements Master's specialisation in Neurophysics

# You'll need a Bachelor's diploma in

- Physics, with at least Neurophysics 1 and Introduction Machine Learning from Bachelor
- Science, with 9 ec from \*
- Mathematics, with Neurophysics 1 and Introduction Machine Learning
- or a related discipline (e.g. (Bio)medical or Electrical Engineering)

#### And a fluency in both written and spoken English

- A TOEFL score of >575 (paper based) or >232 (computer based) or >90 (internet based)
- An IELTS score of >6.5
- Cambridge Certificate of Advanced English (CAE) or Certificate of Proficiency in English (CPE) with a mark of C or higher

Native speakers of English and students with a Dutch VWO or Bachelor's diploma don't need to perform an English test.

\*Neurophysics 1 and Neurophysics 2, Psychophysics 1, Introduction Machine Learning (each 3 ec)

(two of these courses may be included in the free electives of the master; at the start of the master; Neurophysics 1 and 2 and Intro ML may be done in the first semester)



# Career prospects Master's specialisation in Neurophysics

# Positions of our alumni:

- PhD student in Neuroscience topics, anywhere in the world
- PhD student in other disciplines, e.g. electrical engineering, computational modelling
- Teaching (physics)
- Some stay in academia (postdoc, assistant/associate/full professor)
- Start-up companies (e.g. Orikami, SMART)
- Politics
- Banks (data science)
- Philips (BBB, lighting, ...)
- Shell (data science, modelling)
- ASML (control problems)
- TMSi, Artinis, XSense, HOCOMA, Cochlear (applied bio-measurement systems/prosthetics)
- Clinical physicist
- Maartenskliniek (revalidation technology)





# **Questions, more information?**



#### **Coordinator of the Neurophysics specialisation:**

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Or contact the student advisor/study coordinator:

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